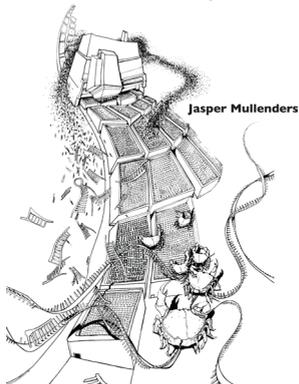


Big screens with small RNAs:
Loss of function genetic screens to
find novel cancer genes

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Cover: Artist impression of Big screens with small RNAs
by Rikkert Mullenders (rikkertmullenders@gmail.com)

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Big screens with small RNAs: Loss of function genetic screens to identify novel cancer genes

Grote screens met kleine RNAs: De identificatie van kanker genen door verlies van functie genetische screens

(met een samenvatting in het Nederlands)

Proefschrift

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CHAPTER I

Introduction

Loss of function genetic screens as a tool
to improve the diagnosis and treatment
of cancer

Loss of function genetic screens as a tool to improve the diagnosis and treatment of cancer

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A major impediment to the effective treatment of cancer is the molecular heterogeneity of the disease, which is also reflected in an equally diverse pattern of clinical responses to therapy. Currently, only few drugs are available that can be used safely and effectively to treat cancer. To improve this situation, the development of novel and highly specific targets for therapy is of utmost importance. Possibly even more importantly, we need better tools to predict which patients will respond to specific therapies. Such drug response biomarkers will be instrumental to individualize the therapy of patients having seemingly similar cancers. Here we discuss how RNA interference-based genetic screens can be used to address these two pressing needs in the care for cancer patients.

The need for new drug targets and better biomarkers of drug response

Traditionally, new cancer drugs have been identified mainly through empirical approaches [1]. This has led to a generation of chemotherapeutic agents that is relatively non-specific in targeting cancer cells, yielding considerable side effects. Such conventional therapies often benefit only a minority of patients, due to both intrinsic and acquired drug resistance. Another major factor limiting the effective treatment of cancer is the molecular heterogeneity

of the disease. Because of this heterogeneity only few cancer types have a common “driver” mutation: a genetic alteration that is instrumental for the malignant phenotype of the cancer. One such recurrent driver mutation in chronic myelogenous leukemia is the BCR-ABL fusion gene, which is targeted by the drug imatinib mesylate [2, 3]. Imatinib mesylate is a member of a new class of anti-cancer drugs, the ‘targeted-therapeutics’ [4, 5]. These drugs are developed based on knowledge of which genes (often kinases) are specifically altered in cancer. Therefore such targeted

therapies are highly cancer cell-selective and have fewer side effects. Unfortunately, most cancer types do not have such frequently-occurring oncogenic driver event, making it difficult to expand on the success of this highly effective drug. Consequently, the arsenal of targeted cancer therapeutics is small, making the more conventional chemotherapy still the mainstay of treatment in today's cancer clinic. In this review we will discuss how loss-of-function genetic screens in mammalian cells using RNA interference can contribute to the identification of completely new classes of highly selective cancer drug targets.

A second major obstacle in the treatment of cancer is the unpredictable response to therapy [6]. In breast cancer, only one in thirty post-menopausal women benefit from chemotherapy. Availability of biomarkers of drug responses could greatly help in the development of a more personalized approach to cancer treatment, in which patients having seemingly similar cancers can be pre-selected for specific therapies based on their predicted responses to therapy. Here too, RNA interference-based genetic screens can be very efficient in identifying genes that control how cells respond to cancer drugs. Consequently, such genes are prime candidate biomarkers to foretell drug responsiveness in the clinic. Strategies to discover such biomarkers through RNAi-based genetic screens are discussed here also.

Loss of function genetic screening tools

In recent years an array of new high throughput technologies (DNA sequencing, Single Nucleotide Polymorphism (SNP) genotyping, Comparative Genomic Hybridization (CGH), proteomics, gene expression micro-arrays) have all been implemented in drug development efforts. A drawback of most of these approaches is that the data generated are mostly correlative and therefore do not directly identify the driver event among the many genetic alterations present in each cancer. Loss of function genetic screens on the other hand can also be carried out in a high throughput fashion and, as a consequence of the functional nature of the approach, leads to the identification of causal factors only.

Two complementary types of functional genetic screens can be carried out [7, 8]. Gain-of-function genetic screens involve the ectopic expression of genes. This is often brought about by expression of collections of cDNAs. For discovery of drug targets, however, loss-of-function screens are more suitable as the genetic event mimics the intended effect of the cancer drug: reduced gene product activity. In mammalian cells high throughput loss-of-function screens were not feasible for a long time. This situation changed in 2001 when it was discovered that RNA interference (RNAi) can also be used in mammalian cells to suppress gene expression [9]. Since then, many different collections of RNAi

resources have been created that cover the entire human and mouse genomes [7, 8, 10-12]. Different reagents can be used to trigger RNA interference: the original synthetic short duplex RNAs (siRNAs) and vector-encoded short hairpin RNAs (shRNAs [12]). These two RNAi reagents each come in several flavors. For example, apart from the chemically synthesized siRNAs,

siRNAs have been made by nuclease cleavage of long *in vitro* transcribed double stranded RNAs: esiRNAs [13]. For plasmid-derived shRNAs different viral delivery systems are available (e.g. Moloney virus based vectors, lentiviral vectors, adenoviral vectors [14-16]). Some libraries consist of shRNA vectors that contain a shRNA embedded in a microRNA precursor for more

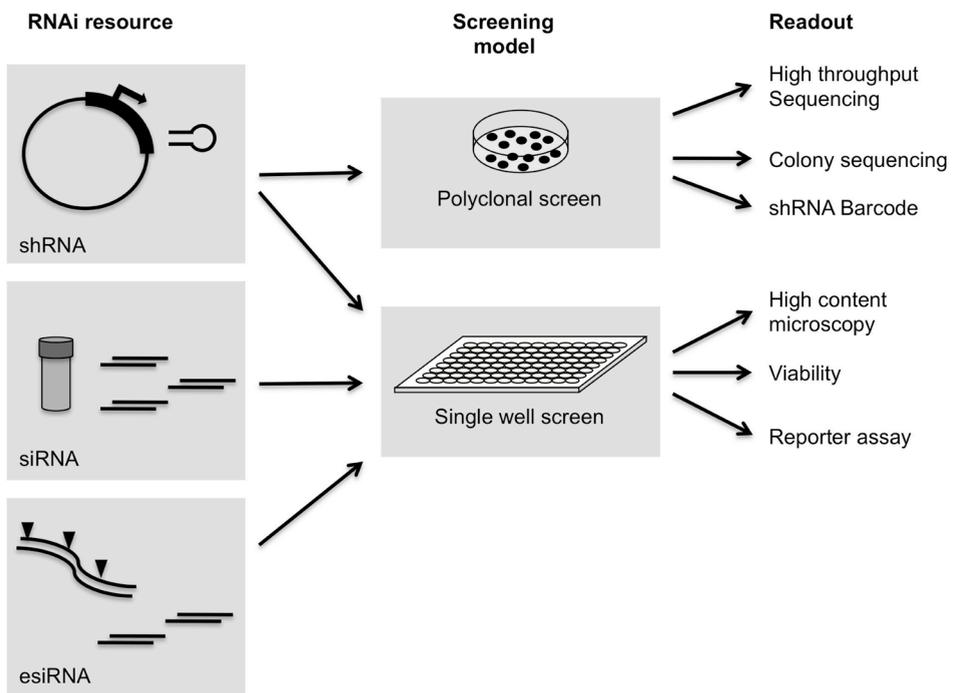


Figure 1

RNAi screening modalities: RNAi can be brought about by different molecules, the vector based short hairpin RNA (shRNA) and the chemically or enzymatically generated small interference RNAs (siRNA). The choice of screening model is dependent on the species of RNAi used, shRNAs can be used in both polyclonal and single well screens, siRNAs can only be used in single well assays. This also limits the phenotypes that can be screened. Polyclonal assays are more applicable to screen growth phenotypes while single well assays can be used to screen complex phenotypes.

efficient knockdown, but the beneficial effect of this has been disputed [17] (Fig 1).

There is no simple answer to the question which RNAi reagent is better, as each reagent has its own pros and cons. A major advantage of the use of plasmid-encoded shRNA is the possibility to perform long-term cell culture experiments, such as clonogenic assays and drug resistance assays. ShRNA-based genetic screens are particularly useful when one searches for genes whose suppression allows cells to proliferate in the presence of an anti-proliferative signal, such as a drug-induced growth arrest or a physiological growth arrest such as senescence. In this scenario, shRNA screens can be carried out in a polyclonal format, in which a single dish of cells is infected in culture with a large number of shRNA vectors, after which the cells are exposed to the anti-proliferative signal. Cells that become resistant to the growth arrest through knockdown of a specific gene will become positively selected. Since each shRNA vector contains a unique shRNA sequence to knock down a specific gene, this sequence can be used as a molecular "bar code" to identify the knockdown vector that conferred the growth advantage to the cell. This approach, known as shRNA bar code screening, has been applied successfully to find genes whose inactivation confers resistance to a p53 induced growth arrest [18, 19], the breast cancer drug Herceptin [20] and genes that allow growth under non-adherent conditions [21] (Fig 2). The screening of

shRNA collections in a polyclonal fashion to identify shRNAs that are negatively selected in culture represents a more significant technical challenge. Detecting the loss of a single shRNA from a large pool is more difficult because not every cell infected with a given shRNA vector has the same degree of knockdown. Since only cells with significant knockdown of a lethal gene are negatively selected in a population, the cells that harbor a knockdown vector without having functional gene knockdown limit the signal one can obtain in this type of bar code screening approach. One solution to this problem is the use of relative small pools of ~1000 shRNAs in negative selection assays [22, 23]. More recently, this approach was optimized and also used successfully to screen larger shRNA libraries [24-27].

siRNAs on the other hand are very suitable for high throughput single well assays, in which every well contains a siRNA reagent that targets a single transcript. An advantage of the single well screening format is that more complex biological phenotypes can be screened. Such complex phenotypes can be detected using for instance cell sorting or high throughput microscopy. Microscopic images can subsequently be analyzed by software that can be programmed to extract features like cell shape, DNA content, subcellular localization of proteins and other parameters [27-29]. This combination of single well screening and reading of complex phenotypes is referred to as "high content

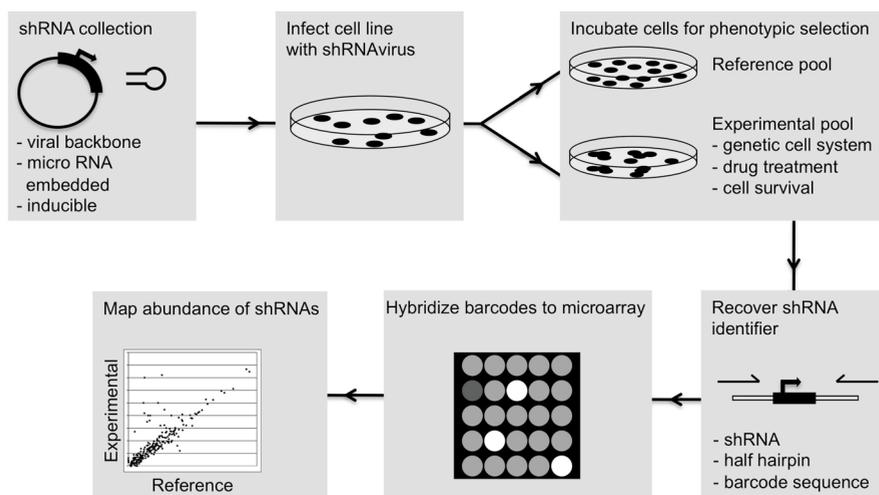


Figure 2

ShRNA barcode screening: shRNA barcode screening is a very efficient technique to identify shRNAs from a large collection of vectors that give rise to a specific phenotype. Plasmids encoding shRNAs are available in various viral vectors for high-efficiency infection of target cell lines. After sufficient numbers of cells are infected (in order to have the entire library of vectors represented) two replicate cell populations are created. One population is used as reference and left untreated, while the other population is treated with the stimulus of interest. After phenotypic selection has taken place the barcode identifier can be retrieved by PCR. The barcode identifier can be a separate DNA sequence in the plasmid but also an integral part of the shRNA cassette. Hybridization of the barcode identifier to a specific microarray reveals the abundance of shRNA in both the reference and experimental population.

screening” [30]. The cell cycle is one of the best-studied biological processes using RNAi combined with high content screening [31-34]. The parameters examined in such screens include cell number, cell cycle phase, apoptosis (sub G1) and the total number of chromosomes (ploidy). Among the hits in these screens are many genes that have previously been reported to regulate mammalian cell cycle, demonstrating the validity of the approach. High content screening also enables the identification of novel morphological phenotypes [35, 36]. Single well screens can also be performed using shRNA vectors [37, 38], but it requires

significant automation to generate and handle individual shRNA vectors in single well screening format.

Loss of function screening strategies to identify drug targets

Suitable targets for cancer therapy are hard to find. Most small molecule drugs today inactivate proteins by binding to the catalytic site of an enzyme. This mostly restricts the development of cancer drugs to the products of oncogenes, not tumor suppressor genes. Moreover, many of the well-known oncogenes (for example RAS and MYC) are not considered to be “druggable”, i.e. proteins whose activity can be

readily inhibited by a low molecular weight compound [38]. Thus far only a small number of proteins have been identified that can be efficiently inhibited by small molecules for cancer therapy. Many of these targets belong to the family of kinases and are either specifically (over-) expressed in cancer cells (i.e. HER1 and HER2) or activated by mutation/translocation (for example HER1 and BRAF and BCR-ABL). Inhibitors of these targets can be very efficacious in blocking cancer growth with relatively mild side-effects [3, 39]. The identification of new drug targets with a similar cancer selectivity is

urgently needed. There are four approaches to finding novel drug targets through RNAi-based genetic screens:

Pathway screens:

An obvious starting point to identify novel drug targets is by searching for novel components of cancer-relevant signaling pathways. While many signaling pathways have been studied for considerable time, genetic screens may identify hitherto unknown components of these pathways, which may serve as potential targets for therapy. Initial RNAi genetic screens in *Drosophila* using reporter gene

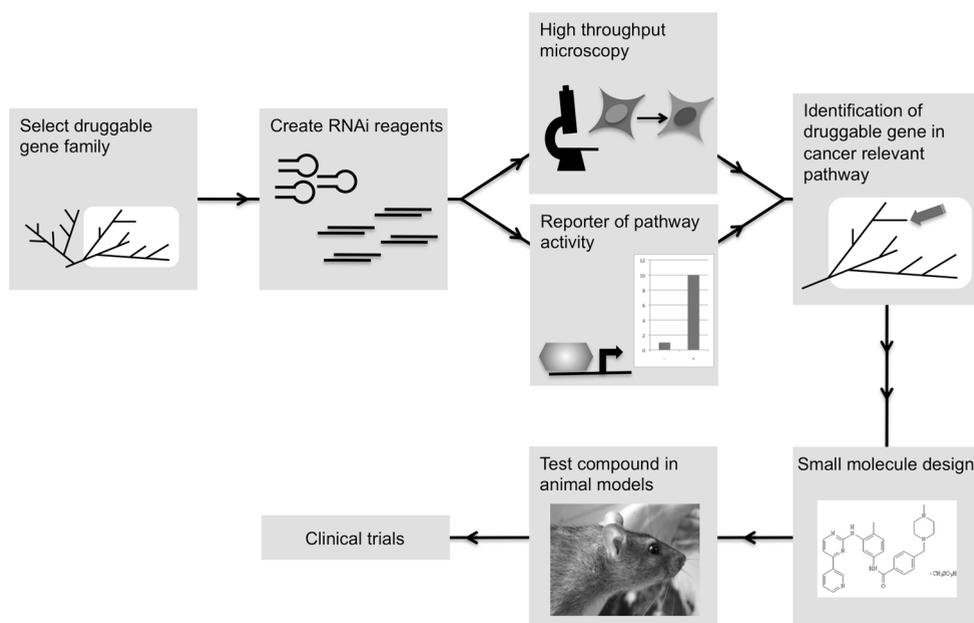


Figure 3
Pathway screening using RNAi libraries targeting druggable genes: Choosing druggable genes as a starting point for RNAi screening can lead to rapid identification of a novel drug target in a cancer-relevant pathway. The first step is to select the gene family of interest. Subsequently a targeted RNAi library of either shRNAs or siRNAs must be constructed. This library can be screened in various screening models including reporters and high-content based assays. Small molecules targeting the hits identified from the screen can subsequently be used to perform in vivo experiments and finally clinical trials.

assays established the utility of signaling pathway screens [40, 41]. More direct measurement of pathway activity was used to screen for modulators of ERK signaling, which was evaluated by immunofluorescence [42].

A particularly powerful combination is to screen subsets consisting of families of druggable genes for their ability to modulate a cancer-relevant signaling pathway. Any validated hit from such a screen would directly place a druggable gene in a cancer relevant pathway (Fig 3). As a proof of concept, we made a library of shRNA vectors targeting some 60 ubiquitin-specific proteases (DUBs) and searched for DUB enzymes that control the activity of NF- κ B [43, 44]. This led to the identification of the familial cylindromatosis tumor suppressor gene *CYLD* in the NF- κ B signaling pathway. This work suggested that tumors in cylindromatosis patients are caused, at least in part, by activation of NF- κ B. Indeed, in a pilot clinical study, inhibitors of NF- κ B were found to be useful for the treatment of patients suffering from cylindromatosis [44].

Phenotypic screens

Another screening format is to search for modulators of a specific biological phenotype, such as apoptosis, migration, invasion, senescence and responses to cytokines. One of the first genome-wide screens in mammalian cells aimed to identify genes whose suppression allowed bypass of a p53-dependent senescence-like growth arrest in human fibroblasts,

which led to the identification of five novel components of the p53 pathway [18]. A screen for bypass of growth arrest caused by activation of p53 with specific small molecules allowed the identification of further components of the p53 pathway [19].

Oncogene expression can also induce a senescence-like proliferation arrest. Wajapeyee et al., identified genes whose suppression confers resistance to growth arrest induced by a BRAF oncogene [45]. Surprisingly, the authors found that suppression of *IGFBP7*, which encodes a secreted protein, was required for cells to proliferate in the presence of *BRAF*. Moreover, injection of recombinant IGFBP7 in mice carrying a BRAF mutant tumor led to inhibition of tumor growth, providing a potential new therapeutic strategy for tumors having a mutant *BRAF* oncogene.

Tumor cells often have an abrogated cell death or apoptosis pathway. Several screens have been performed to identify genes that, when knocked down, either suppress or stimulate cell death [46-48]. By screening siRNA libraries targeting kinases and phosphatases MacKeigan et al identified a surprising large number of genes that are involved in regulating apoptosis under physiological conditions [47]. In addition a number of phosphatases are identified to be essential for the cytotoxic effects of certain chemotherapeutic drugs.

Synthetic lethal screens

Most targeted therapies take

advantage of the fact that certain oncoproteins are hyperactive in cancer cells, either as a consequence of activating mutations or over-expression. As was pointed out above, such targets are often not “druggable” or only expressed in a small fraction of the tumors, two factors that limit their clinical utility. In 1997, it was proposed to exploit the phenomenon of “synthetic lethality” to find completely novel classes of highly cancer-selective drug targets [49]. This strategy takes advantage of the notion, first observed in lower organisms, that some genes are only lethal to cells if a second non-lethal mutation is also present [50]. These types of genetic interactions are likely to be present in mammals also and therefore could be exploited for novel cancer treatment strategies [51, 52]. In one of the first examples, it was shown that cells with an amplified *MYC* oncogene are more sensitive to apoptosis induced by death receptor ligands [52, 53]. It is important to point out that the genes that are synthetic lethal with cancer-specific lesions are not necessarily mutated or over-expressed themselves in cancer. Consequently, large-scale cancer genome re-sequencing efforts and gene expression profiling might not identify synthetic lethality genes. As such, synthetic lethal interactions represent a potential untapped reservoir of highly cancer-selective drug targets.

Finding synthetic lethal interactions in mammalian cells is not a trivial exercise, but is greatly facilitated by large-scale RNAi genetic screens.

Large-scale efforts to identify synthetic lethal interactions were initially explored in yeast [54, 55]. The advantage of performing screens in yeast is that, rather than knockdown by RNAi, knockout strains can be used. On the other hand, the increased complexity of mammalian signaling pathways may limit the value of the lessons learnt from simple model organisms. To date, synthetic lethal screens have been performed for two specific oncogenic lesions in mammalian cells: targeting the activated *KRAS* oncogene [56-59] and loss of the *VHL* tumor suppressor [59]. Most of these screens were performed using single well assays with only relatively small collections of RNAi reagents. Only one study used a genome-wide shRNA library that was screened using micro-array barcode technology [57]. Genes identified in the screens above include Polo like kinase 1 (*PLK1*), *SURVIVIN* and the *STK33* kinase. Interestingly clinical trials using small molecule inhibitors of PLK1 (BI-2536) and SURVIVIN (YM155) are already ongoing [60, 61]. Based on the results from the activated RAS RNAi synthetic lethal screens, it will be interesting to monitor the specific response of RAS mutant versus wild-type tumors in these ongoing clinical trials.

Synthetic lethal screens can also be used to find genes that are specifically toxic in two closely related cancers. For instance, Ngo et al, screened for genes that are essential for survival of activated B-cell-like Diffuse Large B cell lymphoma (DLBCL), but not for the

related germinal centre B-cell-like DLBCL cells. They identified the NF- κ B pathway as essential only for survival of activated B-cell-like DLBCL, suggesting that this cancer might benefit from NF- κ B inhibition [22].

In vivo screens

The identification of genes that regulate the process of metastasis is a very difficult and laborious task. Therefore screening in a surrogate assay for *in vivo* metastasis can be used to examine large collections of shRNAs or siRNAs. Hits from this screen can subsequently be tested *in vivo*, as the number of genes to be tested is significantly smaller. The latter approach was used to identify the *GAS1* metastasis suppressor from a complex library of shRNAs. Furthermore, when the expression level of *GAS1* in melanoma was investigated, a clear correlation between low *GAS1* mRNA and metastatic potential was identified [62].

Another way to reduce the complexity of a genome wide RNAi set for *in vivo* genetic screen is to use data obtained from clinical specimen. This was elegantly shown in a study by Zender et al. [63, 64]. Using Comparative Genomic Hybridization (CGH) profiles from human liver cancer samples they identified some 300 genes that were frequently lost in these tumors, making these genes candidate tumor suppressor genes for liver cancer. Based on this information, they generated a mini shRNA targeting these 300 genes. These shRNAs were introduced into

immortalized, but non-oncogenic, hepatocytes that were transplanted into recipient mice. In the tumors that formed in these mice shRNAs for 16 genes were selectively enriched, demonstrating a role for these genes in hepatocyte oncogenicity. This shows that the use of selected shRNA libraries allows for the very efficient identification of genes that are functionally involved in cancer progression.

A variation on this theme is to perform these types of screens in tumor cells isolated from patients. This was shown in a recent report that described the siRNA screening of tyrosine kinases in cells derived from 30 patients suffering from leukemia [64]. In 10 out of these 30 patients at least one kinase was identified that was essential for tumor cell survival. Furthermore, the inhibition of the JAK2 kinase by a small molecule inhibitor was shown to be selectively toxic only in the tumor lines that depend on JAK2.

Development of predictive biomarkers of therapy efficacy

Identical treatment regimens can produce remarkably different responses in patients with seemingly indistinguishable tumors at the macromolecular level. This phenomenon reflects the heterogeneity that is seen when individual tumors are studied in more detail. Understanding the factors that predict whether patients will respond to certain treatment is very useful to create efficient therapies. Whilst different techniques can be used to identify

biomarkers of drug response, the use of RNAi to find these factors has the advantage that it will identify biomarkers based on their causal role in the response to the drug.

Two different types of drug response biomarkers can be distinguished. First, biomarkers may foretell if patients are resistant to a certain treatment and second biomarkers may predict drug sensitivity. The former biomarkers have two clinical applications: they may identify patients that fail to respond to a given therapy upfront, avoiding unnecessary toxicity. Second, understanding resistance may uncover strategies to overcome resistance. The biomarkers of drug sensitivity on the other hand may help in identifying synergistic drug combinations. RNAi can be used for the identification of both types of biomarkers through screening for modulators of drug resistance.

Biomarkers of drug resistance

The low efficacy of currently-used cancer drugs can be attributed mainly to inherent or acquired resistance of cancer cells. Multiple mechanisms have been proposed for resistance to the more conventional chemotherapy, for example the up-regulation of drug pumps and (in)-activation of pathways on which the drug works [65-67]. However, in most cases, the factors that contribute to drug resistance are not known and RNAi screens can be useful to identify genes that modulate drug responses.

When performing a functional genetic screen to find drug

resistance genes it is important to use concentrations of drug that are close to levels obtained in the clinic. In long term shRNA based screens, drug concentration can be relatively low. In contrast, siRNA single well screens usually require much higher concentration of drug, as the phenotype must be measured in a much shorter time frame. For drug resistance RNAi screens, the use of shRNA vectors is therefore preferred. Drug resistance screens have been performed successfully with various anti-cancer drugs. One approach was designed to identify genes that are essential for the action of the HER2 antibody trastuzumab (Herceptin®) [20]. A single gene was identified that confers resistance to trastuzumab when it was knocked down by shRNAs. This gene encoded *PTEN*, the inhibiting phosphatase of the PI3-Kinase catalytic subunit PIK3CA. When patient samples were analyzed on their activation of the PI3-kinase pathway, a clear correlation with trastuzumab response was found. Patients with an activated PI3-Kinase pathway, loss of *PTEN* or mutation in *PIK3CA*, showed worse response to trastuzumab than patients that did not have these mutations. This example shows that results from *in vitro* RNAi screens can yield biomarkers having clinical utility to predict drug responses.

In related studies, loss of *CDK10* expression was identified as a major factor in mediating resistance to tamoxifen in breast cancer and *CDK10* levels were found to be predictive of tamoxifen response

in clinical samples [68]. Likewise, *ZNF423* was identified as a critical mediator of the response to retinoic acid in neuroblastoma and *RAD23B* was found to control responses to histone deacetylase inhibitors. In all cases, the genetic screen did not only provide potentially useful biomarkers of drug responses, but also yielded novel insights into the signaling pathways that mediate drug resistance [69, 70]. Such studies may therefore point at specific combination therapies that will be more powerful or suggest ways to overcome therapy resistance.

Enhancers of drug efficacy

Another way of finding modulators of drug responses is to search for genes whose suppression enhances the response to a given cancer drug. This is in fact a variation on the theme of synthetic lethality and is also referred to as "chemical synthetic lethality". Like most genetic screens, this principle was also pioneered in lower organisms. For instance, testing of a set of compounds that are currently used in the clinic in a heterozygous yeast strain identified strains that display a decrease in fitness in presence of the drug [71]. Performing RNAi-based drug enhancer screens in mammalian cells requires some technical adaptations to the conventional approach. To find factors that can augment the effects of a drug, the screen should be performed in presence of a low concentration of the drug, which causes only a small decrease of cell viability. In this way genes that significantly enhance loss of

cell viability can be identified. Most drug screens are performed in a single-well format, which allow for effective gene knockdown due to highly efficient transfection with siRNAs.

Thus far screens have been performed aiming at the identification of sensitizers of the well-known anti-cancer drugs gemcitabine, cisplatin and paclitaxel [47, 72-76]. Although cisplatin has been approved for the treatment of human malignancies since 1978, it is still unclear why some tumors respond better to treatment than others. By screening a genome wide siRNA library to identify genes that modulate cisplatin efficacy, it was uncovered that cells that have an inactivation of both *TP53* and a member of the *BRCA* network are more sensitive to cisplatin treatment. Even though this had been reported before, this example underscores the power of large-scale loss of function genetic screens to find enhancers of drug responses.

Another example of a large RNAi based approach with the objective to find genes that, when suppressed, sensitize cells to paclitaxel treatment identified several members of the proteasome [75]. This interesting observation raises the possibility of combining treatment of taxanes with proteasome inhibitors. Intriguingly several clinical trials combining paclitaxel and the proteasome inhibitor bortezomib were already performed before the results from this study became available [77-79]. From these

Phase I/II trials it was concluded that the combination therapy is well tolerated but unfortunately not very efficacious.

Future directions for RNAi in cancer research

In less than a decade RNA interference has evolved into a major tool for drug discovery and even a potential therapeutic agent in its own right [80, 81]. Large RNAi collections have been made available to the scientific community enabling hundreds of RNAi screens, ranging in size from only dozens of genes to entire mammalian genomes (see Table 1 for a summary of the most noteworthy screens). Together, these screens have assigned (additional) functions to many genes in processes ranging from cancer, development, stem cell maintenance to viral replication. It should be kept in mind that many genes reported in these screens have not been validated in additional biological assays, and therefore such gene lists should be viewed with caution [81]. Of particular concern is the possible context-dependency of genetic interactions identified in RNAi screens. For instance, gene A may be synthetic lethal with the loss of gene B in lung cancer cells in which the screen was performed, but not in breast cancer. Likewise, a gene may be involved in resistance to a given drug in colon cancer, but not play a role in resistance to the same drug in prostate cancer. Understanding context dependency of genetic interactions is the major challenge for the next decade and this will be a prerequisite for a

more profound understanding of how patients respond to cancer drugs. Such context dependency will ultimately be governed by cross talk between signaling pathways. Thus, if we want to fully understand how cells respond to perturbations of specific signals with targeted cancer therapies, we will need to map these interactions between signaling pathways. RNAi is exquisitely well-suited to identify functional interactions between signaling pathways. We wholeheartedly support the massive efforts that are undertaken world wide to re-sequence thousands of cancer genomes. It will without doubt provide a deep insight into the genes that are deregulated in cancer. However, we will only be able to truly appreciate the meaning of the multitude of mutations in the major signaling pathways, if we also understand how these pathways are interconnected. We therefore need in addition to the re-sequencing project a large-scale effort to map functional interactions between signaling pathways using the approaches described here. The technology is readily available and proof of concept has been delivered. All we need is a concerted funding effort to make it happen. Anyone interested?

Reference	Type of screen	Cell lines used	Number of genes screened	RNAi method
Cell death screens				
47	Apoptosis	HeLa	Kinases and phosphatases	siRNA
46	TRAIL induced apoptosis	HeLa	500 genes (mostly kinases)	siRNA
48	Necroptosis	L929 (mouse)	Genome	siRNA
Bypass of proliferative arrest screens				
45	B-Raf senescence	Fibroblasts	Genome	shRNA
18	Bypass p53 induced cell cycle arrest	BJ fibroblast	8000 genes	shRNA
21	Soft agar Ras complementation	HMEC	8000 genes	shRNA
82	Soft agar Ras complementation	BJ fibroblast	4000 genes	shRNA
Essential genes screens				
22	Essential genes	DLBCL cell line	2500 genes	shRNA
23	Essential genes	Multiple myeloma	2500 genes	shRNA
24	Essential genes	DLD-1/ HCC1954/ HCT116/ HMEC	3000 genes	shRNA
25	Essential genes	5 human breast cancer cell lines	Various	shRNA

Table 1
An incomplete summary of some noteworthy RNAi screens performed in recent years.

Cell cycle screens				
33	Cell cycle	U2OS	Genome	siRNA
83	Cell cycle in presence of Taxol	HeLa	Ubiquitin associated genes	shRNA
31, 32	Cell cycle	HeLa	17000 genes	esiRNA
84	Cell cycle and mitosis	HeLa	Genome	siRNA
37	Cell cycle	A549	1000 genes	shRNA
Pathway screens				
85	Wnt signaling	DLD-1/ HCT116	Kinases	shRNA
43	NF-κB signaling	U2OS	Deubiquitinating enzymes	shRNA
86	Wnt signaling	HeLa	Genome	siRNA
<i>In vivo</i> screens				
63	<i>In vivo</i> hepatocellular carcinoma	p53 ^{-/-} hepatoblast	300 genes	shRNA
64	Essential tyrosine kinases	Human white blood cells	100 tyrosine kinases	siRNA
62	Invasion in 3D cell culture	B16-F0 melanoma (mouse)	Genome	shRNA

Table 1 (continued)

Synthetic lethal screens				
56	K-Ras synthetic lethality	DLD1 k-RAS(V12) isogenic	4000 genes	siRNA
58	K-Ras synthetic lethality	NOMO-1 vs HMEC, Fibroblast and THP-1	1000 genes	shRNA
57	K-Ras synthetic lethality	DLD-1	Genome	shRNA
59	VHL synthetic lethality	786O/RCC4 isogenic VHL knockout	Kinases	shRNA
Drug screens				
76	Gemcitabine	MiaPaCa-2	Kinases	siRNA
73	Cisplatin/ Gemcitabine/ Taxol	HeLa	Genome	siRNA
74	Taxol/ Cisplatin/ Doxorubicin/5-FU	HCT116/A549/ MDA-MB-231	Kinases	siRNA
75	Taxol	NCI-H1155	Genome	siRNA
68	Tamoxifen	MCF-7	Kinases	siRNA
87	PARP inhibitor	CAL51	Kinases	siRNA
72	Taxol	A549	74 genes	shRNA
20	Resistance to Herceptin	BT474	8000 genes	shRNA
69	Resistance to Retinoic acid	F9 (mouse)	15,000 genes	shRNA
70	Resistance to HDAC inhibitors	U2OS	8000 genes	shRNA

Table 1 (continued)

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CHAPTER II

A large-scale RNAi screen in human cells identifies new components of the p53 pathway

A large-scale RNAi screen in human cells identifies new components of the p53 pathway

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RNA interference (RNAi) is a powerful new tool with which to perform loss-of-function genetic screens in lower organisms and can greatly facilitate the identification of components of cellular signalling pathways [1-3]. In mammalian cells, such screens have been hampered by a lack of suitable tools that can be used on a large scale. We and others have recently developed expression vectors to direct the synthesis of short hairpin RNAs (shRNAs) that act as short interfering RNA (siRNA)-like molecules to stably suppress gene expression [4, 5]. Here we report the construction of a set of retroviral vectors encoding 23,742 distinct shRNAs, which target 7,914 different human genes for suppression. We use this RNAi library in human cells to identify one known and five new modulators of p53-dependent proliferation arrest. Suppression of these genes confers resistance to both p53-dependent and p19^{ARF}-dependent proliferation arrest, and abolishes a DNA-damage-induced G1 cell-cycle arrest. Furthermore, we describe siRNA barcode screens to rapidly identify individual siRNA vectors associated with a specific phenotype. These new tools will greatly facilitate large-scale loss-of-function genetic screens in mammalian cells.

RNAi is a defence mechanism triggered by double-stranded (ds) RNAs to protect cells from parasitic nucleic acids. The dsRNAs are processed into siRNAs, which target homologous RNAs for destruction [6]. In mammalian cells, an RNAi response can be triggered by 21-base-pair siRNAs, which can cause strong, but transient, inhibition of gene expression [7]. By contrast, vector-expressed shRNAs can suppress gene expression over prolonged periods [4, 5]. In the current study, we create a large set of vectors and use them to search for components of the p53 tumour-suppressor pathway. This pathway is crucial for genome integrity as it transmits both anti-proliferative and pro-apoptotic signals in response to a variety of stress signals [8]. To construct a human RNAi library (the 'NKi library'), we selected 7,914 human genes for shRNA-mediated reduction in expression, known as knockdown. This collection of genes includes components of major cellular pathways, including the cell cycle, transcription regulation, stress signalling, signal transduction and important biological processes such as biosynthesis, proteolysis and metabolism. In addition, genes implicated in cancer and other diseases are included in the library (see Supplementary Table 1). To increase the likelihood of obtaining a significant inhibition of gene expression, we constructed three different shRNA vectors against each gene (23,742 vectors in total; Fig. 1a and Supplementary Fig. 1). The oligonucleotides specifying the shRNAs were annealed and cloned in a high-throughput fashion into

pRetroSuper (pRS), a retroviral vector that contains the shRNA expression cassette [9]. Using a pool of three knockdown vectors against a single gene, we obtain on average 70% inhibition of expression for approximately 70% of the genes in the library (see [10]; data not shown). The vector-based shRNA library can be used for functional genetic screens in both short-term and long-term assays using DNA transfection or retroviral transduction.

To validate the RNAi library, we developed a cell system to screen for bypass of p53-dependent proliferation arrest. We generated primary human BJ fibroblasts, which ectopically express the murine ecotropic receptor, the telomerase catalytic subunit (TERT) and a temperature-sensitive allele of SV40 large T antigen (tsLT), yielding BJ-TERT-tsLT cells. As can be seen in Fig. 1b, these cells proliferate when grown at 32 °C, the temperature at which tsLT binds and inactivates both retinoblastoma protein (pRB) and p53, but enter into a synchronous proliferation arrest after a shift to 39 °C, at which tsLT is inactive. To determine whether this proliferation arrest is p53 dependent, we infected BJ-TERT-tsLT cells with pRS-p53 (which targets *p53* for suppression) at 32 °C, and shifted them to 39 °C after two days. Figure 1b shows that knockdown of *p53* allowed temperature-shift-induced proliferation arrest to be bypassed. Knockdown of the RB pathway component *p16^{INK4A}* alone did not allow growth arrest

to be bypassed, but simultaneous suppression of both *p16^{INK4A}* and *p53* yielded a further increase in escape from growth arrest compared with knockdown of *p53* alone (Fig. 1b). Thus, the conditional proliferation arrest in BJ fibroblasts depends primarily on *p53*.

We isolated polyclonal plasmid DNA from each of the 83 pools of NKi RNAi library vectors (Fig. 1a), and transfected this DNA into a packaging cell line to generate high-titre retroviral supernatants. These retroviruses were then used to infect BJ-TERT-tsLT cells at 32 °C. We co-infected cells with a shRNA vector that targets *p16^{INK4A}*, because suppression of this gene further enhances colony formation induced by *p53* knockdown (Fig. 1b). After two days, the cells were shifted to 39 °C and monitored for the appearance of proliferating colonies. In first-round screening, we identified six pools of infected cells that form colonies at 39 °C. To detect the biologically active shRNAs in these vector pools, we isolated several individual colonies of proliferating BJ fibroblasts and recovered the shRNA inserts of the vectors by polymerase chain reaction (PCR; see Methods). These shRNA inserts were then re-cloned, and their identity was established by DNA sequence analysis.

The majority of colonies of BJ fibroblasts that proliferated at 39 °C contained multiple shRNA inserts. Only those shRNA inserts that were present in multiple independently derived colonies were analysed in second-round selection in BJ-TERT-tsLT fibroblasts. Using this

approach, we identified shRNAs against six genes that could suppress the temperature-shift-induced proliferation arrest in the BJ-TERT-tsLT cells in the second round. One of the six genes was *p53* itself, which underscores the quality of the NKi library. In addition, we found that individual shRNAs against *RPS6KA6* (ribosomal S6 kinase 4, RSK4), *HTATIP* (histone acetyl transferase TIP60), *HDAC4* (histone deacetylase 4), *KIAA0828* (a putative S-adenosyl-l-homocysteine hydrolase, SAH3) and *CCT2* (T-complex protein 1, beta-subunit) prevented the *p53*-dependent growth arrest in the BJ-TERT-tsLT fibroblasts (Fig. 1c). Knockdown of all five newly identified genes also mediated escape from proliferation arrest in BJ-TERT-tsLT cells when tested in the absence of *p16^{INK4A}* knockdown vector (Fig. 2b), suggesting that inhibition of these genes primarily allows the bypass of the *p53* response (see below).

Some siRNAs have 'off-target' effects, which are often the result of partial homology to other transcripts [11, 12]. The shRNA library was designed to avoid off-target effects by minimizing homology of shRNAs to other transcripts (see Methods). Furthermore, it is very unlikely that two independent siRNAs against the same transcript target a common off-target transcript for suppression. For three of the five newly identified genes, we found that two of the three shRNAs present in the library mediated escape from growth arrest in the BJ-TERT-tsLT cells, suggesting that the effects

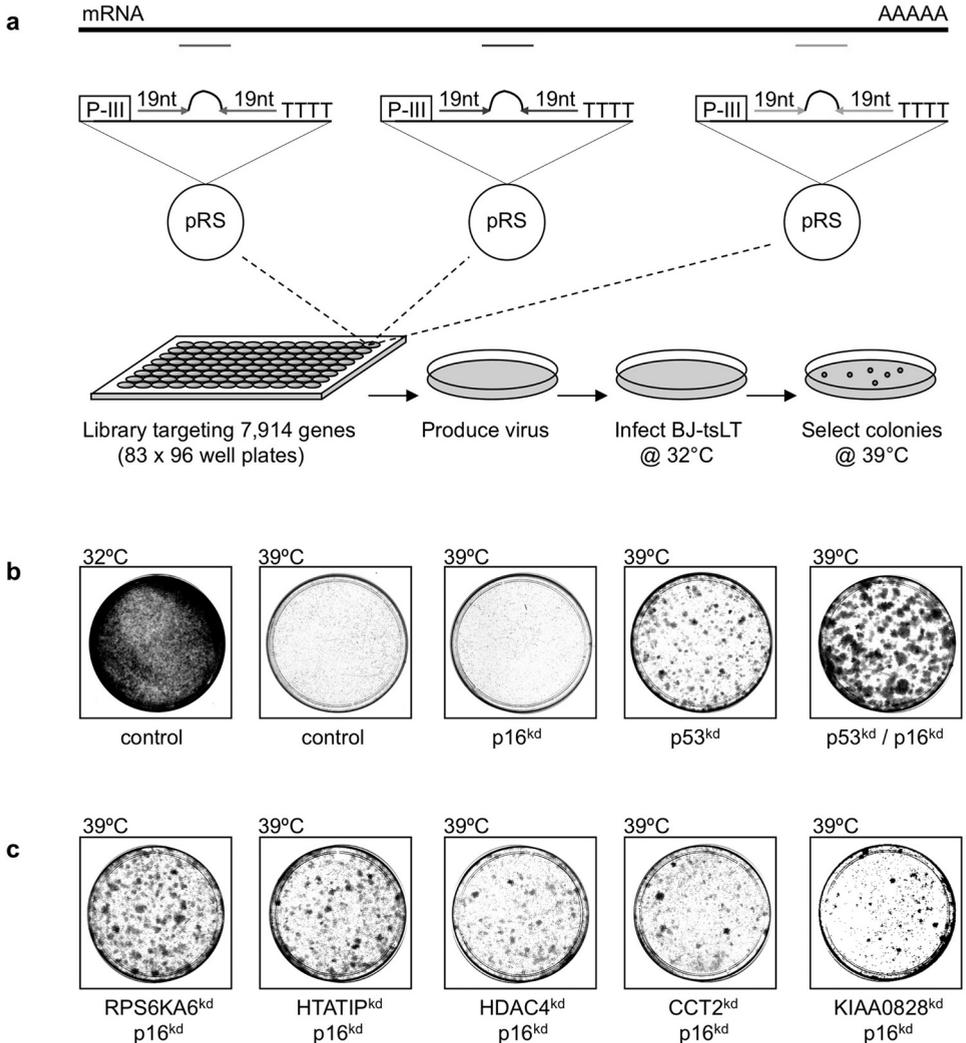


Figure 1

a, Construction of the NKi RNAi library. From each gene transcript, three 19-nucleotide (nt) sequences were designed, and hairpin derivatives (59-mer oligonucleotides; see Supplementary Fig. 1) were cloned into pRS. Three vectors targeting one gene were combined in a single well of a 96-well plate. From each 96-well plate, DNA was pooled, and high-titre polyclonal virus was produced and used to infect BJ-tsLT cells at 32 °C. After two days, cells were shifted to 39 °C, and after three weeks colonies were isolated and analysed. *b*, The growth arrest of temperature-shifted BJ-tsLT cells is p53 dependent. Co-infection with an shRNA against p16^{INK4A} enhanced colony outgrowth. Cells were infected with the indicated shRNA knockdown (kd) vectors at 32 °C. Fifty thousand cells were seeded at both 32 °C and 39 °C, and colonies were stained after three weeks. *c*, Knockdown of the five newly identified genes allows bypass of the p53-dependent growth arrest in BJ-tsLT cells.

of the shRNAs were 'on-target'. For the two genes for which only one functional shRNA from the library was found, we designed a second active shRNA vector targeting the same transcript (see Supplementary Table 2). Figure 2a shows that transient co-transfection of each of the five pairs of two active shRNA vectors with the corresponding full-length complementary DNA expression vectors resulted in a substantial suppression of their cognate gene. Furthermore, we also observed a significant suppression of the corresponding endogenous transcripts (see Supplementary Fig. 2). Moreover, all five pairs of two active shRNA vectors were able to rescue the temperature-shift-induced growth arrest in the BJ-TERT-tsLT cells (Fig. 2b). Together, these data suggest that the observed escape from growth arrest is due to on-target effects of the shRNA vectors on the corresponding genes.

The tumour suppressor p19^{ARF} elicits a p53-dependent proliferation arrest when ectopically expressed [13]. We argued that if the five newly identified genes act in the p53 pathway, their knockdown should confer resistance to p19^{ARF}-induced proliferation arrest. To test this, we used a retroviral vector encoding a p19ARF-red-fluorescent-protein (ARF-RFP) fusion protein to infect human U2-OS osteosarcoma cells. Upon infection of U2-OS cells with this virus, only very few proliferating colonies appeared. The few colonies that appeared did not express the ARF-RFP fusion protein (Fig. 2c; data not shown). By contrast,

many ARF-RFP-positive colonies appeared in U2-OS cells in which p53 was suppressed by shRNA (Fig. 2c). Importantly, each of the two independent shRNA vectors against the five newly identified genes allowed proliferation in the presence of ARF-RFP, which is shown by the presence of red fluorescence (Fig. 2c; data not shown). This result provides further support for the notion that the newly identified genes are components of the p53 pathway.

Next, we asked whether suppression of these genes allowed the p53-dependent G1 cell-cycle arrest to be bypassed after exposure to DNA damage. Figure 2d shows that exposure of U2-OS cells to ionizing radiation (IR) causes these cells to withdraw from S phase and arrest both in the G1 phase of the cell cycle (a p53-dependent process [14]) and in G2/M (a p53-independent process [14]). As expected, inactivation of p53 by shRNA completely abrogates the G1 fraction after IR, whereas introduction of a shRNA against HDM2 (the human orthologue of the mouse double minute 2 (*Mdm2*) gene), which activates p53, resulted in a marked increase in the G1 phase of the cell cycle (Fig. 2d). These results demonstrate that arrest in the G1 phase of the cell cycle after IR is determined by the activity of p53. Transfection of knockdown vectors for the five newly identified genes in each case resulted in a cell-cycle distribution identical to the cells expressing the shRNA against p53 (Fig. 2d). Thus, the knockdown of all five genes

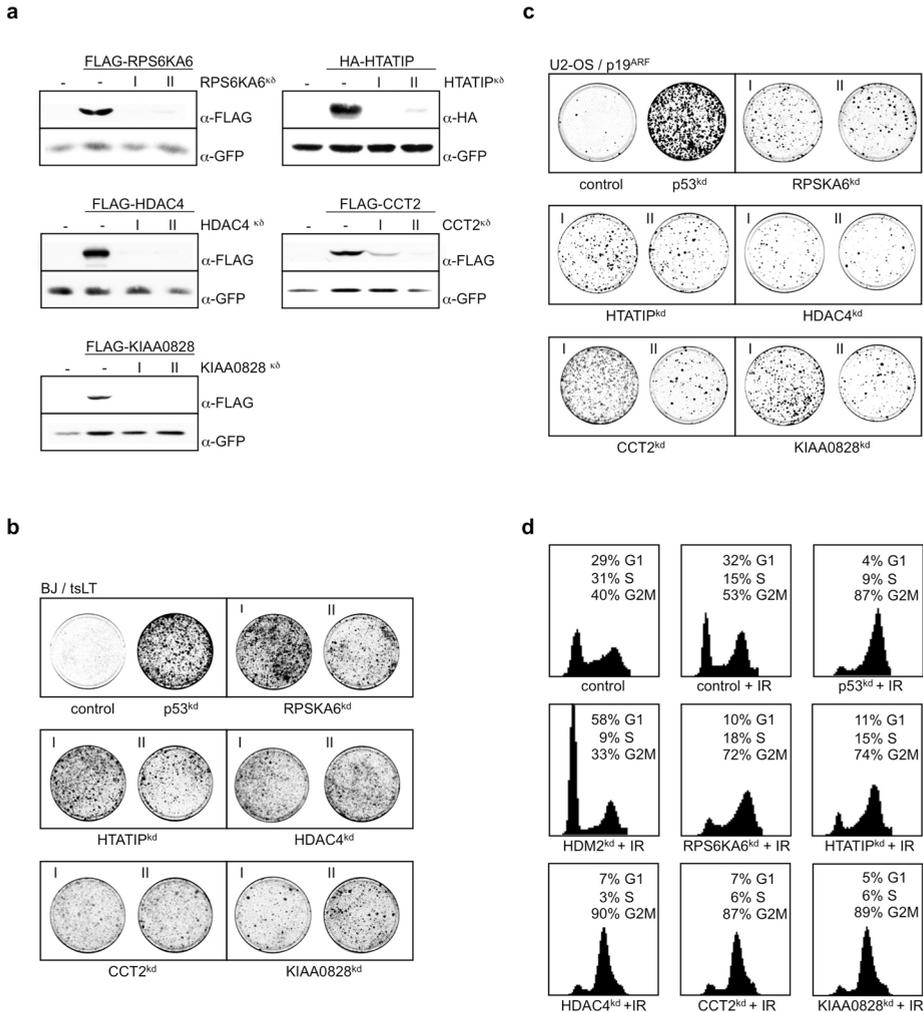


Figure 2

a, Knockdown of newly identified p53 pathway components. U2-OS cells were co-transfected with the shRNA vectors (I or II) and their corresponding tagged (HA or Flag) cDNA expression vectors as indicated. Extracts were immunoblotted against Flag, HA or GFP (control). *b*, Knockdown of the five pairs of shRNA vectors rescue growth arrest in BJ-TERT-tsLT cells. Cells were infected with the indicated shRNA vectors (in the absence of the p16^{INK4A} knockdown vector), selected at 39 °C, and colonies were stained after three weeks. *c*, Two independent shRNA vectors of each indicated gene rescue a p19^{ARF}-induced growth arrest in U2-OS cells. Cells were co-infected with the shRNA vectors and LZRS-p19^{ARF}-IRES-zeocin. Fifty thousand cells were seeded and zeocin/puromycin selected. Colonies were stained after two weeks. *d*, Rescue of a p53-dependent cell-cycle arrest following ionizing radiation. U2-OS cells were co-transfected with the indicated shRNA vectors and H2B-GFP, irradiated (+ IR, 10 Gy). GFP-positive cells were analysed by FACS.

prevents three different forms of p53-dependent proliferation arrest (Fig. 2b–d).

A major component of the anti-proliferative response of p53 is the CDK inhibitor *p21^{cip1}* [15], as it is a critical downstream component of the G1 arrest in response to DNA damage [16, 17] and is required for the senescence response of human fibroblasts [18]. To test whether the five newly identified genes affect the expression of known p53 target genes, we stably expressed knockdown vectors for all five genes in U2-OS cells and determined the expression of two p53 target genes, *p21^{cip1}* and *BAX* [19]. In addition, p53 protein levels can be used as an indirect read-out for p53 function, as p53 protein levels are controlled by the p53 target HDM2 [20, 21]. Figure 3a shows that knocking down *RPS6KA6*, *HDAC4*, *CCT2*, *KIAA0828* or *HTATIP* causes a strong reduction in *p21^{cip1}* messenger RNA and protein levels, but does not affect p53 protein levels nor the levels of *BAX* mRNA and protein (Fig. 3a, b). Conversely, overexpression of *HTATIP* resulted in upregulation of *p21^{cip1}* expression (Fig. 3c) and further enhanced G1 cell-cycle arrest in response to DNA damage (Fig. 3d). We conclude that knockdown of all five new p53 pathway components leads to a specific downregulation of a subset of p53 target genes, which includes *p21^{cip1}*.

Next, we tested the significance of the inhibition of *p21^{cip1}* expression for the phenotypes induced by the newly identified genes. Figure 4a shows that suppression of

p21^{cip1} was nearly as efficient at preventing growth arrest in BJ-TERT-tsLT cells as knockdown of *p53* itself. Furthermore, knockdown of *p21^{cip1}* allowed the p53-dependent growth arrest induced by *p19^{ARF}* (Fig. 4b) and the G1 cell-cycle arrest induced by IR in U2-OS cells (Fig. 4c) to be overridden. This suggests that suppression of *p21^{cip1}* is a major element in the cellular response to the effect of knocking down the newly identified p53 pathway components. However, we cannot exclude the possibility that knockdown of the newly identified genes has effects on other p53 target genes or p53-independent effects that explain (part of) their knockdown phenotype.

The RNAi screen described above is time consuming in that individual colonies of cells must be isolated and hairpin vectors recovered and tested in second-round selection. We have recently proposed an alternative strategy to rapidly screen complex shRNA vector libraries in a polyclonal format, a technique that we named ‘siRNA bar-code screens’ [22]. This approach, which was pioneered in yeast [23], takes advantage of the fact that each hairpin vector contains a unique gene-specific molecular identifier: the 19-mer targeting sequence. This ‘molecular bar code’ can be used to follow the relative abundance of individual vectors in a large population using DNA microarrays that contain the bar-code oligonucleotides [22] (Fig. 5a). To test the concept of siRNA bar-code screens, we used a subset of the shRNA library (consisting of

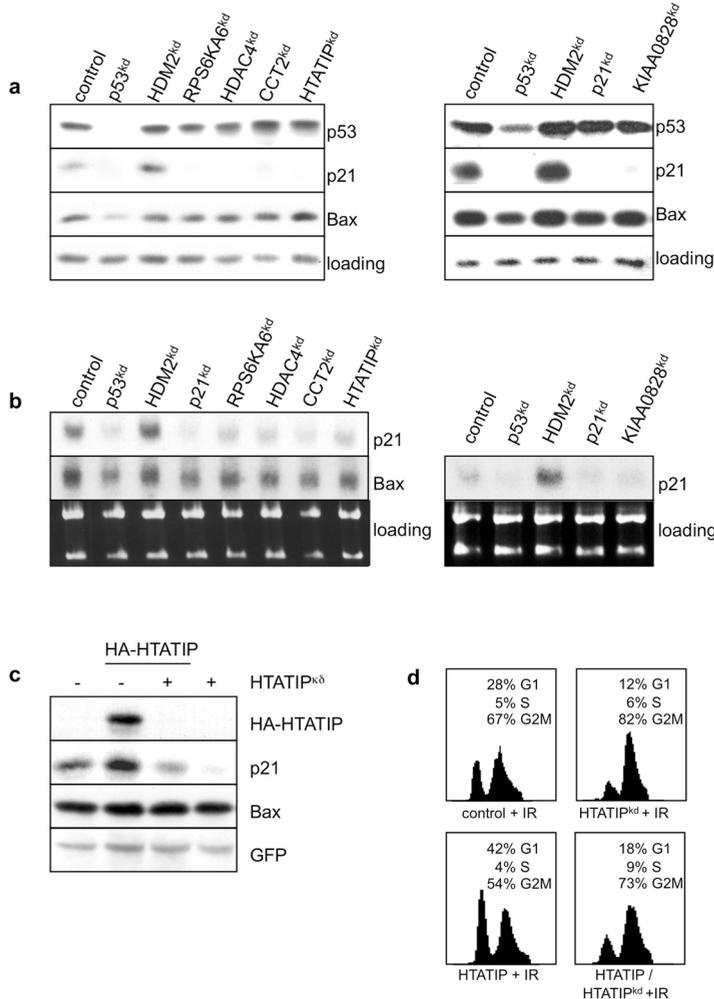


Figure 3
a, U2-OS cells were stably infected with retroviruses expressing the indicated knockdown constructs. Cell extracts were immuno-blotted with antibodies against p53, p21^{cip1} and BAX. *b*, mRNA levels of p21 and BAX in the stably infected U2-OS cells. As a loading control, RNA was stained with ethidium bromide. *c*, U2-OS cells were transfected with an expression vector for GFP and CMV-HA-HTATIP/pRS-HTATIP as indicated. Cell extracts were immunoblotted with antibodies against HA, p21, BAX and GFP. *d*, Overexpression of HTATIP in U2-OS cells increased the population of cells in the G1 phase of the cell cycle after irradiation (+ IR, 5 Gy). Co-transfection of a HTATIP shRNA vector reversed the effect of HTATIP overexpression.

990 different vectors) to infect U2-OS cells. After one day, genomic DNA was isolated from the infected cells, and the shRNA inserts were recovered by PCR with primers flanking the shRNA expression cassette (which includes the 19-mer gene-specific 'bar codes'). The PCR fragments were then labelled with fluorescent dye, and the relative abundance of specific shRNA inserts was determined by hybridization to a DNA microarray containing the 59-mer

oligonucleotides used to generate the hairpin vectors (containing the bar-code sequences). Figure 5a shows that the PCR fragments hybridize with high specificity to their complementary 59-mer oligonucleotides on the array.

To further validate the bar-code screening concept, we asked whether we could identify a mouse p53 shRNA vector mixed in a pool of 312 human shRNA vectors in a functional screen. We infected this

set of shRNA vectors in conditionally immortalized mouse neuronal cells, which are immortal at 32 °C but enter into a synchronous p53-dependent growth arrest at 39 °C [24]. Figure 5b shows the design of the experiment and the relative abundance of all the bar codes ten days after shift to 39 °C, which activated the p53-dependent growth arrest [24]. Only the p53 knockdown vectors (indicated in red) were strongly selected in the population, whereas the set of control shRNA vectors was neither positively nor negatively selected. The positive selection of the p53 shRNA vectors occurred over time and only when the p53-dependent growth arrest was invoked (at

39 °C), and not at 32 °C, which is when p53 is inactive owing to LT binding (Fig. 5d). These data indicate that siRNA bar-code screening can be used to rapidly identify individual shRNA vectors that modulate cellular responses in large populations of vectors.

We identify here five components of the p53 tumour-suppressor pathway through a large-scale RNAi screen in mammalian cells. Inhibition of each of these five genes confers resistance to three different aspects of p53-dependent proliferation arrest, raising the possibility that these genes are tumour-suppressor genes. p53 is a central component of the cellular response to a variety of stress signals, and the genes identified here may be part of the machinery that allow cells to respond to such signals. Our data indicate that the newly identified genes have a role, either directly or indirectly, in modulating the activity of p53 on the *p21^{cip1}* promoter. We did not identify the shRNA for *p21^{cip1}* in the genetic screen, even though it was present in the RNAi library and active in *p21^{cip1}* suppression. This indicates that the first screen was not saturating and that additional p53 pathway components may be identified from this library.

Our data highlight the power of large-scale RNAi screens in mammalian cells. A potentially useful application of siRNA bar-code screens is in the identification of synthetic lethal interactions (a combination of two non-lethal mutations that together result in cell

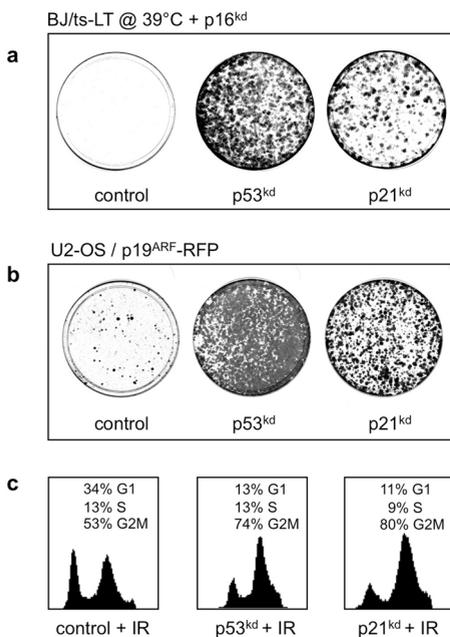


Figure 4
Introduction of p53 and p21 shRNA vectors rescue a, the growth arrest of temperature-shifted BJ-tsLT cells, b, the p19^{ARF}-induced growth arrest in U2-OS cells and c, the p53-induced G1 arrest in U2-OS cells.

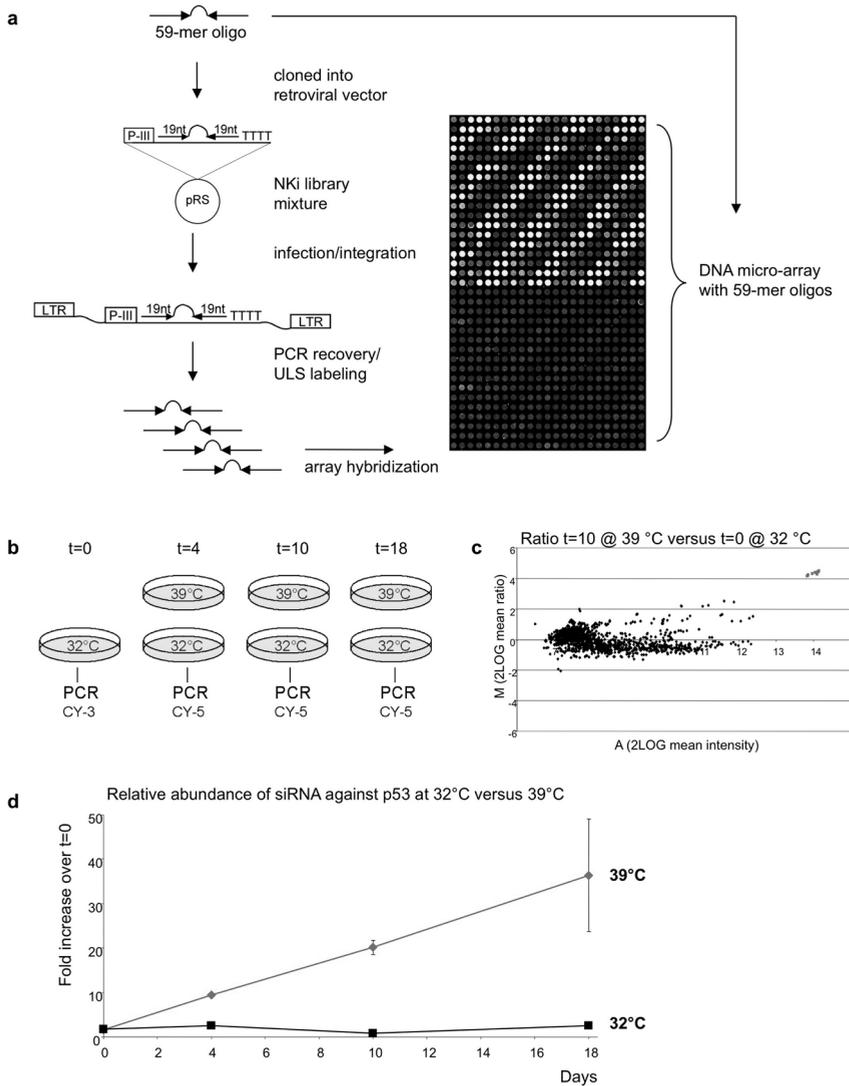


Figure 5

a, DNA microarrays containing the 59-mer oligonucleotides present in a selected set of 990 different shRNA vectors were generated. Genomic DNA isolated from cells infected with these 990 shRNA vectors was used for PCR amplification. ULS-labelled bar-code fragments were hybridized on microarrays that consist of oligonucleotides that were present (upper half) or absent (lower half) in the selected set of 990 vectors. *b*, TsLT immortalized mouse neuronal cells [29] were infected with a retroviral supernatant containing 312 knockdown vectors directed against human genes and one against murine p53 [30]. Cells were temperature shifted to induce a senescence-like arrest and used for isolation of the bar codes at the indicated time points. *c*, Comparative hybridization of bar-code fragments isolated from the experiment described in *b* at *t* = 0 with bar-code fragments isolated ten days after the temperature shift. Gray spots indicate the relative abundance of the p53 shRNA. Note that only the relative abundance of the p53 knockdown vector has increased. *d*, Analysis of the relative abundance of p53 shRNAs in tsLT-immortalized mouse neuronal cells recovered from cells grown at 32 °C, when endogenous p53 is inactivated by the tsLT antigen, or at 39 °C, when p53 is activated owing to loss of tsLT antigen expression.

death). The identification of such genetic interactions in mammalian cells may facilitate the development of new and more specific classes of anticancer drugs.

Methods

Materials, antibodies and vectors

IR was performed with a 2 times 415 Ci ¹³⁷Cs source. Antibodies against p21 (C-19), BAX (N-20), green fluorescent protein (GFP; FL), haemagglutinin (HA; Y-11) and CDK4 (C-22) were obtained from Santa Cruz, anti-Flag M2 from Sigma and anti-p53 (ab-7) from Oncogene Research Products. HA-tagged HTATIP was PCR amplified and cloned in pRC/CMV (Invitrogen). Flag-tagged RPS6KA6, CCT2 and KIAA0828 were generated by PCR amplification and cloning into pcDNA3.1/HygroFlag. pRS, pRS-p16kd, LZRS-p19ARF-RFP-IRES-zeocin, Flag-HDAC4 and H2B-GFP have been described previously [9, 25, 26]. pEGFP-N1 was obtained from Clontech. For the generation of knockdown vectors for p53, p21 and HDM2, the following 19-nucleotide sequences were used: p53, 5'-CTA CATGTGTAACAGTTCC-3'; p21, 5'-GACCATGTGGACCTGTCAC-3'; and HDM2, 5'-GATGATGAGGTATAT CAAG-3'. Control transfections were performed with a mixture of non-functional hairpins.

Oligonucleotide design and library construction

A representative mRNA sequence was selected for each target from UniGene (<http://www.ncbi.nlm.nih.gov/entrez/query.fcgi?db> =

unigene). Sequences were masked to remove repetitive sequences using RepeatMasker (<http://ftp.genome.washington.edu/cgi-bin/RepeatMasker>), and vector contamination was masked by searching with NCBI BLAST (<http://www.ncbi.nlm.nih.gov/BLAST/>) against UniVec (<http://www.ncbi.nlm.nih.gov/VecScreen/UniVec.html>). Three unique 19-mers for each target were selected, where possible, (1) to contain no stretches of four or more consecutive T or A residues (to avoid premature pol III transcription termination signals); (2) to have 30–70% overall GC content; (3) to lie within the coding sequence of the target gene; (4) to begin with a G or C residue (consistent with recently established rules for strand bias [27]); (5) to begin after an AA dimer in the 5' flanking sequence; (6) to end just prior to a TT, TG or GT doublet in the 3' flanking sequence; (7) to not contain XhoI or EcoRI restriction-enzyme sites to facilitate subsequent shuttling of the knockdown cassette into other vector backbones; (8) to share minimal sequence identity with other genes; (9) to target all transcript variants represented by RefSeq mRNAs (<http://www.ncbi.nlm.nih.gov/RefSeq/>); and (10) to not overlap with other 19-mers selected from the same target sequence.

For cloning, pairs of complementary oligonucleotides were annealed and ligated into HindIII/BglII-digested pRS in 96-well plates. Ligation reactions were transformed into competent DH5alpha bacteria.

Bacterial cultures were grown overnight and plasmid DNA was isolated. All manipulations were performed using a Multimek robot.

Additional information about the NKi RNAi library can be found at <http://screeninc.nki.nl/>.

Cell culture, transfection and retroviral infection

BJ fibroblasts were cultured in a 4:1 mixture of DMEM:M199 supplemented with 15% heat-inactivated fetal calf serum. U2-OS and Phoenix cells were cultured in DMEM supplemented with 10% heat-inactivated fetal calf serum. Transfections were performed with the calcium phosphate precipitation technique. Ecotropic retroviral supernatants were produced by transfection of Phoenix packaging cells. Viral supernatants were filtered through a 0.45 µm filter, and infections were performed in the presence of 4 µg/ml polybrene (Sigma). Drug selections in U2-OS cells were performed with 2 µg/ml puromycin and 200 µg/ml zeocin (Invitrogen).

Recovery of shRNA inserts

Genomic DNA was isolated from expanded colonies using DNAzol (Life Technologies). PCR amplification of the shRNA inserts was performed with Expand Long Template PCR system (Roche) and the use of pRS-fw primer: 'CCCTTGAACCTCCTCGTTTCGACC-3 and pRS-rev primer: 5'-GAGAC GTGCTACTTCCATTTGTC-3'. Products were digested with EcoRI/XhoI and recloned into pRS. Hairpins were sequenced

with Big Dye Terminator (Perkin Elmer) using pRS-seq primer: 5'-GCTGACGTCATCAACCCGCT-3'.

Cell-cycle analysis

For fluorescence-activated cell sorting (FACS) analysis, U2-OS cells were co-transfected with H2B-GFP to select for transfected cells. Forty-eight hours after transfection, cells were treated with IR (5 or 10 Gy). Twenty-four hours after IR, the cells were washed and fixed in 70% ethanol at 4 °C. Before FACS analysis, cells were washed with PHN (PBS, 20 mM HEPES, 0.5% NP40) and incubated with 10 µg/ml propidium iodide and 250 µg/ml RNase A. In each assay, 8,000 GFP-positive cells were collected by FACScan and analysed using the CellQuest program (Becton Dickinson).

Western and northern blotting

For western blots, puromycin-selected cells were lysed in RIPA buffer (50 mM Tris pH 8; 150 mM NaCl; 1% NP40; 0.5% DOC; 0.1% SDS). Thirty micrograms of protein was separated on 8–12% SDS-polyacrylamide gel electrophoresis and transferred to polyvinylidene difluoride membranes (Millipore). Western blots were probed with antibodies. For northern analysis, 15 µg total RNA was loaded on a 1% agarose gel and blotted onto Hybond N + (Amersham). 32P-labelled probes for p21 and BAX were generated with PCR labelling.

siRNA bar-code screens

The shRNA inserts were amplified from genomic DNA by PCR using

the primers pRS-fw primer 'CCCTTGAACCTCCTCGTTTCGACC-3' and pRS8-rev primer 5'-TAAAGC GCATGCTCCAGACT-3'. PCR products were labelled with cyanine-3 or cyanine-5 fluorescent groups using the Universal Linkage System (ULS; Kreatech Biotechnology) and purified over a KreaPure (Kreatech Biotechnology) spin column as described previously [28]. PCR products from two samples were combined and hybridized to oligonucleotide arrays in 40 µl of 25% formamide, 5 times SCC, 0.01% SDS (containing poly d(A), yeast transfer RNA and COT-1

DNA). Samples were heated to 100 °C for 1 min and applied to the array. Samples were hybridized for 18 h at 42 °C, washed and scanned using an Agilent microarray scanner. Quantification of the resulting fluorescent images was performed with Imagene 5.6 (BioDiscovery); the local background was subtracted and the data normalized and 2log transformed. Additional information on bar-code screens can be found at <http://screeninc.nki.nl/>.

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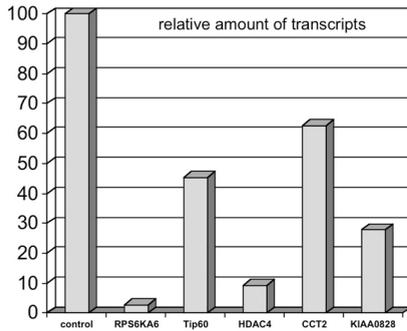
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Supplementary figure 2

For the five identified genes endogenous knockdown was determined with the use of Real-Time TaqMan PCR. Total RNA was isolated from U2-OS cells stably infected with the indicated shRNA vectors. All primers were designed to be intron-spanning to preclude amplification of genomic DNA. The expression level for each of the genes tested was corrected for the input of cDNA based on the housekeeping gene glyceraldehyde-3-phosphate dehydrogenase (GAPDH) control. The quality control of the PCR reactions were assessed by standardized PCR conditions, including in each experiment a genomic DNA control and a negative non-template control. Shown is a representative experiment where the relative amount of transcripts is indicated as a percentage of transcripts detected in control RNA samples.



CHAPTER III

An shRNA barcode screen provides insight into cancer cell vulnerability to MDM2 inhibitors

An shRNA barcode screen provides insight into cancer cell vulnerability to MDM2 inhibitors

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The identification of the cellular targets of small molecules with anticancer activity is crucial to their further development as drug candidates. Here, we present the application of a large-scale RNA interference–based short hairpin RNA (shRNA) barcode screen to gain insight in the mechanism of action of nutlin-3 (Compound [1]). Nutlin-3 is a small-molecule inhibitor of MDM2, which can activate the p53 pathway. Nutlin-3 shows strong antitumor effects in mice, with surprisingly few side effects on normal tissues [1]. Aside from p53, we here identify 53BP1 as a critical mediator of nutlin-3–induced cytotoxicity. 53BP1 is part of a signaling network induced by DNA damage that is frequently activated in cancer but not in healthy tissues [2]. Our results suggest that nutlin-3’s tumor specificity may result from its ability to turn a cancer cell–specific property (activated DNA damage signaling [3]) into a weakness that can be exploited therapeutically.

The tumor-suppressor gene *TP53* (also called *p53* and encoding the protein p53) is the gene most frequently mutated in human cancer. However, approximately 50% of all human tumors retain normal p53 [4]. Direct activation of p53 in these tumors could in principle be used as a means to eradicate tumor cells. The activity of p53 is tightly regulated. p53 is

activated in response to a variety of stresses, such as DNA damage, nutrient deprivation or oncogene activation, resulting in the transcriptional activation of target genes involved in growth arrest and apoptosis [5]. To protect healthy cells from the deleterious effects of uncontrolled p53 activation, p53 is subject to a negative feedback loop activated by the protein product of

one of its target genes, MDM2. The protein MDM2 binds to p53, inhibits transcriptional activation, causes nuclear export and acts as an E3 ligase to target p53 for proteasomal degradation [6, 7].

One potential approach for activating p53 in tumor cells is to disrupt the interaction between MDM2 and p53 with the small molecule nutlin-3 [1, 8]. Nutlin-3 binds to MDM2, thereby preventing the interaction with p53 and causing p53 to be stabilized. Nutlin-3 has strong antitumor effects *in vivo* but, notably, few toxic effects in normal mice [1]. In theory, activation of p53 could be at least as deleterious to normal cells as to tumor cells, because the former are not attenuated in their ability to undergo apoptosis and are more obedient to growth-inhibitory signals than are cancer cells. However, tumor cells that have lost the *p53* gene through mutation seem to be exquisitely sensitive to reintroduction of the wild-type gene [9]. This phenomenon has never been understood in detail, and has often been attributed to the presence of other oncogenic mutations or to a differential wiring of the p53 network in tumor cells as compared to normal cells [9]. We report here a loss-of-function genetic screen designed to identify important components of the p53 network mediating the cytotoxic effect of nutlin-3 in human tumor cells.

A variety of approaches can be used for the identification of genes essential for a drug-induced phenotype [9-16], including the

recently developed RNAi barcode screening technology [10-13]. Barcode screens use DNA microarrays to follow the relative abundance, under particular conditions, of each shRNA vector in a large population of cells infected with an shRNA vector library (Fig. 1a). Using retroviral infection, we introduced a collection of 23,742 different pRETRO-SUPER vectors designed to target 7,914 human genes for suppression by RNA interference (RNAi) into MCF-7 cells (which have wild-type p53 [10]). The infected cells were split into two pools, one of which was left untreated and was used as a reference while the other was exposed to 4 μ M nutlin-3. MCF-7 cells respond to this concentration of nutlin-3 predominantly by undergoing cell-cycle arrest rather than apoptosis (data not shown and Fig. 2c), possibly because the cells have a deficiency in caspase-3 [14]. After 14 d of selection with nutlin-3, we recovered shRNA cassettes by PCR amplification and analyzed them by hybridization to DNA microarrays as described [10, 15]. A small number of shRNA vectors were consistently enriched in the population treated with nutlin-3 (Fig. 1b). As expected, one of these vectors that was positively selected in the presence of nutlin-3 as compared to untreated control cells is directed against p53 which validates the shRNA barcode approach used here. Loss of p53 confers resistance to nutlin-3 by removing the effector of MDM2 [1]. In addition, several of the shRNA vectors we identified target proteins with known or predicted functions in

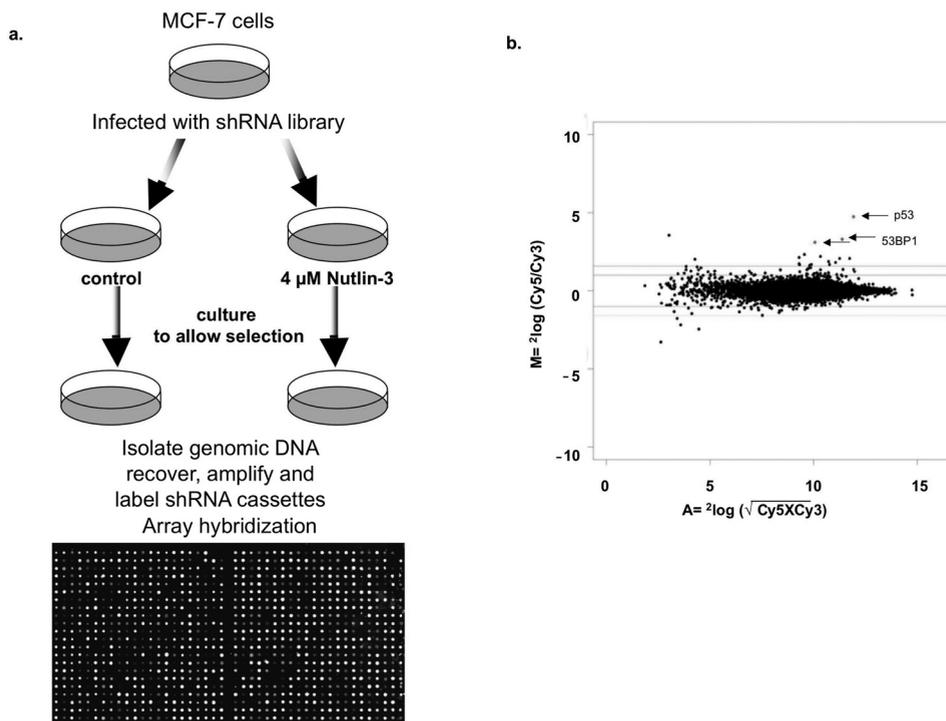


Figure 1
shRNA barcode screen identifies 53BP1 as a mediator of the antiproliferative effects of nutlin-3.
 (a) Schematic outline of the nutlin-3 barcode experiment in MCF-7 cells. Identical populations of MCF-7 cells infected with the NKI shRNA library were either left untreated or treated with 4 μ M nutlin-3. After 14 d the shRNA cassettes were recovered and labeled 10, 11. The labeled shRNA probes were hybridized to DNA microarrays containing the sequences complementary to the hairpin oligos. (b) Analysis of the relative abundance of shRNAs recovered from the nutlin-3 barcode experiment. Data are normalized and depicted as M, the $2\log$ (ratio Cy5/Cy3), versus A ($2\log$ (radicintensity Cy3 times Cy5)). The data are the average of two independent hybridization experiments performed in duplicate with reversed color. (c) List of genes targeted by the shRNA vectors from b that were significantly enriched ($P < 0.01$) in nutlin-3–treated cells. The vectors for TP53 and both vectors for 53BP1 have been validated for knockdown and rescue of nutlin-3–induced cell-cycle arrest. Column M depicts the $2\log$ ratio of the abundance of barcodes present in cells treated with nutlin-3 (Cy5) as compared to untreated cells (Cy3).

p53-mediated pathways (Fig. 1c). Two of these shRNA vectors target p53-binding protein-1 (53BP1), through independent sequences. 53BP1 has been implicated in DNA damage sensing leading to p53 activation. In addition, we found an shRNA vector targeted against protein heterogeneous nuclear ribonucleoprotein K (hnRNPK), which has recently been identified as

an MDM2 target and transcriptional coactivator of p53 in response to DNA damage [16]. The observation that depletion of hnRNPK abrogates the transcriptional induction of p53 target genes is consistent with an override of a nutlin-3–mediated cell-cycle arrest upon hnRNPK inactivation. We also identified three vectors targeting genes encoding known p53 transcriptional targets:

BCL2-antagonist of cell death (*BAD*), placental bone morphogenic protein (*PLAB*) and immediate-early response 3 (*IER3*, also called *IEX-1*). Both *BAD* and *IEX-1* have roles in the regulation of apoptosis. *IEX-1* can block the PI3K/AKT pathway, resulting in increased sensitivity to apoptosis [17]. *PLAB* is also implicated as an important downstream mediator of DNA damage signaling [18]. Other shRNA vectors we identified in our screen target genes that are not implicated in the regulation of p53 or p53-dependent pathways. The presence of the genes encoding TGFbeta-inducible early growth response-1 (*TIEG1*, also called *KLF10*) and *PLAB* among the targets of the vectors identified suggests that the TGFbeta pathway is involved in the cell-cycle arrest induced through the activation of the p53 pathway by nutlin-3 treatment. Notably, *TIEG1* expression is reduced in invasive breast cancer cells [19]. The shRNA barcode screen did not identify genes that enhance the cytotoxic effects of nutlin-3 in MCF-7 cells—that is, there were no shRNA vectors that were significantly depleted from the population as a result of nutlin-3 treatment. This may either be a consequence of the biological system or reflect a technical limitation of the current barcode protocol. In addition, we cannot exclude the possibility that some vectors are selected in this screen as a result of effects on cellular components other than the intended targets.

Our identification of two independent shRNA vectors targeted

against 53BP1 in our screen greatly reduces the possibility that the observed effects are due to 'off-target' effects of the RNAi vectors. Moreover, this indicates that the observed phenotype is due to the reduced expression of the intended target. We therefore focused our subsequent validation on the effect of 53BP1 on nutlin-3 cytotoxicity. To validate the selection of shRNAs against *53BP1* in our barcode experiment, we performed a long-term growth assay with MCF-7 cells expressing the two different shRNA vectors against *53BP1*. MCF-7 cells exposed to nutlin-3 undergo a proliferation arrest and acquire a flattened phenotype (Fig. 2a,b, left). In contrast, MCF-7 cells transduced with shRNA encoding retroviruses against *p53* or *53BP1* and exposed to nutlin-3 show a cellular morphology resembling that of untreated MCF-7 cells. This effect is not unique to MCF-7 breast cancer cells, as inhibition of *53BP1* also alleviates the cytotoxic effects of nutlin-3 in A549 (human lung cancer) cells (Fig. 2b, right). We tested the effect of the inactivation of either *p53* or *53BP1* on the cell-cycle progression of MCF-7 cells exposed to 4 μM nutlin-3 for 48 h. The percentage of MCF-7 cells in S-phase, as determined by BrdU incorporation, was reduced from 44% for control cells to 2% in cells exposed to nutlin-3, whereas knockdown of *p53* or *53BP1* largely prevented this reduction, resulting in S-phase percentages of 29% and 17%, respectively (Fig. 2c). To further validate the efficacy of the shRNA vectors against 53BP1, we tested their effects on the expression

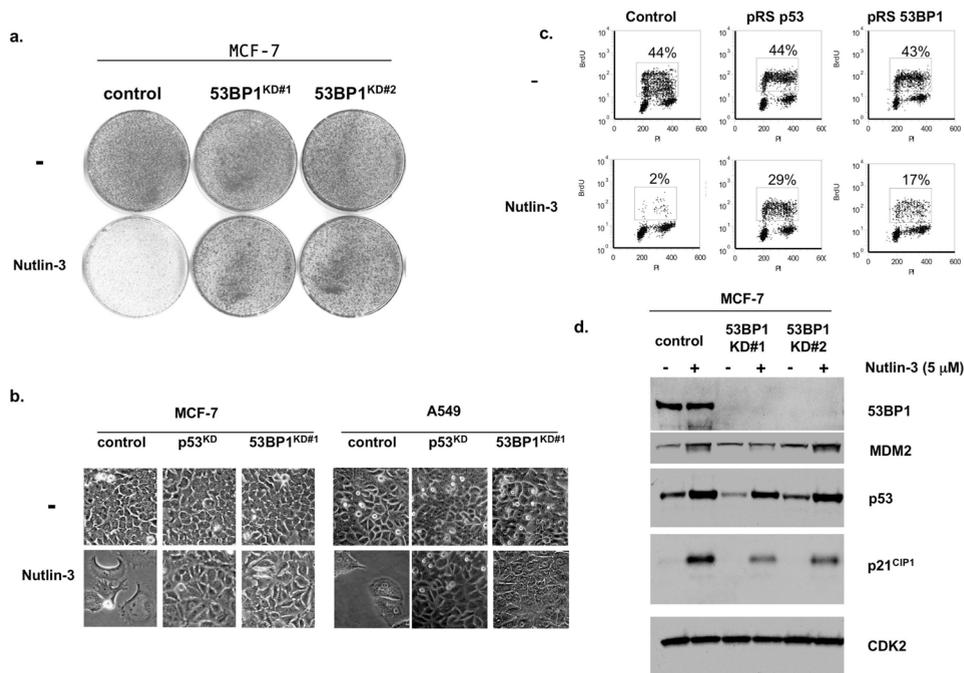


Figure 2

53BP1 modulates the cellular cytotoxicity induced by nutlin-3 in MCF-7 cells.

(a) MCF-7 cells infected with shRNAs against GFP or two independent shRNAs directed against 53BP1 (knockdown vector is labeled KD), untreated or treated with 4 μM nutlin-3 for 14 days. Cell density is visualized by Coomassie staining of the cells. (b) MCF-7 cells and A549 cells infected with shRNAs directed against GFP, p53 or 53BP1, untreated or treated with nutlin-3. (c) Cell-cycle profile and BrdU incorporation of MCF-7 infected with shRNAs against GFP (control), p53 or 53BP1. Percentages of BrdU-positive cells are shown. (d) Western blot analysis of the MCF-7 cells expressing either shRNA against GFP (control) or one of the two shRNAs against 53BP1, 53BP1#1 or 53BP1#2. The cells were analyzed for the expression levels of 53BP1, the stabilization of p53 and the induction of p21 and MDM2.

of 53BP1, the stabilization of p53 by nutlin-3, and the activation of a p53 target gene, *CDKN1A* (also called p21 and encoding p21^{cip1}). Both shRNA vectors targeting *53BP1* were active in inhibiting *53BP1* expression (Fig. 2d). The induction of p53 by nutlin-3 treatment is not altered in the presence or absence of 53BP1 expression. Notably, the shRNA-mediated knockdown of *53BP1* impairs the activation of the p53 target gene *CDKN1A* by

nutlin-3. These results demonstrate that, beside p53, 53BP1 also has an essential role in mediating the cytotoxic effects of nutlin-3 in MCF-7 cells.

53BP1 is a component of the ATM-CHEK-53BP1 pathway that is activated by double-stranded DNA breaks or shortened telomeres, resulting in the induction of p53 [20]. Notably, this ATM-CHEK-53BP1 DNA damage checkpoint-signaling

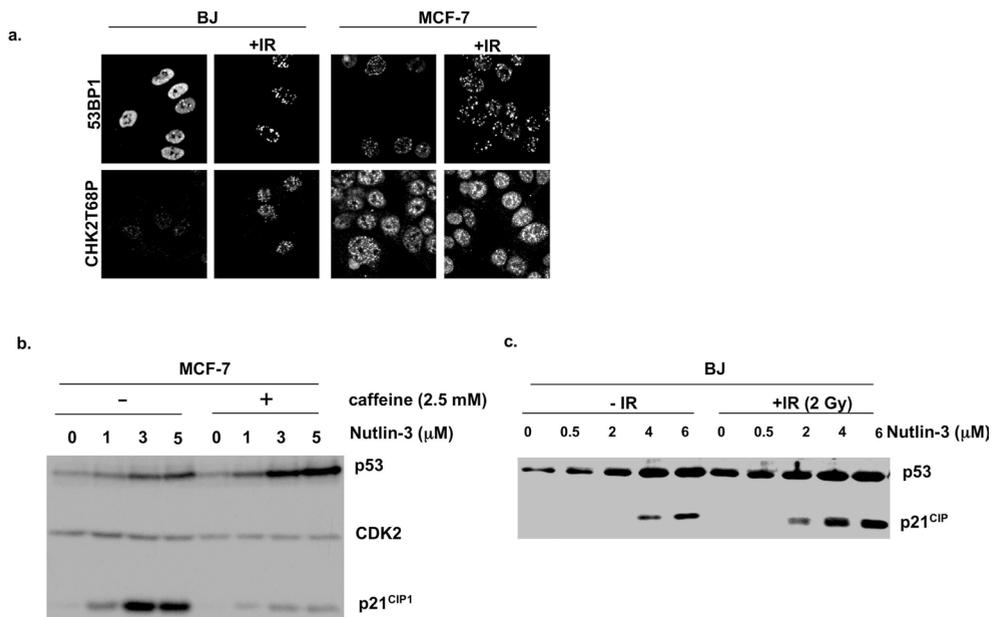


Figure 3

Intrinsic DNA damage signaling contributes to the cytotoxic effect of nutlin-3 in MCF-7 cells.

(a) Immunolocalization of p53BP1 (above) and CHK2 (below) in human primary fibroblasts (left) and MCF-7 cells (right) before and after irradiation. (b) Western blot analysis of the stabilization of p53 and induction of p21 in MCF-7 cells treated with increasing concentrations nutlin-3 for 18 h in the absence or presence of 2.5 mM caffeine. The cells were pretreated with 2.5 mM caffeine for 12 h. (c) Western blot analysis of the stabilization of p53 and the induction of p21 in normal BJ fibroblasts treated with increasing concentrations nutlin-3 without or with exposure to 2Gy irradiation.

pathway is often constitutively activated in human cancers and premalignant lesions, but not in normal, healthy tissues [2, 3, 21]. Based on the role of 53BP1 in mediating the antiproliferative effect of nutlin-3 identified here, we hypothesized that intrinsic DNA damage signaling in MCF-7 cells is required for nutlin-3 cytotoxicity. The presence of activated DNA damage signaling in MCF-7 cells was demonstrated by the detection of nuclear foci containing 53BP1, a characteristic of DNA damage-induced activation of 53BP1 [22]. Indeed, a substantial fraction of MCF-7 cells show localization of

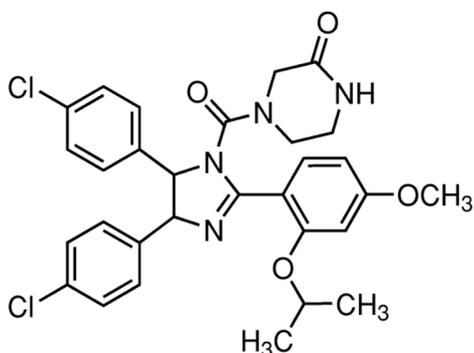
53BP1 in nuclear foci. Normal BJ fibroblasts have diffuse nuclear staining, although some 53BP1 foci are present (Fig. 3a, above). The presence of DNA damage foci in normal human fibroblasts in culture is in agreement with previous studies describing the presence of H2AX DNA damage foci and p53 activation in primary cells cultured *in vitro* [23]. MCF-7 cells also show strong nuclear staining with an antibody directed against phosphorylated CHK-2, even in the absence of ionizing radiation (Fig. 3a, below). In contrast, normal BJ fibroblasts show very little immunoreactivity, whereas BJ fibroblasts treated

with ionizing radiation show strong nuclear staining (Fig. 3a, below). Together these data indicate that in MCF-7 cells, in the absence of ionizing irradiation, activation of DNA damage checkpoint signaling involving 53BP1 occurs, reflecting DNA damage signaling seen in many human tumors [2].

The presence of activated DNA damage checkpoints in MCF7 cells suggests that DNA damage-induced 'stress signals' could be important in sensitizing MCF-7 cells to MDM2 inhibition. To test this, we inhibited DNA damage signaling in MCF-7 cells through inhibition of ATM/ATR-dependent checkpoints by caffeine (Compound 2) treatment [24-26]. The inhibition of ATM/ATR kinases in MCF-7 cells resulted in a decrease in the transcriptional activation by p53 in response to nutlin-3 exposure, as evidenced by induction of *p21^{cip1}* (Fig. 3b).

The inhibition of ATM/ATR kinases does not prevent p53 accumulation in response to nutlin-3 exposure, indicating that p53 stabilization and transactivation are separate events (Fig. 3b). To further test whether DNA damage signaling enhances the effects of nutlin-3, we treated normal BJ fibroblasts with increasing concentrations of nutlin-3 in the absence or presence of a low level of DNA damage induced by ionizing radiation. A more robust activation of the p53 target gene *p21^{cip1}* was seen in response to nutlin-3 treatment in the presence of DNA damage (Fig. 3c). From these results we conclude that inhibition of intrinsic DNA damage signaling by *53BP1* knockdown prevents full activation of p53 after stabilization in response to MDM2 inhibition. Genomic instability is a well-recognized property of the vast majority of human cancers. This labels cancer tissues with

a.



b.

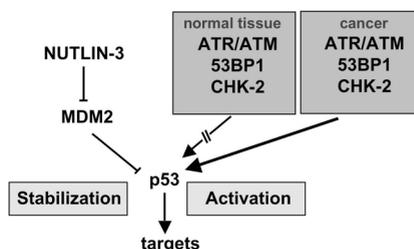


Figure 4

The cytotoxic effect of nutlin-3 in tumor cells is enhanced by intrinsic DNA damage signaling.

(a) Chemical structure of nutlin-3. (b) Schematic representation of a putative model reflecting the intrinsic DNA damage signaling (involving 53BP1) present in tumor cells (but absent in normal cells) increasing the cytotoxicity associated with nutlin-3 treatment.

a feature not seen in normal tissues, and it has therefore been suggested that genetic instability is an Achilles heel of tumor cells that could be exploited by future anticancer therapeutics [27]. Recent experiments have indicated that activation of DNA damage signaling (involving H2AX, 53BP1, ATR and ATM) occurs very early during tumorigenesis [3, 21]. Our data indicate that this DNA damage signaling enhances the effects of the MDM2 inhibitor nutlin-3 (Fig. 4). The absence of such signals in normal cells *in vivo* may well explain their reduced sensitivity to nutlin-3 [2]. The consequences of partial inactivation of MDM2 by small-molecule inhibitors resemble the phenotype seen in mice carrying a hypomorphic allele of *MDM2*. These mice are viable but show severe radiosensitivity [28].

Methods

Cell culture

MCF-7 breast cancer cells and BJ primary human fibroblasts, both expressing the ecotropic receptor, were cultured in DMEM supplemented with 10% fetal calf serum and penicillin and streptomycin. Cells were grown at 37 °C in 5% CO₂. Phoenix cells were used to produce ecotropic retroviruses as described previously [11]. Nutlin-3 ((+/-)-4-[4,5-bis(4-chlorophenyl)-2-(2-isopropoxy-4-methoxyphenyl)-4,5-dihydroimidazol-1-carbonyl]piperazin-2-one) was obtained from Cayman Chemical. Caffeine pretreatment of MCF-7 cells was performed by incubation with 2.5

Our data suggest that MDM2 inhibitors would be most effective for tumors that have both wild-type p53 and activated DNA damage signaling, which is a substantial fraction of all human tumors. However, a combination of MDM2 inhibitors with DNA-damaging treatments may be harmful to normal cells and would cause undesired side effects in patients. In conclusion, the present study illustrates that shRNA barcode screens can be used to reveal cellular components that mediate drug cytotoxicity, resulting in a more complete understanding of drug action and enabling more rational decisions to be made in regard to drug application.

mM caffeine (Sigma-Aldrich) for 12 h.

Barcode screen

MCF-7 cells were infected with retroviruses representing the complete Netherlands Cancer Institute (NKI) shRNA library described previously [10]. Infected cells were selected on puromycin (2.0 µg/ml) for 4 d and split into two populations. One population was left untreated, while the other population was exposed to 4 µM nutlin-3. After 14 d, genomic DNA was isolated with DNAzol (Invitrogen) and shRNA inserts were amplified from genomic DNA by

PCR using the primers pRS-T7-fw, 5'-GGCCAGTGAATTGTAATACGAC-TCACTATAGGGAGGCGGCCCT TGAACCTCCTCGTTTCGACC-3', containing a T7 RNA polymerase promoter sequence, and pRS8-rev, 5'-TAAAGCGCATGCTCCAGACT-3'. After purification (QIAquick PCR purification kit, Qiagen), PCR products were used for linear RNA amplification using the Megascript T7 kit (Ambion), and purified RNA probes (RNeasy, Qiagen) were labeled with cyanine-3 (Cy3) or cyanine-5 (Cy5) fluorescent groups using ULS (Kreatech) and purified over a KreaPure (Kreatech) spin column as described [29]. Labeled RNA probes from untreated and nutlin-3-treated cells were combined and hybridized to oligonucleotide arrays in 40 μ l of hybridization mixture (25% formamide, 5times SCC, 0.01% SDS, 25% Kreamblock (Kreatech)). Samples were heated to 100 $^{\circ}$ C for 5 min and applied to the array. Microarrays were hybridized for 18 h at 42 $^{\circ}$ C, washed and scanned using an Agilent microarray scanner. Quantification of the resulting fluorescent images was performed with Imagen 5.6 (BioDiscovery), local background was subtracted, and the data were normalized [30] and 2log transformed.

Plasmids

The shRNA sequences used to target p53 and p53BP1 were as follows: p53 5'-GACTCCAGTGGTAATCTAC-3'; 53BP1#1 5'-GATACTGCCTCATCACA GT-3'; 53BP1#2 5'-GAACGAGGAG ACGGTAATA-3'. The shRNA sequences were cloned into pRETROSUPER as described

previously [10].

Cell-cycle analysis

MCF-7 cells infected with shRNA vectors against GFP (control), p53 and 53BP1 were treated for 48 h with nutlin-3 or left untreated. The cells were labeled with 10 μ M BrdU for 30 min before harvesting. Cells were fixed in 70% ethanol and permeabilized in HCl-Triton solution (2 M HCl, 0.5% Triton X-100). The samples were neutralized in borate solution (0.1 M Na₂B₄O₇·10H₂O) and labeled with antibody to BrdU (Dako; 1% BSA in PBS containing 0.5% Tween-20) in combination with FITC-conjugated secondary antibody (Dako; goat anti-mouse IGM-FITC). Samples were incubated with 10 μ g/ml propidium iodide and 250 μ g/ml RNase. In each assay 10,000 cells were collected by FACScan (Becton Dickinson) and analyzed using the FCS Express program (De Novo Software).

Western blotting

Protein lysates were separated on SDS-PAGE gels, blotted onto nitrocellulose membranes and incubated with antibodies directed against MDM2 (2A10 and SMP14, Santa Cruz), 53BP1 (Novus Biologicals), p53 (DO-1), p21 (C19, Santa Cruz), CDK4 (C-22, Santa Cruz) and CDK2 (M2, Santa Cruz).

Immunofluorescence

Cells grown on coverslips were washed with PBS, fixed and permeabilized in 3% paraformaldehyde and 0.1% Triton X-100, and washed three times with PBS containing 0.05% saponin. Slides were blocked with

10% normal goat serum in PBS with 0.05% saponin. Cells were stained with antibodies directed against 53BP1 (1:100, Novus Biologicals) and against phosphorylated CHK-2 (p-T68-CHK2; 1:100, Cell Signaling Technologies); FITC-conjugated goat anti-rabbit antibodies were used as secondary antibodies. All antibodies were diluted in PBS

containing 10% normal goat serum and 0.05% saponin.

Microarray data

Microarray datasets for the barcode experiments can be found at the authors' supporting website (<http://www.screeninc.nl>).

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CHAPTER IV

A large scale shRNA barcode screen identifies the circadian clock component ARNTL as putative regulator of the p53 tumor suppressor pathway

A large scale shRNA barcode screen identifies the circadian clock component ARNTL as putative regulator of the p53 tumor suppressor pathway.

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Background: The p53 tumor suppressor gene is mutated in about half of human cancers, but the p53 pathway is thought to be functionally inactivated in the vast majority of cancer. Understanding how tumor cells can become insensitive to p53 activation is therefore of major importance. Using an RNAi-based genetic screen, we have identified three novel genes that regulate p53 function.

Results: We have screened the NKI shRNA library targeting 8,000 human genes to identify modulators of p53 function. Using the shRNA barcode technique we were able to quickly identify active shRNA vectors from a complex mixture. Validation of the screening results indicates that the shRNA barcode technique can reliably identify active shRNA vectors from a complex pool. Using this approach we have identified three genes, ARNTL, RBCK1 and TNIP1, previously unknown to regulate p53 function. Importantly, ARNTL (BMAL1) is an established component of the circadian regulatory network. The latter finding adds to recent observations that link circadian rhythm to the cell cycle and cancer. We show that cells having suppressed ARNTL are unable to arrest upon p53 activation associated with an inability to activate the p53 target gene p21^{CIP1}.

Conclusions: We identified three new regulators of the p53 pathway through a functional genetic screen. The identification of the circadian core component ARNTL strengthens the link between circadian rhythm and cancer.

Introduction

The TP53 gene product is important in the cellular response to different types of stress [1,2]. A major physiological stress is DNA damage. DNA damage leads to activation of the ATM/ATR, CHK1/2 cascade, which in turn activates p53. Activation of p53 is achieved by increased stability and post translational modifications of the p53 protein. These modifications include phosphorylation, methylation [3], ubiquitination [4,5] and acetylation [6] leading to enhanced transcriptional activity of p53. Furthermore, oncogene activation can also lead to p53 activation through activation of the p19^{ARF} protein. p19^{ARF} inhibits MDM2, the major E3 ubiquitin ligase for p53 [7] leading to stabilization and activation of p53. Activation of p53 leads to transcriptional activation of a large set of p53 target genes, which in turn causes cell cycle arrest or apoptosis [8].

The p53 pathway is inactivated in almost all human cancers [9]. In about half of human cancers this is due to mutation or deletion of the TP53 gene itself. However in a significant fraction of human tumors, the p53 pathway is inactivated through alteration in cellular components acting up- or down-stream of p53. For example, amplification of the negative regulator of p53, MDM2, leads to accelerated degradation and inactivation of p53 [2,10].

As a model to screen for genes that modulate p53 function, we previously developed a human

fibroblast cell line named BJTsLT [11]. These cells express a temperature-sensitive mutant of the SV40 large T antigen, which allows the cells to proliferate at the permissive temperature (32°C). However, when the cells are shifted to 39°C, the large T antigen is degraded and the cells enter a stable p53-dependent cell cycle arrest.

We and others have previously described the construction and initial screening of shRNA libraries using the barcode technique [11-17]. The barcode technique allows the rapid identification of individual shRNA vectors from a large pool of shRNA vectors that produce a specific phenotype. This approach takes advantage of the fact that each shRNA vector contains a unique 19-mer sequence as part of the shRNA cassette, which can serve as a molecular "barcode" identifier. Briefly, cells are infected with the pooled shRNA library of some 24,000 vectors. The population of cells is then split into two separate populations. One population is used as a reference sample while the other sample is subjected to a selective treatment. Knockdown of a specific gene by the shRNA vector can lead to three possible cellular responses to this treatment. First the cells can remain unaffected identical to control cells, second the cells can become more sensitive to the treatment and third the cells can acquire resistance to the treatment. As a consequence of the differential response to the treatment, the

relative number of cells that harbor a specific shRNA can increase, decrease or remain the same. The relative abundance of each shRNA cassette can be determined by the isolation of the shRNA cassettes from the population, labeling of the barcode identifiers with different fluorescent dyes and subsequent hybridization to DNA microarrays representing all shRNA sequences. By comparing the relative abundance of all shRNAs against the reference population, shRNAs responsible for the three possible phenotypes can be identified.

The shRNA barcode technique can be used for different screening approaches, most notably the identification of genes that are involved in drug resistance. For instance, we have used the barcoding approach to identify genes that are involved in the resistance to the cytotoxic effects of Nutlin-3, a drug that activates p53 by acting as an inhibitor of MDM2 [13]. This led to the identification of 53BP1, a p53 binding protein, as a critical modulator of the effect of Nutlin-3. More recently, we found the tumor suppressor *PTEN* as a gene, which upon decreased expression confers resistance to trastuzumab in breast cancer [12].

Results

Screening of the BJtsLT cells

To identify shRNA vectors that can modulate the activity of the p53 pathway, we performed a shRNA barcode screen in BJtsLT cells infected with the NKI shRNA library (See Figure 1a). These cells proliferate

Significantly, the PI3K pathway, which is negatively regulated by PTEN, was also shown to be a major regulator of trastuzumab sensitivity in the clinic, underscoring the utility of the *in vitro* genetic screens to identify drug modulators.

In the first screen applying the NKI shRNA library, Berns et al. used BJtsLT cells to identify 5 new players in the p53 pathway [11]. This screen did not take advantage of the barcode technology. Rather, it was performed by the conventional method of isolating and expanding colonies that are resistant to p53-mediated growth arrest. Subsequent isolation of the shRNA inserts and sequence analysis was required to identify the shRNA responsible for the bypass of the p53 mediated cell cycle arrest. This method is rather laborious and such an approach may not uncover all active shRNAs in a library. Moreover, due to the labour-intensive nature of the screen, only part of the 24,000 vector NKI shRNA library was covered in this initial approach. Here we describe the screening of the entire NKI shRNA library for modulators of p53 activity using the barcode technology. We find three additional genes whose suppression causes resistance to p53-dependent proliferation arrest.

at 32°C but enter into a p53-dependent proliferation arrest at 39°C [11]. The infected cells were cultured for three days at 32°C to allow retroviral integration and for gene knockdown to become effective. At day 4 the cells were

split into two populations; one was kept at 32°C and the other was shifted to 39°C. The BJtsLT at 32°C were cultured until the population reached confluency and genomic DNA was isolated. The BJtsLT cells grown at 39°C cease proliferation unless a shRNA is expressed that inactivates the p53-dependent anti-proliferative response. Such cells will continue to proliferate and give rise to a colony. In addition to infection with the NKI shRNA library, we also used a shRNA vector targeting p53 as a positive control for colony outgrowth of the BJtsLT cells at 39°C. After 3 weeks of culturing at 39°C, the control plates infected with p53 shRNA vector contained large numbers of colonies consisting of rapidly proliferating cells (data not shown). The plates infected with the shRNA library also contained several colonies. Colonies from the library-infected plates were pooled and genomic DNA was isolated. The shRNA cassettes were recovered from the genomic DNA using PCR. The recovered shRNA inserts from both the control population and the colonies that continued proliferation at 39°C following infection with the shRNA library, were used to hybridize DNA microarrays containing all 24,000 19-mer sequences of the NKI shRNA library. The hybridization was performed for each of the replicate experiments, after which the results were combined to increase the statistical significance of the enriched shRNA vectors identified. Those shRNA vectors that confer resistance to the p53 mediated cell cycle arrest are enriched in the population cultured at 39°C and

can be detected as outliers in a MA-plot representation of the barcode microarray experiment (figure 1b).

From this MA-plot we generated a "hit list" of shRNA vectors that are specifically enriched in cell cultured at 39°C. The following considerations were used to produce this hit list (summarized in figure 1c). We excluded all shRNAs that had an intensity (A-value) lower than 10, as spots with a relative low intensity are likely to be "noise" and as a consequence can have aberrantly high "M" ratios. In addition we only included shRNAs if their ratio ($M=2\log \text{ratio cy5/cy3}$) was >0.75 , this effectively means the top 100 most enriched shRNAs on the micro-array.

To shorten the list of shRNA vectors to be validated, we first asked where shRNA vectors targeting known components of the p53 pathway were positioned in the top 100. In total, five shRNA vectors targeting known components of the p53 pathway were present in the top 100 and their distribution was as follows (Table 1): one shRNA vector targeting *p53* (position #8), two shRNA vectors targeting *p21^{cip1}* (#7 & #37) and two shRNA vectors targeting *53BP1* (#5 & #36). As we identified shRNA vectors targeting *53BP1* and *p21^{cip1}* at positions 36 and 37 on the hit list, we decided to individually test all shRNA vectors on positions 1-37 in a second round selection. Included in this set are vectors targeting 3 out of 5 genes that were previously identified and validated by Berns et al., (2004): *HDAC4* (#2) *KIA0828* (#13),

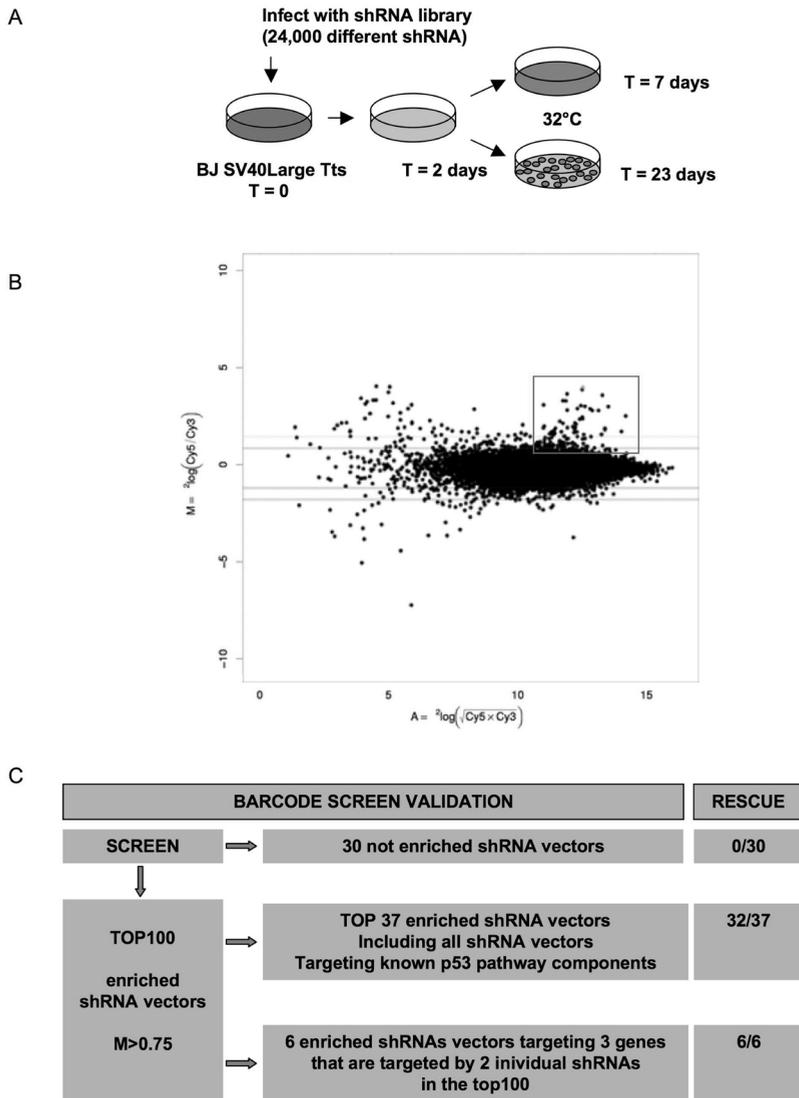


Figure 1

shRNA barcode screen identifies mediators of the p53 dependent cell cycle arrest.

- Schematic outline of the BJtsLT genetic screen. BJtsLT cells were infected with the NK1 shRNA library and were either left at 32°C or shifted to 39°C. After 7 days the cells at 32°C had reached confluency and were harvested. Cells at 39°C were harvested after 23 days after which they had formed visible colonies.
- Analysis of the relative abundance of shRNAs recovered from the BJtsLT barcode experiment. Data are normalized and plotted as M , the $2\log(\text{ratio Cy5}/\text{Cy3})$, versus A ($2\log(\sqrt{\text{intensity Cy3} \times \text{Cy5}})$). The data are the average of two independent hybridization experiments performed in duplicate with reversed colour. A box is drawn around the top 100 enriched shRNAs at 39°C.
- Schematic overview of selection criteria used to select hits from the shRNA barcode screen for further validation.

Rank	M	A	Rescue	HUGO	RefSeq	19mer_start	19mer_sequence	Remarks
1	4.07	12.24	+	KCNK9	NM_016601	217	GTACAACATCAGCAGCGAG	
2	3.95	12.22	+	HDAC4	NM_006037	3751	GCATGTGTTTCTGCCTTCG	Berns et al
3	3.73	11.65	+	ABHD6	NM_020676	374	GGATATGGCTCAGTGTG	
4	3.67	12.98	+	MYCL1	NM_005376	933	GAGACTCCAAACCTGAA	
5	3.39	11.49	+	TP53BP1	NM_005657	657	GATACTGCCTCATCACAGT	Known p53 pathway
6	3.39	11.60	+	XRCC1	NM_006297	258	GGAGGAGCAGATACACAGT	
7	3.18	10.76	+	CDKN1A	NM_078467	919	CTAGGCGGTTGAATGAGAG	Known p53 pathway
8	3.14	12.17	+	TP53	NM_000546	1026	GACTCCAGTGTAATCTAC	Known p53 pathway
9	3.09	13.20	+	CALCA	NM_001741	428	AGGGATATGTCACGCGACT	
10	3.00	12.03	+	RBCK1	NM_031229	1389	GTCAGTACCAGCAGCGGAA	this manuscript
11	2.99	12.52	+	INSRR	J05046	2402	GAACAGTGTCTTCTGCCG	
12	2.92	11.65	+	SSR4	NM_006280	377	GAGTCTACAGCCTCCTCA	
13	2.91	12.60	+	KIAA0828	NM_015328	3945	GAGTACATTCTGCCTTGT	Berns et al
14	2.91	12.83	+	PTPRN2	NM_002847	2968	GAGATTGATATCGCAGCGA	
15	2.63	13.86	+	TCEAL1	NM_004780	386	GGACCTGTTGAGGTTCCG	
16	2.56	12.22	+	LHX3	AF156888	266	GTGTCTAAGTGACGCGAC	
17	2.47	12.12	+	NR2E3	AF148128	852	GTGGGCCAAGAACCTGCCT	
18	2.35	11.37	+	LOC90925	BC002792	226	AGAACTGGAGTGGATGGGG	
19	2.28	11.94	+	MPZ	NM_000530	793	GGATAAGAAATAGCGGTTA	
20	2.26	11.49	+	NR2E3	NM_014249	889	GTGGGCCAAGAACCTGCCT	
21	2.21	11.98	+	PENK	NM_006211	779	GATACGGAGGATTATGAG	
22	2.12	10.78	+	SLIT2	NM_004787	490	AGAGGAGCATTCCAGGATC	
23	2.09	11.87	+	TRAR3	NM_175057	52	GTGAACGAATCCTGCATTA	
24	2.04	11.66	-	CDKN2A	NM_000077	745	GAACCAGAGAGGCTCTGAG	
25	2.04	11.96	+	HTATIP	NM_006388	1045	GTACGGCCGTAGTCTCAAG	Berns et al
26	2.02	11.21	+	PRPF18	NM_003675	228	AGAGGAGGACCAAAACCA	
27	2.02	11.93	-	GOLGA5	NM_005113	2209	GATACCCCATAGCGCGAGT	
28	2.01	13.08	-	TIEG	NM_005655	2179	GAATTGGAATCCTCCTTAA	
29	1.97	11.92	-	COL12A1	NM_004370	1844	GGATGCCGTTCGCTCAGAA	
30	1.94	13.07	+	RAD51C	NM_058216	263	GATATGCTGTACATCTGA	
31	1.85	13.70	-	TLR4	NM_003266	2180	GACCATCTTGTGTGTGCG	
32	1.83	11.43	+	RAB2	NM_002865	725	GAAGGAGTCTTGACATTA	
33	1.83	11.05	+	ZNF347	NM_032584	387	GAGTAATACAGGAGAAGTA	
34	1.82	12.01	+	HSD17B4	NM_000414	142	AGAGGAGCGTTAGTGTGTG	
35	1.80	11.91	-	GCGR	NM_000160	547	AGTGCAACACCCGCTCGTG	
36	1.75	11.19	+	TP53BP1	NM_005657	387	GAACGAGGAGACGGTAATA	Known p53 pathway
37	1.72	11.09	+	CDKN1A	NM_078467	560	GACCATGTGGACCTGTAC	Known p53 pathway
40	1.67	11.13	+	RP56KA6	NM_014496		GATTATCCAAGAGGTTCT	Berns et al
46	1.49	10.96	+	RBCK1	NM_031229	710	GGGGATGAACAGGTGGCAA	this manuscript
51	1.31	10.57	+	TNIP1	NM_006058	1718	GGAAAGAGCTGAAGAAGCAA	this manuscript
59	1.23	11.67	+	TNIP1	NM_006058	408	GAGTCCCAGATGGAAGCGA	this manuscript
74	1.00	10.42	+	ARNTL	NM_001178	1468	GAACTCTAGGCACATCGT	this manuscript
99	0.76	11.55	+	ARNTL	NM_001178	590	GGGAAGCTCACAGTCAGAT	this manuscript

Under rescue; + means a validated shRNA, - means not validated. *M* indicates the ²log (ratio Cy5/Cy3), *A* the ²log₁₀(intensity Cy3×Cy5).
doi:10.1371/journal.pone.0004798.t001

Table 1

List of genes targeted by shRNA vectors that were selected by the criteria as in figure 1c.

HTATIP (#25). The identification of these shRNA vectors provides further support for the notion that the barcode method enables both fast and reliable screening of shRNA libraries.

In addition, we selected 3 genes that were represented by two independent shRNAs in the top 100 (of which one is present in the 37 already selected shRNAs), bringing the total number of shRNAs to be tested to 42. We included these 3

additional genes in the validation, because if two independent shRNAs targeting the same transcript are enriched in the shRNA screen, this gives higher level of confidence to that specific hit. This is because it is less likely to be “off target” when two independent shRNAs yield the same phenotype and such off target effects of shRNAs are a common problem in these types of genetic screens [18,19]. The other three genes, *ARNTL* [20], *RBCK1* [21] and *TNIP1* [22] have not been linked to p53 before.

To prove that the shRNA barcode technique specifically identifies shRNAs that are enriched in the experiment we also tested 30 randomly-selected shRNAs not enriched in the experiment. All shRNAs were re-tested in the

BJtsLT cells. Cells were infected with individual shRNAs, shifted to 39°C and incubated for 3 weeks. When colonies were observed the cells were fixed and stained. As expected, none of the 30 randomly-selected shRNAs was able to produce colonies at 39°C (data not shown). However, for 37 of the 42 enriched shRNA vectors, we could clearly demonstrate that they allowed the cells to proliferate at 39°C. Among the genes targeted by these 37 shRNA vectors were all known p53 pathway components. In addition, we also observed rescue of growth arrest by all three genes that were targeted by two individual shRNAs: *ARNTL*, *RBCK1* and *TNIP1* (Figure 2). Therefore we decided to focus on these three newly identified genes for which we identified two independent shRNAs.

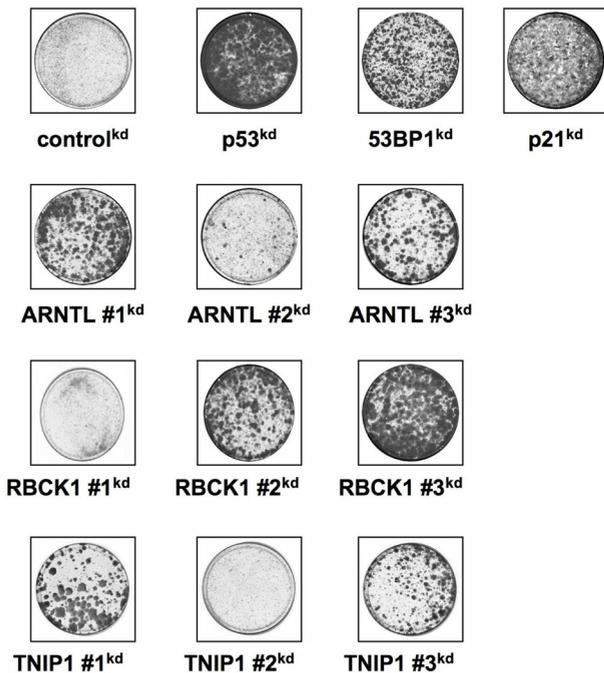


Figure 2
Colony formation ARNTL, RBCK1 and TNIP1 shRNA vectors.

Cells were infected with shRNA vectors targeting ARNTL, RBCK1 and TNIP1 and control shRNA vectors targeting GFP, p53, 53BP1 and p21. Cells were infected at 32°C and shifted to 39°C 2 days after infection. After three weeks culture at 39°C, the cells were fixed and stained.

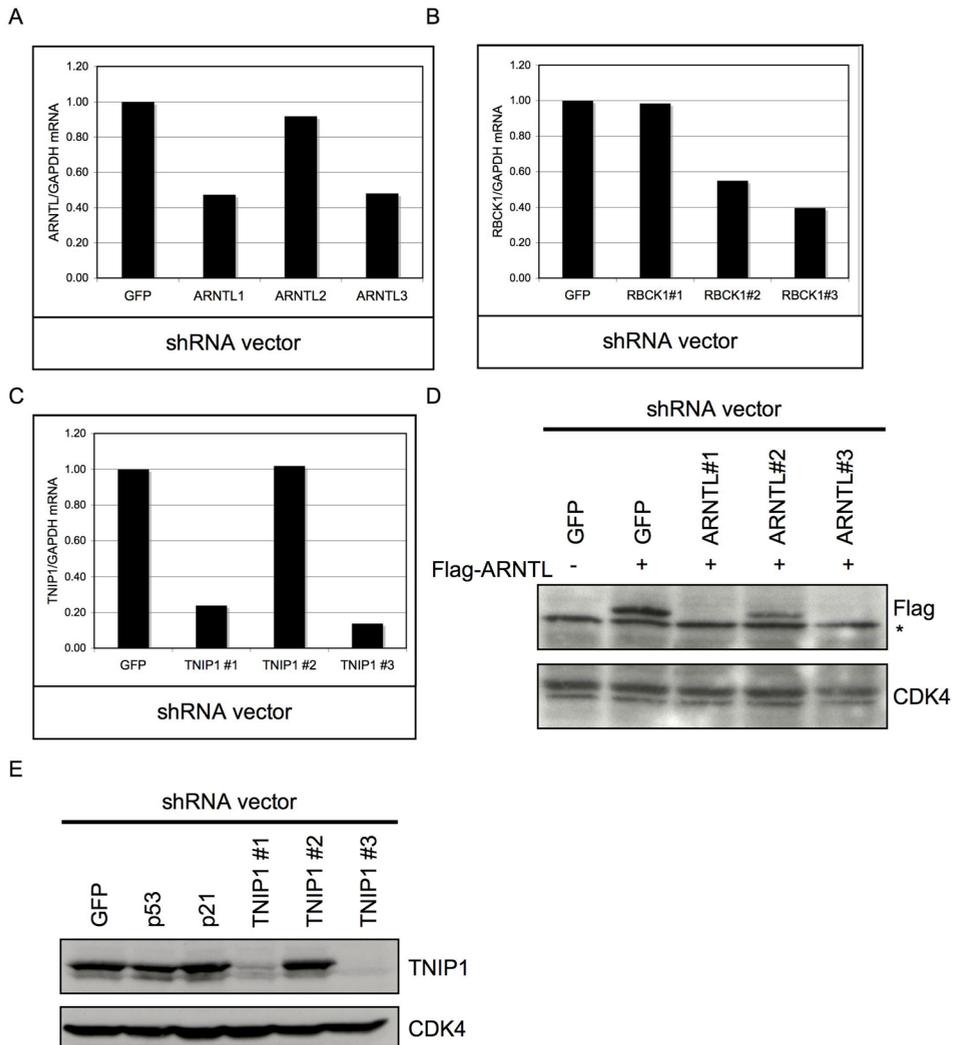


Figure 3

Barcode identified shRNA vectors suppress protein and mRNA levels of their targets.

- QRT-PCR for ARNTL in BJtsLT cells. BJtsLT cells were infected with indicated shRNA vectors. Samples for RNA isolation were taken 8 days after shift to 39°C.
- QRT-PCR for RBCK1 in BJtsLT cells. BJtsLT cells were infected with indicated shRNA vectors. Samples for RNA isolation were taken 8 days after shift to 39°C.
- QRT-PCR for TNIP1 in BJtsLT cells. BJtsLT cells were infected with indicated shRNA vectors. Samples for RNA isolation were taken 8 days after shift to 39°C.
- Flag-ARNTL together with the shRNA vectors targeting ARNTL were transiently transfected in Phoenix cells. Extracts were immunoblotted using Flag and CDK4 (control) antibodies.
- BJ cells were infected with the indicated shRNA vectors and Extracts were immunoblotted using TNIP and CDK4 (control) antibodies.

To show the sensitivity and selectivity of the shRNA barcode technique, we decided to test all three shRNA vectors targeting *ARNTL*, *RBCK1* and *TNIP1* that are present in the library. As mentioned before, for these three genes we found only two of the three shRNAs to be enriched in the screen, whereas one shRNA vector was not enriched. When we infected all three shRNA vectors independently into BJtsLT cells we found that only shRNAs enriched in the shRNA barcode screen gave rise to colonies (Figure 2).

Knockdown of target genes by shRNA vectors

Next, we investigated if the shRNA vectors targeting *ARNTL*, *TNIP1* and *RBCK1* also reduced mRNA levels of their cognate target genes. BJtsLT cells were infected at 32°C and shifted to 39°C 3 days after infection. When colonies appeared, RNA was isolated and subjected to quantification by QRT-PCR. The result from the QRT-PCR showed that enriched shRNA vectors targeting *ARNTL*, *RBCK1* and *TNIP1* were more potent in decreasing target mRNA than the shRNA vectors that were not enriched (Figure 3a, 3b, 3c). In addition, we tested for both *ARNTL* and *TNIP1* if protein levels were also affected by the shRNA vectors. For *ARNTL* we co-expressed the three shRNA vectors together with a cDNA encoding hARNTL in Phoenix cells. From the western blot analysis it was clear that only the vectors that could produce colonies also induced potent knockdown of protein expression, thus linking

gene knockdown to the p53 growth arrest bypass phenotype (Figure 3d). Knockdown of *TNIP1* was determined by analyzing endogenous protein levels in BJtsLT cells (Figure 3e). As can be seen only the vectors that are enriched in the barcode screen and validated to enable colony growth at 39°C were able to reduce endogenous *TNIP1* protein levels. We conclude that by limiting the hit selection to genes that are targeted by two independent shRNAs we have only selected 'on-target' hits from a complex library.

Knockdown of *ARNTL*, *RBCK1* and *TNIP1* in BJtsLT cells leads to reduced *p21^{CIP1}* levels

p21^{CIP1} is one of the critical effectors of p53 to induce a cell cycle arrest [23]. This is further supported by our identification of two shRNAs targeting *p21^{CIP1}* in the list of outliers of the BJtsLT screen. We therefore examined the effect of knockdown of *ARNTL*, *RBCK1* and *TNIP1* on *p21^{CIP1}* induction. We tested the effects on *p21^{CIP1}* in the BJtsLT system that we used for the initial screen. When BJtsLT cells are shifted to 39°C, a rapid increase in *p21^{CIP1}* protein levels is observed (Figure 4a). As expected, this *p21^{CIP1}* induction is attenuated in cells infected with shRNA vectors targeting *p53*, *p21^{CIP1}* or *53BP1* (Figure 4a). When we used shRNA vectors targeting *ARNTL*, *RBCK1* and *TNIP1* we observed a decrease in *p21^{CIP1}* levels for those shRNA vectors that produced colonies at 39°C, but not for shRNA vectors that failed to produce colonies (Figure 4a-c).

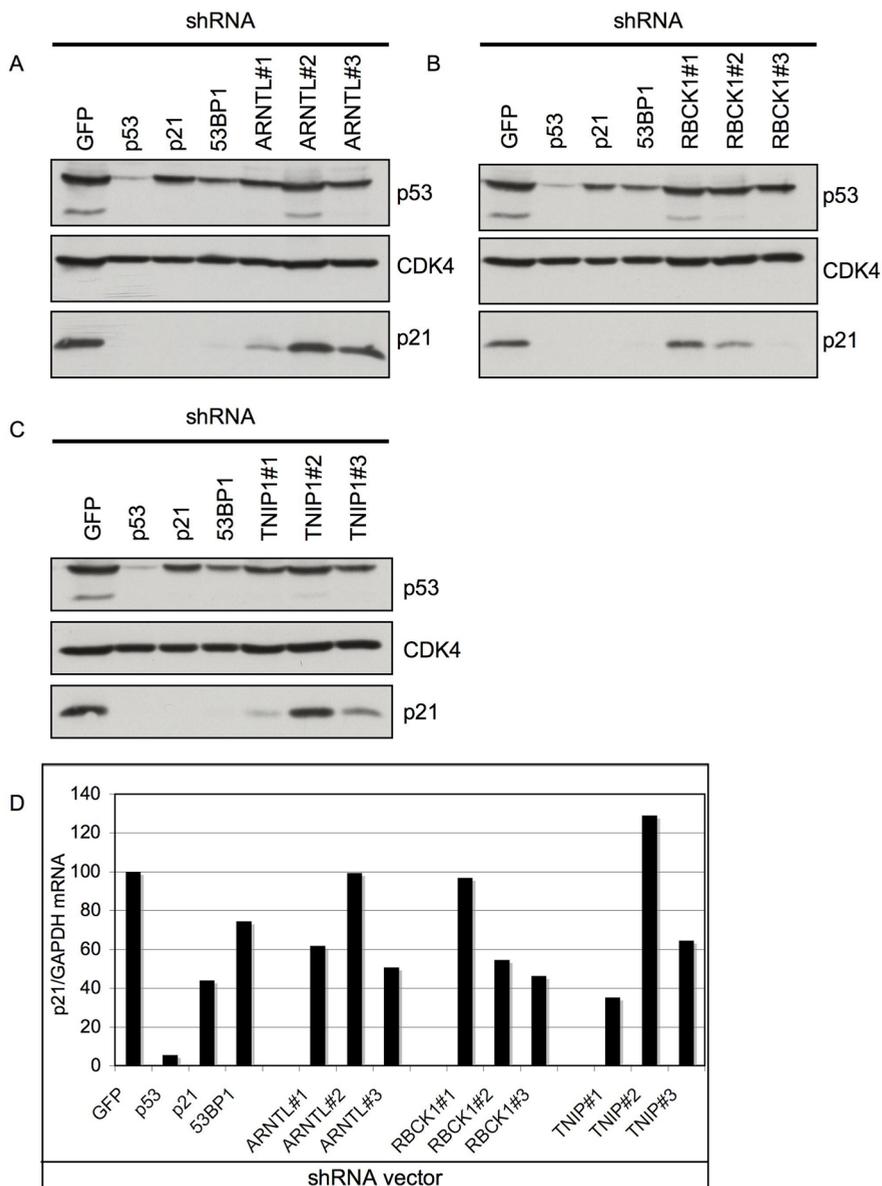


Figure 4

Knockdown of ARNTL, TNIP1 and RBCK1 prevents p21^{CIP1} induction in BJtsLT cells

BJtsLT cells were infected at 32°C and shifted to 39°C for colony formation. After 14 days of culturing at 39°C cells were harvested, protein lysates were prepared and subjected to western blot for p53, CDK4 (control) and p21^{CIP1} (Figure 4a-c). Additionally, total RNA was isolated and used for QRT-PCR for p21^{CIP1} (Figure 4d).

To be sure that the decrease in p21^{CIP1} protein levels were caused by decreased p21^{CIP1} transcription we also measured p21^{CIP1} mRNA levels by QRT-PCR (Figure 4d). All shRNAs that could produce colonies at 39°C also showed a decrease in p21^{CIP1} mRNA. This result suggests that the knockdown of ARNTL, RBCK1 and TNIP1 leads to a decreased transcriptional activity of p53 towards its target p21^{CIP1}. Recently multiple reports have discussed the relationship between cancer and circadian rhythm [24-26]. ARNTL is a core component of circadian rhythm transcriptional machinery [20,27]. ARNTL binds to CLOCK and together they regulate expression of 1,000s of genes in a circadian timing [28,29]. Genes regulated in a circadian fashion are involved in cell cycle, detoxification and other processes [30]. Therefore we decided to test if ARNTL is involved in the regulation of p21^{CIP1} expression in other cell systems.

Reduced p21^{CIP1} activation after DNA damage in HCT116 cells with ARNTL knockdown

Normal human cells arrest either in G1 or S phase of the cell cycle after encountering DNA damage to repair the DNA, thereby preventing accumulation of mutations in the genome of daughter cells. The G1 phase cell cycle arrest is p53 dependent and mainly executed by the CDK inhibitor p21^{CIP1} [31,32]. To investigate if ARNTL is also required for the p21^{CIP1} activation after DNA damage, we infected U2OS osteosarcoma derived cells with different shRNAs targeting ARNTL. The cells were incubated

to allow knockdown to take effect, after which cells were irradiated to inflict DNA damage and monitored for p21^{CIP1} activation. When we compared cells that were infected with a shRNA vector targeting p53 to cells infected with a control shRNA vector, we observed lower p53 and p21^{CIP1} levels after γ -radiation. In the cells infected with ARNTL knockdown vectors we also observed lower p21^{CIP1} protein levels, but p53 protein levels were unaffected (Figure 5a). This observation suggests that ARNTL can modulate the activity of p53 towards its target p21^{CIP1}. However, we cannot distinguish between a specific effect of ARNTL on p21^{CIP1} and a more general effect of ARNTL on p53 transcriptional activity.

ARNTL knockdown also allows bypass a p19^{ARF} induced growth arrest

As the BJTsLT cells are quite artificial due to the presence of the SV40 T viral oncogene, we also investigated if ARNTL knockdown could bypass a more physiological p53-induced cell cycle arrest. To address this, we used cells in which we can activate p53 by over-expression of p19^{ARF}. p19^{ARF} inhibits MDM2 function thereby leading to an increase of p53 protein and activation of target genes [33]. Activation of p19^{ARF} leads to a stable p53-dependent cell cycle arrest [34]. To test if ARNTL knockdown can also rescue a p19^{ARF}-induced cell cycle arrest, we infected U2OS cells with the shRNAs targeting ARNTL. After knockdown had taken effect the cells were super-infected with a p19^{ARF} encoding

retrovirus. We observed that cells with knockdown of *p53* or *p21^{CIP1}* continue proliferation after the forced expression of *p19^{ARF}* (Figure 5b), knockdown of ARNTL also allows cells to proliferate after *p53* activation by *p19^{ARF}* (for knockdown see figure 5c). This result suggests that ARNTL expression is required for the anti-proliferative response of *p19^{ARF}* activation. When ARNTL levels are low, the cells escape this arrest.

p53 independent p21^{CIP1} activation does not require ARNTL

The results described above suggest a role for ARNTL in the regulation of *p21^{CIP1}* expression by *p53*. However they do not rule out that ARNTL controls *p21^{CIP1}* activation in a general fashion, independent of *p53*. To test this possibility we made use of small molecule HDAC inhibitors (HDACi). These HDACi cause induction of *p21^{CIP1}*

in both a *p53* dependent and *p53* independent manner [35-38]. In order to study the effect of ARNTL on *p53* independent activation of *p21^{CIP1}*, we made use of a HCT116 *p53* knockout cell-line (HCT116 *p53*^{-/-}) and the HDACi PXD101 (Belinostat®) [32]. When these HCT116 *p53*^{-/-} cells are treated with PXD-101, a strong induction of *p21^{CIP1}* is observed (Fig 5d and e). HCT116 *p53*^{-/-} cells infected with a shRNA vector against *p21^{CIP1}* show reduced *p21^{CIP1}* protein levels after PXD-101 treatment. However, cells infected with a shRNA targeting ARNTL do not show any alteration in the induction of *p21^{CIP1}* protein levels following HDACi treatment. Thus the *p53*-independent induction of *p21^{CIP1}* by HDACi is not dependent on ARNTL. From this we conclude that ARNTL is not generally required for *p21^{CIP1}* induction, but does affect the capacity of *p53* to activate *p21^{CIP1}* expression.

Discussion

The screening of large-scale RNAi libraries has been used increasingly over the last years to identify the specific functions of genes in cellular pathways, networks and mechanisms. Here we describe the screening of a complex RNAi library to identify genes that were previously unknown to regulate a *p53*-dependent cell cycle arrest.

We have used the RNAi barcode technique to screen a human shRNA library containing ~24,000 vectors targeting ~8,000 genes. Using this approach, we were able to rapidly identify

shRNAs that allow bypass of a *p53* dependent cell cycle arrest. In total we confirmed that 32 out of the 37 genes that were identified by the barcode screen could indeed prevent cells from entering into a *p53* dependent cell cycle arrest. However, only 5 of these 32 genes were targeted by two independent shRNAs. Two out of these five genes (*TP53BP1* and *p21^{CIP1}*) are well-known to be involved in *p53* signaling. However the other three genes (*TNIP1*, *RBCK1* and *ARNTL*) were previously not known to be involved in the *p53* pathway.

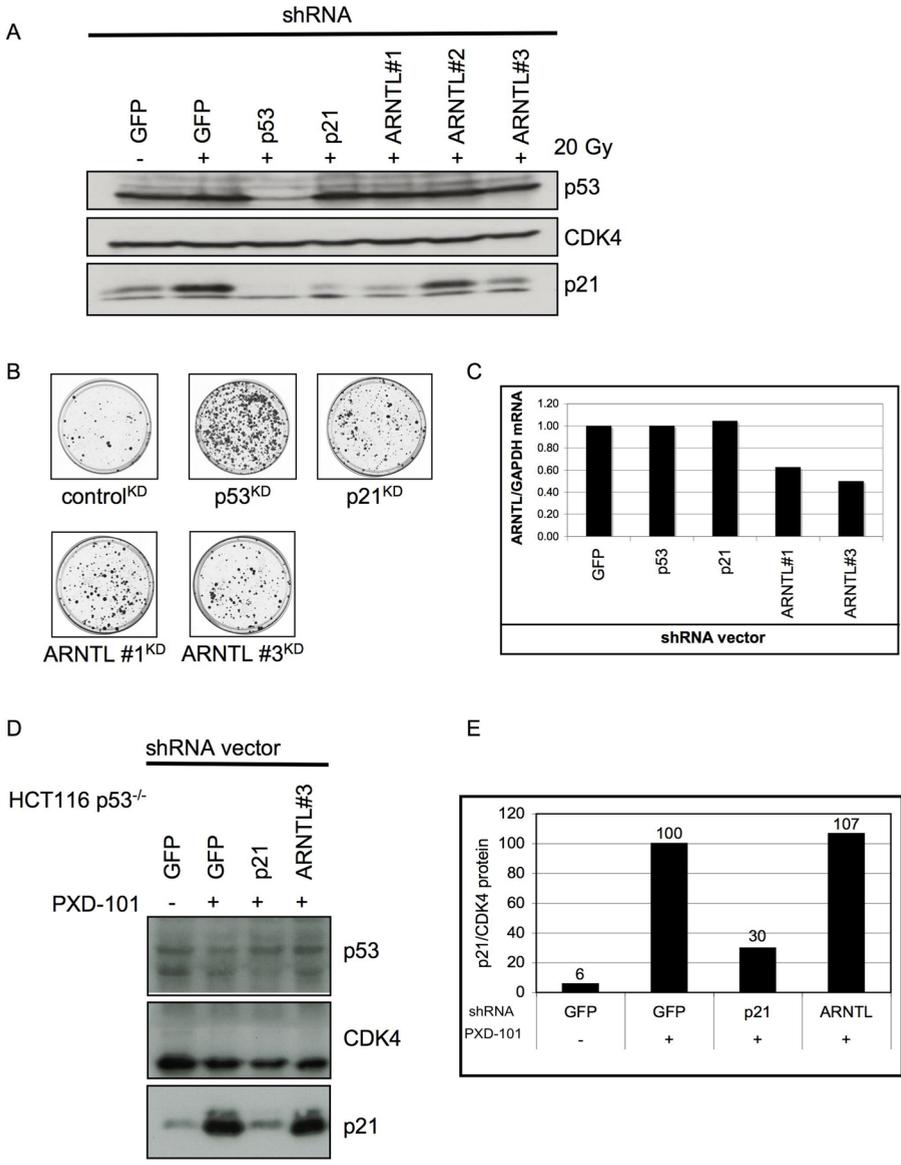
The three newly identified genes all affect the induction of the p53 target gene *p21^{CIP1}* but no change in p53 protein stability is observed after ARNTL, TNIP1 or RBCK1 knockdown. Importantly, *p21^{CIP1}* knockdown alone is sufficient to rescue cells from the p53 induced cell cycle arrest. This observation indicates that the rescue of the p53 induced cell cycle arrest by ARNTL, RBCK1 or TNIP1 knockdown is the result of a lack of *p21^{CIP1}* induction by p53.

The activity of p53 has been mainly attributed to its role as transcription factor with tumor suppressive capacities. Therefore, we assessed if any of the genes identified in our screen had been linked to transcription before. TNIP1 was originally identified as an inhibitor of NF- κ B signaling [22,39]. Although it was shown that TNIP1 over-expression inhibits the transcriptional activity of the NF- κ B heterodimer it is believed that this is an indirect effect through an currently unknown mechanism. The ubiquitin E3 ligase RBCK1 has been reported to regulate and ubiquitinate several proteins [21,40-42]. Although experiments have been performed that suggest a role for RBCK1 in transcription [43] a clear role for RBCK1 in regulating transcription has not been reported up till now. This picture is different for ARNTL which is known to be the central transcription factor in regulating circadian rhythm. The critical role of ARNTL in circadian rhythm was demonstrated by the construction of the knockout mouse. Mice that are deficient for *ARNTL*

are unable to maintain a circadian rhythm in constant darkness [20]. In addition, the *ARNTL* knockout mouse also suffers from premature aging [44]. In recent years, many other processes have been shown to be regulated in a circadian fashion. Most importantly it was shown that the mammalian cell cycle is controlled by circadian rhythm [45]. The possible involvement of circadian rhythm in cancer results from studies of the Period 2 knockout mouse. This mouse is prone to develop tumors after radiation. Later it was shown that also the Period 1 protein can regulate cell cycle checkpoints [24-26]. Interestingly both Period 1 and 2 are bona-fide transcriptional targets of ARNTL.

For the induction of target genes ARNTL must form a heterodimer with the CLOCK protein [28]. Target genes of the CLOCK/ARNTL heterodimer include the *Period 1, 2 and 3* and Cryptochromes (*Cry 1 & 2*) [46]. The increased abundance of Period and Cryptochrome proteins [47] induces a negative feedback loop that ultimately shuts down transcription by the CLOCK/ARTNL heterodimer. When the concentration of Period and Cryptochrome decreases due to proteasomal degradation the CLOCK/ARNTL complex can initiate another round of transcription thereby completing a cycle of circadian rhythm.

Another transcriptional target of the CLOCK/ARNTL is the CDK inhibitor *p21^{CIP1}* which is also regulated in a circadian manner [48]. We show here that *ARNTL* knockdown in



human cells can abrogate induction of $p21^{CIP1}$ after p53 activation and overrides a p53-dependent cell cycle arrest. The effect on the induction of $p21^{CIP1}$ is in contrast with previous reports on the $p21^{CIP1}$ regulation in *ARNTL* knockout mice [48]. In these animals *ARNTL* is required for the circadian expression of $p21^{CIP1}$. This discrepancy might be explained by differential regulation of the $p21^{CIP1}$ promoter in mice or man. In particular, this difference may arise from stress signals differences from *in vitro* versus *in vivo* conditions. Nevertheless, our data clearly indicate that there is a link between the regulation of circadian rhythm and the control of p53 activity in human cells.

Conclusions

By screening a large scale RNAi library in human cells we have identified three novel genes that can regulate p53 function. Loss of expression for each of three genes results in a decreased ability of p53 to activate $p21^{CIP1}$ expression. Importantly, we showed that *ARNTL* is required for the p53-dependent induction of $p21^{CIP1}$ in two additional cell types using different ways to activate p53: a $p19^{ARF}$ -induced cell cycle arrest and a DNA damage mediated cell cycle arrest. We conclude that *ARNTL* suppression affects the ability of p53 to induce a cell cycle arrest upon cellular stress signals such as DNA damage.

Figure 5

ARNTL regulates $p21^{CIP1}$ expression.

- a) Knockdown of *ARNTL* inhibits radiation induced $p21^{CIP1}$ induction. U2OS cells were infected with the shRNA vectors as indicated. Cells were seeded and irradiated with 20 Gy of γ -radiation. After o/n incubation cells were lysed and lysates were subjected to western blot using antibodies for p53, CDK4 (control) and $p21^{CIP1}$.
- b) Knockdown of *ARNTL* can also rescue a $p19$ -induced cell cycle arrest. U2OS cells were infected with the indicated shRNA vectors followed by a super-infection with $p19^{ARF}$ -RFP virus. Cells were seeded and incubated for three weeks. After three weeks the infected cells were fixed and stained.
- c) Knockdown of *ARNTL* in U2OS cells (Fig 5b) was quantified by QRT-PCR.
- d) *ARNTL* knockdown is not involved in p53 independent $p21^{CIP1}$ induction. HCT116 wt and p53^{-/-} cells were infected with knockdown vectors targeting p53, $p21^{CIP1}$ and *ARNTL*. Cells were treated with 0.5 μ M PXD101 for 16 hrs. Cells were then lysed and lysates were subjected to western analysis for p53, CDK4 (control) and $p21^{CIP1}$.
- e) Quantification of p21 protein levels in the western blot in figure 5c using IMAGE J software.

Materials & methods

Cell lines & culture conditions

BJtsLT cells were cultured in medium that consisted of DMEM 75% / M199 25% supplemented with 10% FCS, Penicillin and Glutamine. BJtsLT cells were cultured at 32°C in 5% CO₂. U2OS and Phoenix cells were cultured in DMEM supplemented with 10% FCS, Penicillin and Glutamine. U2OS and Phoenix cells were cultured at 37°C in 5% CO₂.

Plasmids and library

Expression plasmid for ARNTL was generated by PCR from a cDNA library and subsequent cloning the PCR product into pCR3-Flag. The P19-RFP construct was described previously [11]. The construction of the library was described previously [11]. Briefly, the NKI shRNA library was designed to target 7914 human genes, using three shRNA vectors for every targeted gene, cumulating in a total of 23,742 shRNA vectors. The shRNAs are cloned into a retroviral vector to enable infection of target cells.

Retroviral infection

Phoenix cells were transfected using calcium phosphate method. Viral supernatant was cleared through a 0.45 µm filter. Cells were infected with the viral supernatant in presence of polybrene (8 µg/ml). The infection was repeated twice.

shRNA barcode screen

To screen the NKI shRNA library we reasoned that we would need 100 fold coverage of the library to get a good representation of all 23,742 shRNA vectors present

in the library. BJtsLT cells were infected with the NKI shRNA library. Two days after infection cells were plated at 150,000 cells/15 cm dish. In total 2 x 10⁶ cells were shifted to 39°C, equal number of cells were kept at 32°C. Cells at 32°C were harvested after 5 days. Cells at 39°C were harvested at 21 days after shift. From both populations gDNA was isolated using DNAzol (Invitrogen). The shRNA cassettes were amplified by PCR. The PCR product was used for *in vitro* RNA synthesis. RNA was labeled with Cy3 or Cy5 (Kreatech) and hybridized on a microarray. Quantification of the resulting fluorescent images was performed with Imagen 5.6 (BioDiscovery), local background was subtracted, and the data were normalized and 2log transformed. Additional information on barcode screens can be found at <http://www.screeninc.nl>.

Colony formation assay

Cells were infected with retroviral supernatant. Two days after infection the cells were seeded at 50,000/10 cm dish and shifted to 39°C. Cells were cultured at 39°C for approx 21 days. When colonies appeared cells were fixed in MeOH/HAc (3:1) and subsequently stained (50% MeOH/10% HAc/0.1% Coomassie).

Western blotting

Cell lysates were separated using 10% SDS-PAAGE. Proteins were transferred to PVDF membrane and incubated with primary antibody as indicated. Primary antibodies were

detected using a secondary HRP-conjugated antibody. Antibodies used for these studies: Flag (M2; Sigma), TNIP1 (1A11E3; Zymed), CDK4 (C-22; Santa Cruz), p53 (DO-1; Santa Cruz) and p21^{CIP1} (C-19; Santa Cruz).

QRT-PCR

Total RNA was isolated using TRIzol (Invitrogen). From the total RNA cDNA was generated using Superscript II (Invitrogen) using random primers (Invitrogen). cDNA was diluted and QRT reaction was performed using Taqman probes (Applied Biosystems). All QRT reactions were run in parallel for GAPDH to control of for input cDNA. The QRT reactions were run at a

AB7500 Fast Real Time PCR system (Applied Biosystems). Results shown are a representative of three independent experiments.

p21^{CIP1} induction by γ -radiation and PXD101

For the p21^{CIP1} induction by radiation 50,000 cells were seeded per 6-well. HCT116 p53^{-/-} cells were irradiated with 20 Gy γ -radiation from a Cs-137 source. Cells were incubated for 16 hrs and lysed. For the p21^{CIP1} induction by PXD101 50,000 cells were seeded/6-well and treated with 0.5 μ M PXD101 for 16 hrs after which the cells were lysed and protein lysates were subjected to western analysis.

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Author contributions

JM and AWMF performed the experiments, wrote the manuscript. MM performed the microarray hybridizations. RB and RLB supervised the research and corrected the manuscript.

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CHAPTER V

Candidate biomarkers of response to an experimental cancer drug identified through a large-scale RNA interference screen

Candidate biomarkers of response to an experimental cancer drug identified through a large-scale RNA interference genetic screen.

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Purpose: A major impediment in the optimal selection of cancer patients for the most effective therapy is the lack of suitable biomarkers that foretell the patient's response to a given drug. In the present study, we have used large-scale RNA interference-based genetic screens to find candidate biomarkers of resistance to a new acyl sulfonamide derivative, R3200. This compound inhibits proliferation of tumor cells in vitro and in vivo, but its mechanism of action is unknown.

Experimental Design: We used a large scale RNA interference genetic screen to identify modulators of the efficacy of R3200. We searched for genes whose suppression in an in vitro cell system can cause resistance to the anti-cancer effects of R3200.

Results: We report here that knockdown of either RBX1 or DDB1 causes resistance to the anti cancer effects of R3200, raising the possibility that these two genes may have utility as biomarkers of response to this drug in a clinical setting. Interestingly, both RBX1 and DDB1 are part of an E3 ubiquitin ligase complex.

Conclusions: We propose that suppression of the activity of a RBX1 and DDB1-containing E3 ligase complex leads to the stabilization of certain proteins, whose increased abundance is in turn responsible for resistance to R3200. Moreover, our data suggest that RBX1 and DDB1 can potentially be developed into biomarkers of resistance to acyl sulfonamide-based cancer drugs. This will require clinical validation in a series of patients treated with R3200.

Introduction

Effective cancer therapy has been hampered by the absence of drugs that selectively target cancer cells. The identification and characterization of new compounds that potentially specifically kill cancer cells is therefore of major interest. Recently a new class of compounds was shown to be effective in inhibiting growth of cancer cells *in vitro* and *in vivo*: the acyl sulfonamides [1-4]. However, the efficacy of these acyl sulfonamides varies greatly, depending on the cell models used. This is in line with clinical observations that patients with comparable diagnosis can often respond very differently to the same treatment. Knowledge of whether a patient will respond to a drug is obviously of major importance for the selection of the most appropriate therapy for the individual patient. Responses to some drugs can be predicted using biomarkers [5, 6]. Identifying such biomarkers is not a trivial process and it would be greatly facilitated when the mechanism of action of the drug is well-understood.

Many different approaches can be taken to establish the mode of action of a drug and to identify drug response biomarkers. Recently, RNA interference (RNAi)-based genetic screens have demonstrated utility in the identification of drug response biomarkers [7-9]. RNAi screens can be performed in several different ways [10]. Single-well siRNA screens often make use of synthetic siRNAs. This usually requires complex automation, executed in high throughput. Due

to the short half life of siRNAs, this approach does not allow the selection of phenotypes in long-term assays. These drawbacks can be bypassed by using short hairpin RNAs (shRNA) to mediate stable gene knockdown. shRNA screening is efficient and requires minimal automation. Because shRNA screening makes use of retroviral shRNA vectors, both long- and short-term assays can be used for screening.

We have developed an shRNA library and have used this library to show that loss of PTEN confers resistance of *HER2*-amplified breast cancer cells to treatment with trastuzumab [9]. This observation suggested that the PI3K pathway, which is negatively regulated by PTEN, is a major determinant of trastuzumab efficacy, a notion that was validated in clinical samples from breast cancer patients treated with trastuzumab [9]. This observation shows that *in vitro* RNAi screens can yield biomarkers having clinical utility. Moreover, this information can then also be used to develop new drugs that target the pathways that cause drug resistance.

In this current approach we describe the anti cancer effects of a new acyl sulfonamide derivative, R3200. We show that this compound can actively block proliferation of tumor cells *in vitro* and *in vivo*. We describe here biochemical and genetic approaches to identify the molecular target(s) and potential biomarkers that predict responsiveness to this compound.

Results

In vitro analysis of anti-proliferative effects of R3200

It was shown previously that acyl sulfonamides have prominent anti-proliferative effects in cancer cell lines [1-4]. We have synthesized a novel acyl sulfonamide, R3200 (Fig. 1A). To assess if R3200 can inhibit proliferation in cell lines derived from human cancers, we used 29 cell lines to determine the

IC₅₀ (Table S1). Included in this panel were cell lines generated from breast, colon, prostate and pancreas tumors. Fetal Calf Serum (FCS) can significantly modulate the response to drug treatment of cells *in vitro* due to binding of acyl sulfonamides to (bovine) serum albumine. Therefore, we determined the IC₅₀ value both in cells cultured in regular conditions (10% FCS) and low concentration of FCS (2.5%). In both conditions

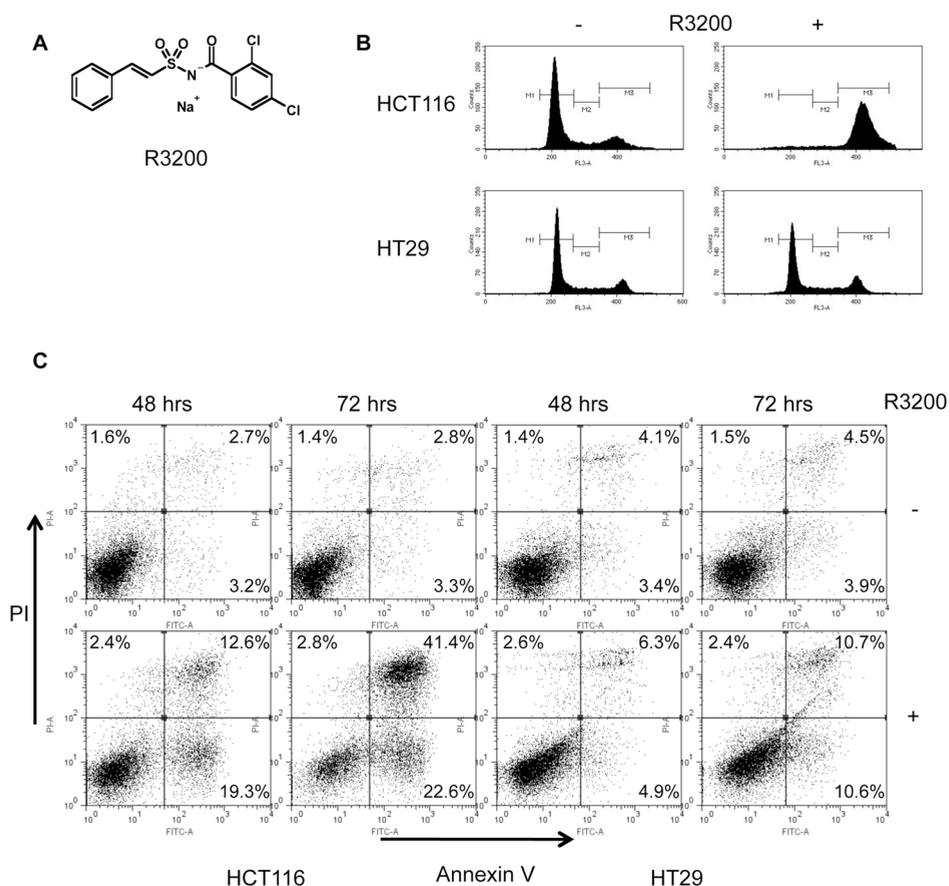


Figure 1

In vitro analysis of R3200 anti-proliferative actions.

Cell cycle analysis of HCT116 and HT-29 cells treated with 30 μ M R3200 (a) for 48 hrs. Cells were stained with PI and analyzed by FACS (b). Induction of apoptosis by R3200. FACS analysis of HCT116 and HT-29 cells treated with R3200 (30 μ M) for 48 or 72 hrs. Cells were stained with Annexin V and PI (c).

we observed a wide range of responses, which translated in IC₅₀ values ranging from 2.3 μM to > 100 μM in assays in medium with 2.5% FCS and 10.4 μM to > 100 μM in assays in medium with 10% FCS. For further *in vitro* studies we decided to use two colon cancer derived cell lines, a very sensitive cell line: HCT116 (IC₅₀ = 4.9 μM in 2.5% FCS) and a relative resistant cell line HT-29 (IC₅₀ = 71.6 μM in 2.5% FCS).

The anti-proliferative activity of the acyl sulfonamide R3200 is due to a cell cycle arrest followed by apoptosis

The anti-proliferative effects described above, could be caused by various effects of the drug, most notably apoptosis and cell cycle arrest. To address these issues, a cell cycle analysis was performed following treatment of cells with R3200. When HCT116 cells were exposed to 30 μM R3200 for 48 hours, we observed an increase in the G2/M cell cycle phase (Fig. 1B). Quantification of the results from cell cycle profile show that more than 80% of the HCT116 cells have accumulated in the G2/M phase of the cell cycle (Supplementary Figure S1). The FACS profile obtained from the HCT116 cells suggests that the cells have arrested either in the G2- or M-phase of the cell cycle, we

cannot exclude that the cells have undergone endo-reduplication of their genome and are arrested in the G1 phase of the next cell cycle with 4n DNA content. In the resistant HT-29 cell-line no cell cycle arrest was detected after treatment with R3200 (Fig. 1B) as expected.

R3200 induces apoptosis in human cancer cell lines

Many anti cancer drugs induce a cell cycle arrest in short term assays, but can also induces apoptosis after prolonged drug exposure. We subjected HCT116 and HT-29 cells to R3200 for 48 and 72 hours and stained the cells with annexin V/ PI to identify dead cells. Maximal effect was observed in HCT116 cells after 72 hrs of R3200 treatment (Fig. 1C). The amount of cells that was killed by the R3200 treatment was 64%. In HT-29 cells only a mild cell death was observed after 72 hours of treatment. The IC₅₀ of apoptosis induction in HCT116 cells determined after 72 hours of drug exposure was 35 μM, while for HT-29 cells no IC₅₀ could be determined.

Inhibitory activity in a drug-resistant cell line: Influence of P-glycoprotein

Many drugs have limited efficacy because they are substrates for P-glycoprotein (P-gp) drug

	P388 IC50 (μM)	P388/ADR IC50 (μM)	Difference n-fold
R3200	27.60	31.70	1.10
Taxol	0.08	4.40	55.00
Etoposide	0.14	> 10	> 71
Cisplatin	12.10	46.20	3.80
Nocodazol	0.01	0.03	2.80

Table 1
R3200 is not a substrate for P-gp drug transporters. Table lists IC50 values for wt P388 and P-gp over expressing P388/ADR cells (as indicated) treated with R3200.

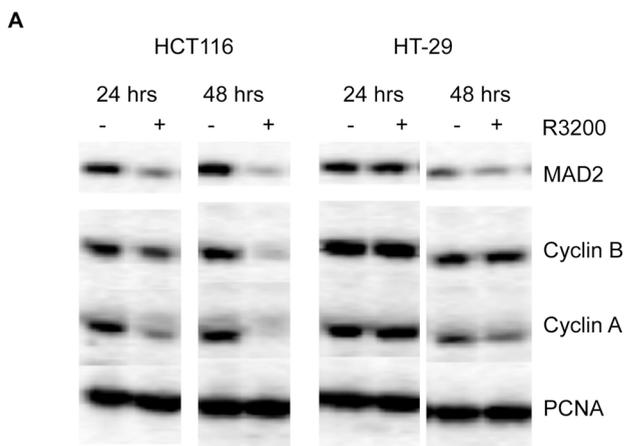
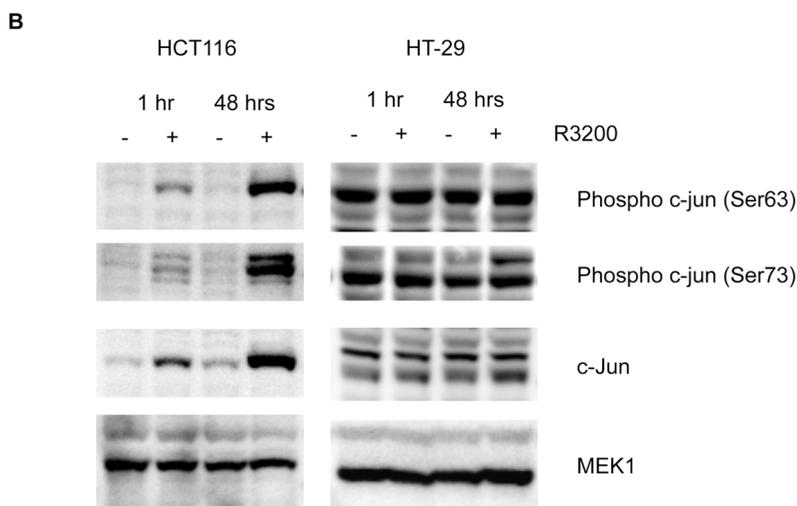


Figure 2
Analysis of cell cycle and stress induced proteins in R3200 treated HCT116 and HT-29 cells.

Western-blot analysis for cell cycle regulated proteins in HCT116 and HT-29 cells treated with R3200 (30 μ M) for 24 and 48 hrs (a). Western-blot analysis for c-Jun, phospho-S63 C-Jun and phospho-S73 c-Jun in HCT116 and HT-29 cells treated with R3200 (30 μ M) for 1 and 8 hrs (b).



resistance pumps [11, 12]. We therefore tested if R3200 is a substrate of P-gp ABC transporters. A mouse leukemia cell line P388 (parental, non/low expression of P-gp) and a derivative P388/ADR over-expressing the multidrug drug resistance pump P-gp encoded by the *ABCB1* gene were used to examine the influence of compounds on cell viability and proliferation. In these cells we determined the IC_{50} for R3200, taxol, etoposide,

nocodazole and cisplatin. In contrast to taxol and etoposide, which are P-gp substrates, R3200, which are P-gp substrates, R3200 showed nearly no difference in cell viability in both cell lines (Table 1). This suggests that R3200 is not transported by this P-gp drug pump.

R3200-induced changes in cell cycle proteins

Next we tested if the observed G2/M cell cycle arrest was also

accompanied by altered levels of cell cycle regulated proteins. We treated HT-29 and HCT116 cells with R3200 (30 μ M) for 24 and 48 hours and after lysis of the cells we detected the protein levels of cell cycle regulators by western blot analysis (Fig. 2A). In HCT116, but not in HT-29 cells, we observed a decrease in protein levels of Cyclin A, B and MAD2. This indicates that HCT116 cells are indeed inhibited

in their proliferation while HT-29 cells are unaffected by R3200 treatment.

To investigate if R3200 treatment activates cellular stress response pathways we measured c-Jun activation. We treated HCT116 cells with R3200 (30 μ M) for 1 and 8 hours. At both time points a clear induction of c-Jun protein was observed (Fig. 2B). A similar increase in levels of

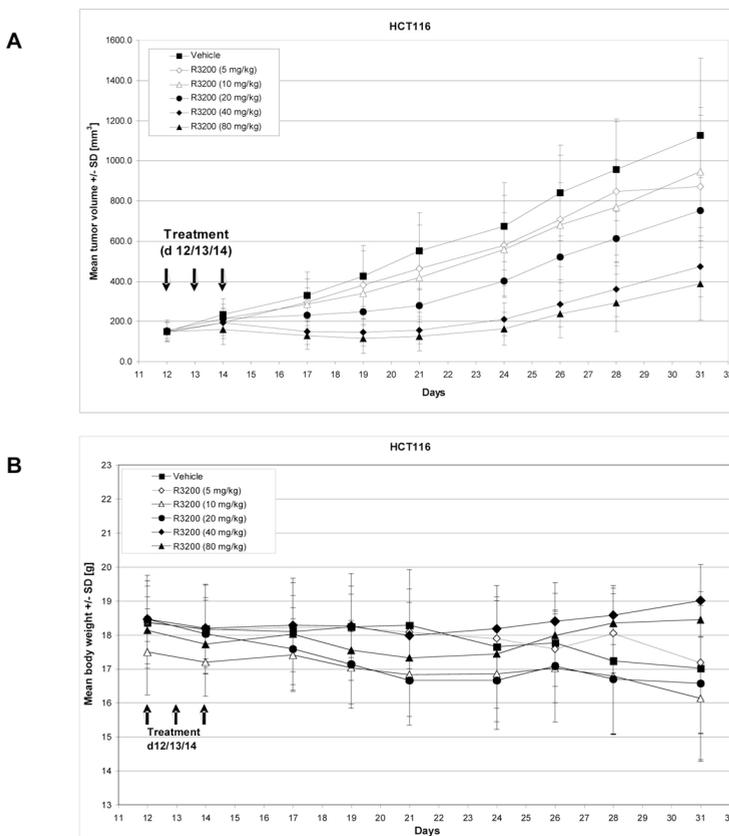


Figure 3

In vivo analysis of R3200 anti-proliferative actions towards human cancer cells.

A, xenograft of HCT116 cells in SCID beige mice. Tumor growth was measured as an increase of tumor volume (Y-axis) in time (X-axis). Injections with R3200 (black arrows). *B*, Body weight monitoring during R3200 treatment. Body weight was measured (Y-axis) over time (X-axis). Injections with R3200 (black arrows) are indicated on the X-axis.

phospho-c-Jun (pS63 and pS73) was seen, suggesting that c-Jun protein levels are induced rather than specific phosphorylation of the protein. This indicates that stress response pathways are activated by prolonged treatment of R3200 and this may explain some of the effects on cell cycle proteins seen after longer exposure to drug. In the HT-29 cells we did not observe any effect of R3200 on c-Jun or phospho-c-Jun protein levels (Fig. 2B).

In vivo anti-proliferative effects of R3200

To test whether the *in vitro* properties of R3200 translate into inhibition of tumor growth *in vivo*, the effect of R3200 on xenografts was assessed. R3200 induced acute toxicity in mice at doses exceeding 120 mg/kg (data not shown). Therefore, doses between 5 mg/kg and 80 mg/kg were chosen to assess the *in vivo* anti-cancer effects of R3200 in xenograft experiments using subcutaneously growing HCT116 tumors in immunodeficient SCID beige mice. The animals were randomized into 6 study groups containing 10 tumor-bearing mice each; treatment was started on day 12 after tumor cell injection, when the tumors had reached an average volume of ca. 150 mm³. Treatment consisted of 3 i.v. administrations on three consecutive days (i.e. days 12, 13 and 14 after tumor cell implantation). The tumor volume (Fig. 3A) and body weight (Fig. 3B) was observed until day 31 after tumor cell implantation.

Treatment with R3200 caused a marked, and clearly dose-

dependent, tumor growth inhibition which appeared to reach a plateau for the maximal anti-tumor effect at 40 mg/kg (Fig. 3A). In fact, R3200 treatment initially even led to tumor shrinkage, with the maximum occurring ca. 7 days after the first injection. At the same time, R3200 was tolerated well at all five doses and did not have a significant effect on body weight (Fig. 3B). Similarly, on day 31, the final day of the study, blood samples were taken from the animals and analyzed for hematological (red blood cell count, hemoglobin, packed cell volume, reticulocyte count, platelet count) and clinical chemistry (alanine-aminotransferase, creatinine, urea) parameters. In brief, no differences were found for any of the parameters when compared to the vehicle control animals; all values were in the range expected for SCID/beige mice (data not shown). To confirm the results obtained in the HCT116 model, the xenograft experiments were extended using 4 additional human xenograft models. Thus, in total, 3 of the models were originally derived from human colon carcinomas (HCT116, Colo-205 and SW620), and one each from an ovarian (IGROV-1) and a prostate (PC3) tumor. In all 5 xenografts significant tumor growth inhibition was observed in the mice treated with R3200 (Table S2). In addition, HCT116 tumors were also tested in a rat xenograft model. Similar to the mouse studies, also in this experiment a significant inhibition of tumor growth was observed (Table S2).

Biomarkers of R3200 resistance

To find biomarkers of resistance to R3200, we infected HCT116 cells with the retroviral shRNA library targeting some 8,000 human genes for suppression by RNAi [13]. We have shown previously that this library can be used to identify biomarkers of drug resistance [9, 14]. To identify genes whose suppression allows cells to escape the cytotoxic effects of R3200, we treated infected cells with R3200. After two weeks, colonies of R3200 resistant cells were observed in cells infected with the library, but not in control cells treated with R3200 (Fig. 4A).

The screen was performed with a high multiplicity of infection (MOI), which leads to multiple shRNAs being present per cell. Consequently, each R3200-resistant cell colony has several “passenger” shRNA vectors that do not contribute to the resistance phenotype. To identify the active shRNA vectors in the population of resistant cells, we first recovered the shRNAs from the R3200-resistant colonies by isolating the genomic DNA. On this genomic DNA we performed a PCR reaction with primers that specifically amplify the shRNA cassette. These shRNA cassettes were cloned into the original retroviral shRNA vectors in a polyclonal format.

Next, we infected the recovered shRNA vectors from the initial screen into fresh HCT116 cells at low multiplicity of infection, leading to a single retroviral insertion per cell. Cells were again treated with R3200 and

again (in this case more) colonies of resistant cells were observed. Sixteen colonies were picked and the shRNA cassettes were identified by sequencing, which revealed that 11 out of 16 R3200-resistant colonies contained a shRNA vector targeting *RBX1* (also known as *ROC1*). The 5 other colonies all contained a different shRNA vector, among which was a shRNA vector targeting *DDB1* (A list of all shRNAs identified in the colonies can be found in Supplementary Table S3). This is particularly interesting as it has been reported that *RBX1* can bind *DDB1* [15]. Together with *CUL4A*, *RBX1* and *DDB1* can form an ubiquitin E3 ligase complex. We therefore decided to study further the possible role of *RBX1* and *DDB1* in R3200-induced cytotoxicity.

Validation of the role of *RBX1* and *DDB1* in R3200-induced cytotoxicity

Next, we set out to validate that knockdown of *RBX1* and *DDB1* indeed can give resistance to R3200 treatment. To address this, we infected HCT116 cells with the shRNA vectors targeting *RBX1* and *DDB1* that were identified in the rescued colonies from the screen (these vectors were named *RBX1*-Lib and *DDB1*-Lib). When the HCT116 cells with knockdown of *RBX1* or *DDB1* were exposed to R3200, these cells proved to be resistant to R3200 treatment (Fig. 4B). In addition, we tested if *RBX1* and *DDB1* knockdown can also protect cells from higher concentrations of R3200. A clear rescue was observed up to 35 μ M in cells with knockdown of *RBX1* and

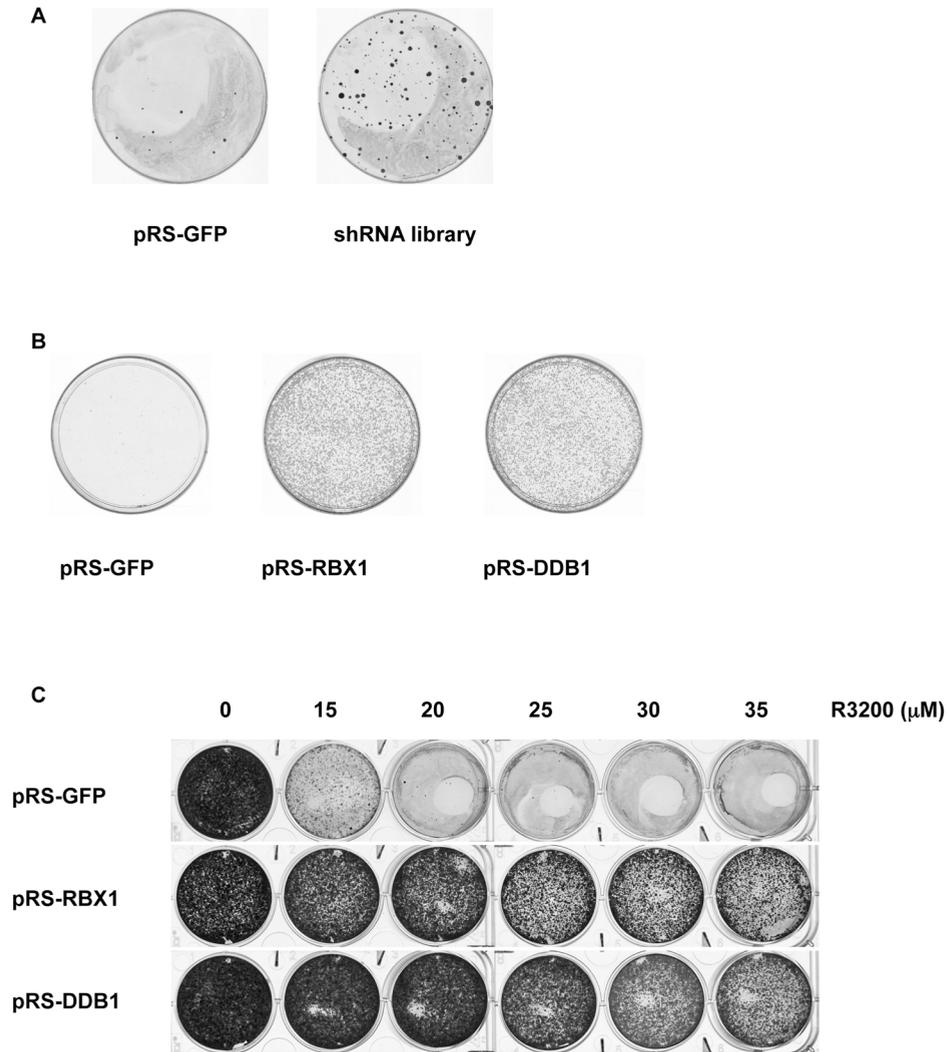


Figure 4
Identification of putative biomarkers of R3200 treatment.

Cells were infected with shRNA library or control and selected with puromycin. 150,000 cells were seeded in a 15 cm dish and treated with R3200 (20 μ M) for 21 days. Cells were fixed and stained with coomassie (a). RBX1 and DDB1 suppression rescues HCT116 from R3200 anti-proliferative effects. Cells were infected with indicated shRNA plasmids and selected with puromycin. 50,000 cells were seeded in a 10 cm dish and treated with 25 μ M R3200 for 10 days. Cells were fixed and stained with coomassie (b). RBX1 or DDB1 suppression renders cells resistant to a range of concentrations of R3200. Cells were infected with indicated shRNA plasmids and selected with puromycin. 10,000 cells were seeded in a 6 well and treated with R3200 for 10 days. Cells were fixed and stained with coomassie (c).

DDB1 (Fig. 4C).

Multiple shRNA vectors targeting *RBX1* and *DDB1* can produce resistance to R3200 treatment

To find support for the notion that the knockdown vectors targeting *RBX1* and *DDB1* give rescue due to an 'on-target' effect, we designed four new shRNA vectors targeting both genes (For sequences see methods, vectors were named 1-4) and used these to infect HCT116 cells. We first assessed if the new shRNAs could suppress *DDB1* and *RBX1* mRNA. A clear reduction in mRNA levels as measured by QRT-PCR was observed in cells that were infected with shRNA vectors targeting *RBX1* and *DDB1* compared to control infected cells (Fig. 5A and 5B). Next we set out to investigate if we could find a correlation between the degree of knockdown and resistance to R3200. The first observation we made was that strong knockdown of *RBX1* and *DDB1* has an adverse effect on cell proliferation, even in the absence of R3200 (Fig. 5C), a phenotype that has been reported before [16, 17]. We also observed that cells infected with different shRNA vectors targeting *DDB1* (pRS-*DDB1*-2 and -3) and *RBX1* (pRS-*RBX1*-3 and -4) produced resistance to R3200 treatment. In addition these cells were also resistant to R3200 treatment in culture conditions with low levels of serum (2.5% FCS) (Supplementary Figure S2). Furthermore we decided to determine the IC₅₀ of R3200 treated HCT116 cells with knockdown of *RBX1* or *DDB1*. We observed an

IC₅₀ for *RBX1*-Lib infected cells of 75 μM and for *DDB1*-Lib infected cells of 68 μM, compared to an IC₅₀ of 18 μM for control-infected cells (Supplementary Figure S3). From these data we conclude that suppression of both *RBX1* and *DDB1* can confer resistance to R3200 treatment *in vitro*.

Suppression of *RBX1* and *DDB1* can abrogate the R3200 induced cell cycle arrest

As shown above, treatment with R3200 leads to a G2/M arrest in cancer cell lines. Therefore we tested if knockdown of *RBX1* and *DDB1* can also lead to bypass of the G2/M arrest in HCT116 cells. Cells with a stable knockdown of *RBX1* or *DDB1* were treated with R3200 and subjected to cell cycle analysis (Fig. 5D). For *RBX1* we used pRS-Lib, -3 and -4 and for *DDB1* we used pRS-Lib, -2 and -3. These vectors induced no anti proliferative effects in untreated cells and in addition produced the best rescue after treatment with R3200 (Fig. 5C). The G2/M arrest in control cells is very efficient, meaning that 80% of treated cells are arrested. When we tested cells with knockdown of *RBX1* or *DDB1*, we observed that the G2/M peak was reduced accompanied by an increased G1 fraction (Fig. 5D). We therefore conclude that knockdown of *RBX1* and *DDB1* can also alleviate the cell cycle arrest in cells treated with R3200.

***RBX1* and *DDB1* knockdown do not cause general drug resistance**

Next we performed some

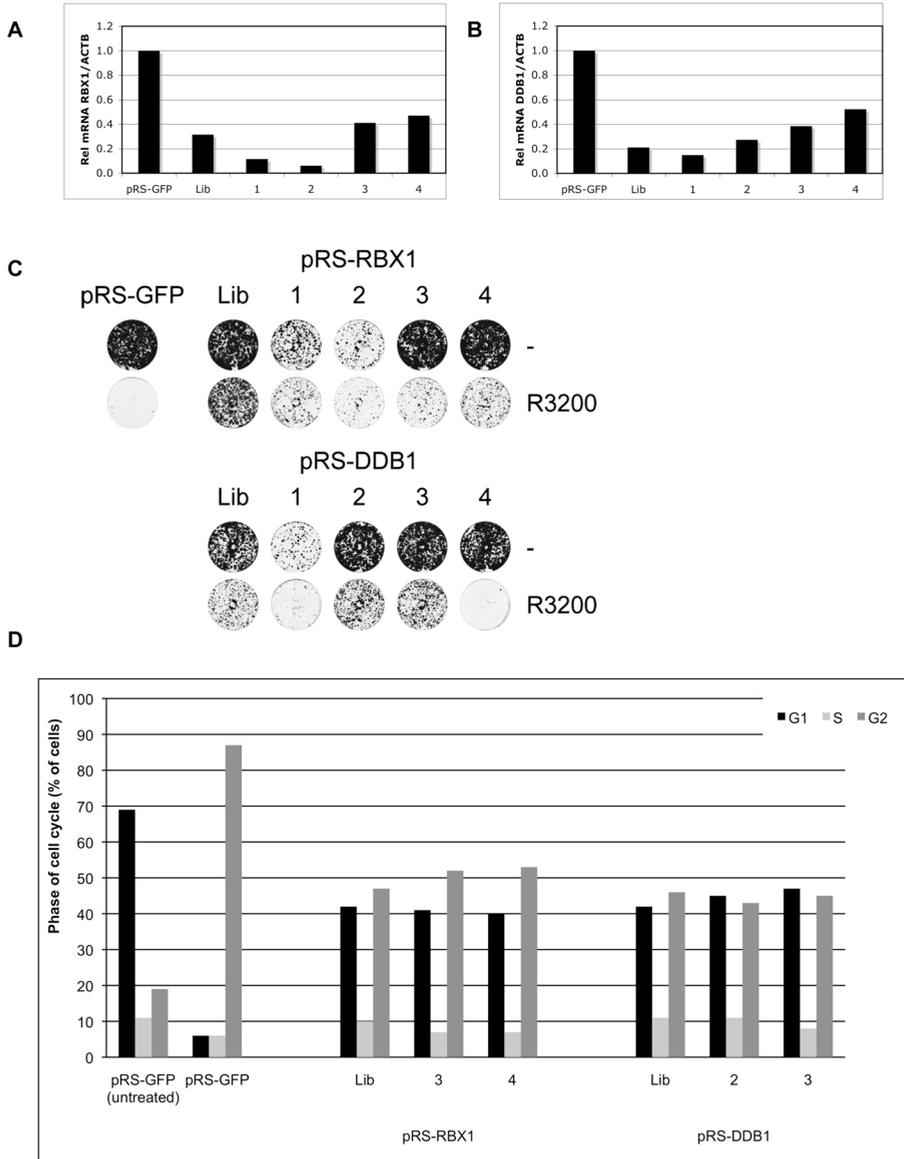


Figure 5

Multiple shRNA vectors targeting RBX1 and DDB1 produce resistance against R3200 treatment. QRT-PCR to assess knockdown of RBX1 (a) and DDB1 (b) in HCT116 cells. Cells were infected with knockdown vectors targeting RBX1 or DDB1 and control knockdown vector (pRS-GFP). RBX1-Lib and DDB1-Lib are the shRNA plasmids identified from the library. Hit validation in HCT116 cells (c). Cells were infected with indicated plasmids and selected with puromycin. 10,000 cells were seeded in a 6 well and treated with R3200 for 10 days. Cells were fixed and stained with coomassie. Knockdown of RBX1 and DDB1 can rescue the R3200 induced G2/M cell cycle arrest in HCT116 cells (d). HCT116 cells were infected with pRS-GFP control vector or pRS vectors targeting RBX1 or DDB1 as indicated on the x-axes. Cells were treated with R3200 (30 μ M for 48 hrs) and stained with PI. G1 phase is indicated in black bars, S-phase in hatched bars and G2/M phase in gray.

experiments to ensure that the observed effects are not specific for both the cell type and drug used. To address the drug specificity issue we treated HCT116 cells with an unrelated drug, cisplatin in the presence or absence of *RBX1* or *DDB1* knockdown. As HCT116 cells are quite sensitive to low concentrations (5 μ M) of cisplatin a strong decrease in proliferation can be observed (Supplementary Figure S4). The anti proliferative effects of cisplatin could not be overcome by knockdown of either *RBX1* or *DDB1*. This experiment shows that suppression of *RBX1* or *DDB1* confers resistance to R3200 treatment but not to anti-proliferative drugs in general.

Suppression of RBX1 and DDB1 also confers resistance to R3200 treatment in U2OS cells

To exclude that the observations we made are specific for HCT116

cells we decided to repeat some of the experiments in an unrelated cell type. For this we used U2OS cells, a cell line isolated from a human osteosarcoma. U2OS cells are equally sensitive to R3200 as HCT116 (U2OS (IC₅₀ = 5.3 μ M), HCT116 (IC₅₀ = 4.9 μ M). We used the active shRNA vectors to knockdown *RBX1* and *DDB1* in U2OS cells. When the mRNA levels of *RBX1* and *DDB1* were assessed we observed comparable results as in HCT116 cells (Supplementary Figure S5A and S5B). Subsequently we treated the U2OS cells in which we knocked down *RBX1* and *DDB1* with various concentrations of R3200. In cells that were suppressed for either *RBX1* or *DDB1* we saw a clear rescue from the anti-proliferative actions of R3200 as measured by colony formation assays (Supplementary Figure S5C).

Discussion and conclusion

In this study we report biochemical and genetic studies using the new anti cancer acyl sulfonamide R3200. In previous studies it was shown that acyl sulfonamides can inhibit cell proliferation *in vitro* and *in vivo*. However no analysis was performed on the possible mode of action of acyl sulfonamides [1-4]. Here we show that R3200 has profound anti proliferative action in a series of cancer cell lines including a P-gp over-expressing cell line. This anti proliferative effect can be attributed to two different physiological responses. First, when we performed cell cycle

analysis on R3200 treated cells we observed a cell cycle arrest. Second, R3200 treatment leads to substantial apoptosis when cells are exposed to drug for a longer time. After these promising *in vitro* results we tested the effects of R3200 in mouse and rat xenografts. In these experiments we observed a strong anti proliferative effect towards the grafted human cancer cells resulting in strong tumor growth inhibition.

To identify the mode of action of R3200 and to find biomarkers of resistance to this drug, we have performed a large-scale RNAi genetic screen. Two genes were

identified that, when suppressed, can bypass the cytostatic actions of R3200. Interestingly, these two genes, *RBX1* and *DDB1* can form a complex with CUL4A, leading to the formation of an active ubiquitin E3 ligase complex [18]. Suppression of components of this E3 ligase complex potentially leads to the stabilization of the target proteins. It is therefore possible that R3200 inhibits a protein, which is targeted for destruction by this ubiquitin ligase complex containing *RBX1* and *DDB1*, as inhibition of this destruction complex may lead to increased concentrations of the putative protein target(s) of R3200, thereby conferring resistance to the drug. Many targets have been reported for the ubiquitin ligase complex containing *RBX1* and *DDB1*, most striking targets are CDT1, c-Jun and Histone H3 and H4 [15, 19-21]. CDT1 is required for formation of the pre-RC complex and therefore essential for replication of the genome [22]. It has been described that CDT1, Histone H3 and H4 can be ubiquitinated by

the complex containing *RBX1* and *DDB1* after DNA damage [7, 21].

Whatever the mechanism may be, our data indicate that the level of *RBX1* and *DDB1* may have clinical utility to predict the response of cancer cells to R3200. Therefore *RBX1* and *DDB1* should be evaluated as biomarkers for clinical response in the treatment of patients with R3200 and potentially also in clinical studies involving other acyl sulfonamides. If a tumor contains very low levels of transcripts encoding for either *RBX1* or *DDB1* it might be advisable not to use R3200 in this setting. One of these examples would be patients that suffer from a form of xeroderma pigmentosum (XP). XP patients that fall in complementation group XPE suffer from a defect in either the *DDB1* or *DDB2* gene [23, 24]. Therefore treatment of XP patients with a defect in *DDB1* or *DDB2* with R3200 might be less effective. Clinical studies involving these candidate biomarkers may substantiate these predictions in the future.

Materials and Methods

Cell lines & culture conditions

Cell lines were derived from ATCC, NCI or DSMZ. The MTLn3 cell line is a mouse cell line, all other cell lines are human cell lines. All cell were cultivated in RPMI1640 medium supplemented with 10% FCS, 100 µg/ml Penicillin and 100 µg/ml Streptomycin at 37°C in 5% CO₂. For the RNAi barcode screen HCT116 and Phoenix cells were cultured at 37°C in 5% CO₂

in DMEM medium supplemented with 10% FCS, Penicillin and Glutamine.

Reagents

R3200 (2-Phenyl-ethenesulfonic acid 2,4-dichloro-benzoylamide sodium salt) was dissolved in DMSO to get a stock solution of 10 mM. Taxol (Paclitaxel), Cisplatin, Nocodazole (Oncodazole) and Etoposide were purchased from Sigma Aldrich and

dissolved following the instructions of the company.

Cell titer glow assay

The CellTiter-Glo™ Luminescent Cell Viability Assay (Promega) is used for determining the number of viable cells based on quantitation of the ATP present. Cells were seeded as 1000 – 3000 cells per well in 60 µl in a 384 well plate in the same medium supplemented with either 2.5% or 10% FCS. After 16-24 h at 37 °C and 5% CO₂ 10 µl of the serially diluted compound was added in triplicate wells. The final concentration in the assay was between 30 µM and 1.5 nM or between 100 µM and 4.5 nM (ten concentrations, dilution 1:3). The cells were incubated at 37 °C and 5% CO₂ for 5 days. At the end of the experiment, first the plate was equilibrated to room temperature for approximately 30 minutes and then the cells were treated with 30 µl of CellTiter-Glo reagent. After 45-60 minutes the luminescence was determined using a Victor² multi-probe plate reader from PerkinElmer.

Annexin V apoptosis assay

HCT116 cells were treated with R3200 for 24, 48 or 72 hours. After treatment cells were collected and stained with Annexin V and Propidium Iodide. Following staining cells were subjected to FACS analysis.

Western blotting

The following antibodies were used for Western blotting. Anti c-Jun (9162), c-Jun-pS63 (9262), c-Jun-pS73 (9164) were obtained

from Cell Signaling Technologies. Anti Cyclin A (611269), Cyclin B (610220), MAD2 (610679) were obtained from BD Transduction Laboratories.

HCT116 xenograft study

SCID beige mice were purchased from Charles River Germany; HCT116 tumor cells were obtained from the NCI. To generate the primary tumors, 5x10⁶ HCT116 cells were injected subcutaneously into the flank of each mouse in a volume of 100 µL of phosphate buffered saline. Body weight and tumor volume were measured three times weekly. Tumors were measured in two dimensions (length and width), and the corresponding tumor volume was estimated using the formula: $V [\text{mm}^3] = \text{length} [\text{mm}] \times \text{width} [\text{mm}] \times \text{width}/2 [\text{mm}]$. Randomization (6 groups containing 10 animals each), and start of treatment was on day 12, when the tumors had reached an average volume of ca. 150 mm³. Treatment was once daily for 3 days (on days 12, 13, and 14) by i.v. injection of vehicle or different doses of R3200. On day 31, the final day of the experiment, blood samples were taken from the animals and analyzed for hematological (red blood cell count, hemoglobin, packed cell volume, reticulocyte count, platelet count) and clinical chemistry (alanine-aminotransferase, creatinine, urea) parameters.

NKI shRNA library

The construction of the library was described previously [13]. Briefly, the NKI shRNA library was designed to target 7914 human genes, using

three shRNA vectors for every targeted gene, cumulating in a total of 23,742 shRNA vectors. The shRNAs are cloned into a retroviral vector (pRetroSUPER, pRS) to enable infection of target cells.

Retroviral infection

Phoenix cells were transfected using calcium phosphate method. Viral supernatant was cleared through a 0.45 μ M filter. Cells were infected with the viral supernatant in presence of polybrene (8 μ g/ml). The infection was repeated twice.

shRNA screen

To screen the NKI shRNA library we reasoned that we would need 100-fold coverage of the library to get a good representation of shRNA vectors present in the library. The screen was initiated by transduction of HCT116 cells with the shRNA library. After infection the cells were selected with puromycin (2 μ g/ml). When the selection was completed 2×10^6 HCT116 cells (100 fold library coverage) were seeded at a density of 150,000 cells/15 cm dish. Some 24 hours after seeding R3200 was added at a final concentration of 20 μ M. Colonies of resistant cells appeared in the plates containing cells infected with the shRNA library, no colonies were observed in control infected cells treated with R3200. After 21 days of exposure to 20 μ M R3200 the colonies were harvested. All colonies were pooled and the genomic DNA was isolated using DNAzol (Invitrogen). The shRNA cassettes were amplified by PCR, and re-cloned into the pRS shRNA vector. This polyclonal pool of shRNA vectors was infected into

HCT116 cells at a low multiplicity of infection. The colony formation was repeated and 16 colonies were isolated. From these colonies genomic DNA was isolated and the shRNA cassettes were amplified by PCR. The PCR product was cloned into the pRS plasmid. To identify the shRNA cassette 5 re-cloned plasmids were sequenced for every re-cloned PCR product. The sequences of the shRNAs isolated from the colonies are listed in Table S3.

Generation of additional shRNA vectors targeting RBX1 and DDB1

19-mer sequences of shRNA plasmids targeting RBX1 and DDB1 used in this study.

RBX1 (NM_014248)

Lib	GACTTCTTCCATCAAGCTT
1	GAAGCGCTTTGAAGTGAAA
2	GCATAGAATGTCAAGCTAA
3	GCAAGAAGCGCTTTGAAGT
4	CAACAGAGAGTGGGAATTC

DDB1 (NM_001923)

Lib	GAACCCAAAGCTCTGGTCA
1	GACAAGAGTTCTCATGTTA
2	GCAAGGACCTGCTGTTTAT
3	TGACATACCTTGATAATGG
4	CACTAGATCGCGATAATAA

Colony formation assay

Cells were infected with retroviral supernatant and selected with puromycin. When the selection was completed cells were seeded at 150,000/15 cm dish, 50,000/10 cm dish or 10,000/6-well. The following day the R3200 was added. Cells were cultured in presence of R3200 for approx 10 days. When colonies appeared cells were fixed in MeOH/

HAc (3:1) and subsequently stained instaining solution (50% MeOH/10% HAc/0.1% Coomassie).

QRT-PCR (quantitative real time PCR)

Total RNA was isolated using TRIzol (Invitrogen) from cells that were infected with pRS plasmids and selected with puromycin. From the total RNA, cDNA was generated using Superscript II (Invitrogen) with random primers (Invitrogen). cDNA was diluted and QRT reaction was performed using SYBR green PCR master mix (Applied Biosystems). All QRT reactions were run in parallel for Actin B to control for amount of input cDNA. The QRT reaction was followed by a melting curve to confirm the formation of a single PCR product. The QRT reactions were run at an AB7500 Fast Real Time PCR system (Applied Biosystems). The PCR primer sequences were obtained from the qprimerdepot [25]

Primer sequences:

Actin B Forward:
CCTGGCACCCAGCACAA
Actin B Reverse:
GCCGATCCACACGGAGTACT
RBX1 Forward:
AGTGGAAATGCAGTAGCCCTC
RBX1 Reverse:
ACGCCTGGTTAGCTTGACAT
DDB1 Forward:
GATCATCCGGAATGGAATTG
DDB1 Reverse:
ATTAGGGTCAGACCGCAGTG

FACS cell cycle analysis

Cells were infected with retroviral supernatant and selected with puromycin. When the selection was completed cells were seeded at 500,000/10 cm dish. One day after seeding R3200 (30 μ M) was added for 48 hrs. Cells were harvested and fixed in 70% EtOH and subsequently stained with PI (propidium iodide). FACS analysis was performed by gating out the doublet cells.

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Supplementary tables and figures

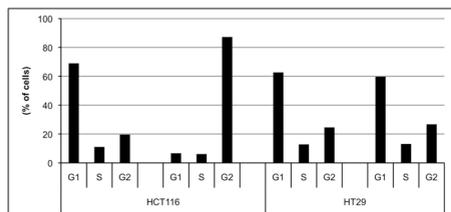


Figure S1

Quantification of FACS analysis of PI stained HCT116 and HT-29 cells treated with 30 μ M R3200 for 48 hrs.

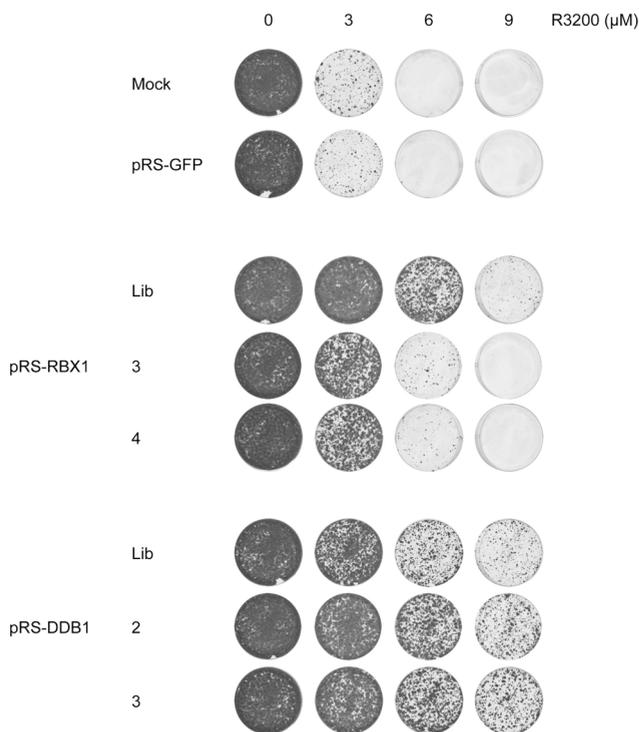


Figure S2

RBX1 and DDB1 knockdown confer resistance to R3200 under low serum culture conditions. 10,000 cells were seeded per 6 well and cultured in presence of indicated concentrations of R3200 for 12 days.

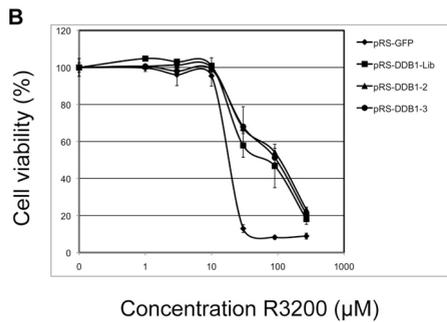
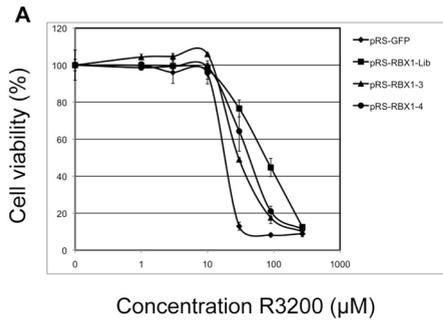


Figure S4
Suppression of RBX1 or DDB1 does not cause general drug resistance.
HCT116 cells were seeded (10,000/6-well) and treated with either capsulation (5 μM) or R3200 (20 μM).

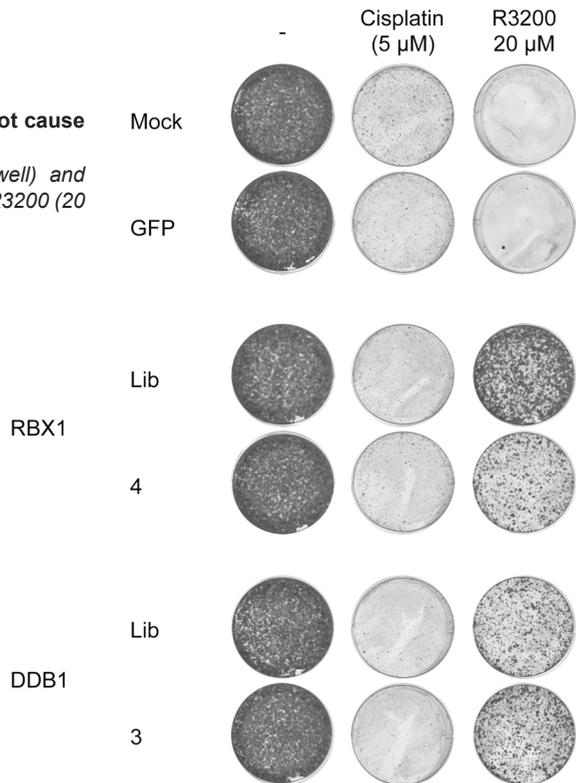


Figure S3
RBX1 and DDB1 knockdown cause a shift in IC50 for R3200 treatment.
Dose response curves were measured using cell titer glow.

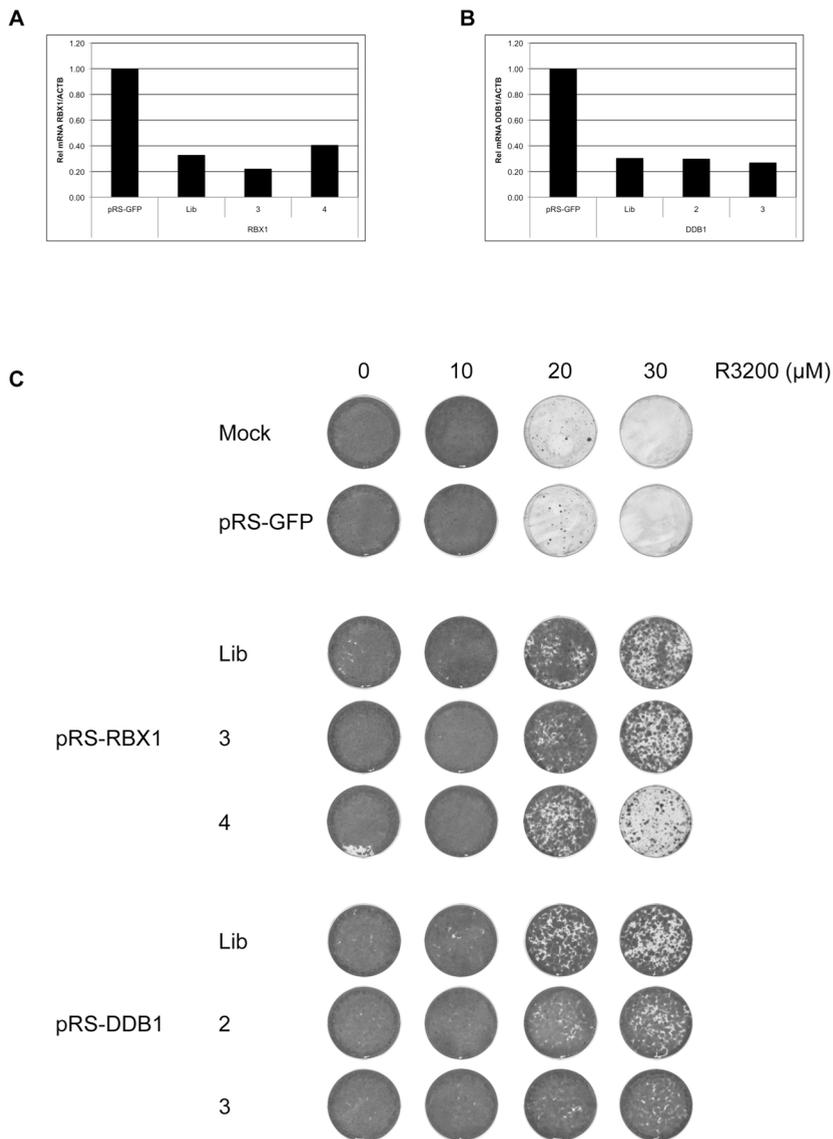


Figure S5

Knockdown of RBX1 and DDB1 confers resistance to R3200 in U2OS cells.

QRT-PCR to assess knockdown of RBX1 (a) or DDB1 (b) in U2OS cells. Knockdown of RBX1 or DDB1 also confers resistance to R3200 treatment in U2OS cells (c). 10,000 U2OS cells were plated per 6-well and treated with R3200 for 14 days at the indicated concentrations.

Tumor Type	Cell line	Medium with 2.5 % FCS	Medium with 10 % FCS
		Mean values [μ M]	Mean values [μ M]
Ovary	IGROV-1	2.3	10.4
Breast	MDA-MB-468	4.8	13.7
Colon	HCT-116	4.9	19
Osteosarcoma	U2OS	5.3	17.3
Colon	SW-620	6.3	22.9
Prostate	PC-3	6.6	24.1
T-lymphocyte	Molt 4	9.9	26.3
Colon	Colo 205	11	27.7
Breast	MTLn3	11	26.4
Burkitt Lymphoma	Raji	11.2	27.8
Breast	MDA-MB-435	11.3	28.3
Pancreas	Panc Tu-1	11.3	28.7
CNS	SF-295	12.9	29.2
Ovary	SK-OV-3	13.2	29.5
Colon	HCT-15	13.5	29.6
Lung	A 549	14.3	30.4
Ovary	OVCAR-5	14.8	32.9
Prostate	DU-145	19.9	45.4
Breast	MCF-7	21.8	58.6
Breast	KPL-4	24.1	88.5
Lung	H460-M2	24.3	> 23.5
Breast	MDA-MB-231	35.5	> 27.9
Colon	CX-1	42	> 29.4
Prostate	LNCaP	65.5	> 30
Colon	HT-29	71.6	> 30
Lung	NCI-H441/Kam.	> 30	> 100
Pancreas	Panc-1	> 30	> 30
Lung	QG-56	> 30	> 30
Lung	Calu-3	> 35.2	> 100

Table S1

R3200 has cytotoxic activities in a wide range of tumor cell lines.

IC₅₀ values for cell lines (as indicated) treated with R3200 in 10% FCS and 2.5% FCS culture conditions.

Tumor growth inhibition at 80 mg/kg		
Model	Tumor type	Tumor growth inhibition [%]
HCT116	Colon	90-98%
Colo-205	Colon	95-100%
SW620	Colon	45-50%
PC3	Prostate	90-100%
IGROV-1	Ovarian	70-75%
HCT116 rat	Colon	80-85%

Table S2

Results of xenografts with six human cancer cell lines in SCID beige mice treated with R3200.
Growth inhibition was measured as described in materials and methods.

Colony #	shRNA Sequence	Genbank Acc	HUGO	Number identified
Colony 1	ACCTGGTGACTGATGAGGC	NM_152830	Angiotensin I converting enzyme 1 (ACE)	5
Colony 2	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	3
Colony 2	GCTATGTTAGCAACCATGT	NM_021907	DTNB	1
Colony 3	GTCACACAGACAACAAT	NM_006529	GLRA3	2
Colony 3	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	2
Colony 3	GCCATTCAAGTGC GCGGAC	NM_007249	KLF12	1
Colony 4	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	1
Colony 4	CTTGAAATCATTATTCTA	BC131822		4
Colony 5	CTGTCCCAACATTAGAGTA	BC126338		1
Colony 5	GGCCGACACCTTGATATGG	NM_001079821	NLRP3	1
Colony 5	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	1
Colony 6	CTAAATGGGGTACCTCGGC	NM_004572	PKP2	1
Colony 6	GACAATAATCGGCTGGGA	NM_000901	NR3C2	2
Colony 6	TCTTCTGCTGGCACAGT	AY587582	GALR3	2
Colony 7	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	1
Colony 7	GTCGAAGTGCAGCTGGA	not a 100% match		4
Colony 8	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	5
Colony 9	GAAATGTCATTCTTGCTCC	NM_152896	UHRF2	3
Colony 10	GAACCCAAAGCTCTGGTCA	NM_001923	Damage-specific DNA binding protein 1 (DDB1)	5
Colony 11	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	4
Colony 11	TTCAACTCCACGCGGGACT	NM_003412	ZIC1	1
Colony 12	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	4
Colony 13	ACTTCATTCTTGATTGTG	not a 100% match		1
Colony 13	GAATGATCGATTCAACTAT	NM_173500	TTBK2	2
Colony 13	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	1
Colony 13	CTTCATTCTTGATTGTG	BC093019		1
Colony 14	CAGATTTACCCATTTGTGT	NM_004865	TBPL1	5
Colony 15	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	3
Colony 16	GACTTCTTCCATCAAGCTT	NM_014248	Ring-box 1 (RBX1), mRNA	4

Table S3

Results from sequencing of 16 colonies obtained from the RNAi screen in HCT116 cells treated with R3200.

CHAPTER VI

IRAK2 is a novel modulator of the
TGF-beta signaling cascade

IRAK2 is a novel modulator of the TGF-beta signaling cascade

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The TGFβ pathway orchestrates an extensive transcriptional program that is important for many processes in the cell. For example TGFβ regulates cell cycle, migration and epithelial-to-mesenchymal transition (EMT). The TGFβ pathway has a dual role in cancer: it is involved in early stage tumor suppression, but also contributes to tumor progression by promoting invasion. To identify novel genes involved in TGFβ pathway signaling, we have performed a functional genetic loss-of-function screen. We screened 700 kinases and kinase related genes in a TGFβ responsive reporter assay. Several genes were identified that upon knockdown could repress the reporter signal; among these are the two cellular receptors for TGFβ. In addition to these two known components of the TGFβ pathway, several genes were identified that were previously not linked to the TGFβ signaling. Knockdown of one of these genes, the *IRAK2* kinase, resulted in not only in an impaired TGFβ target genes response but also in a reduction in nuclear translocation and phosphorylation of SMAD2. In addition, suppression of *IRAK2* expression led to a partial override of a TGFβ induced cell cycle arrest. Our data demonstrate that *IRAK2* is a novel and critical component of TGFβ signaling.

Introduction

The TGF β pathway is an important signaling pathway that regulates many different processes such as cell cycle, epithelial to mesenchymal transition (EMT), migration and angiogenesis [1, 2]. Stimulation of the TGF β pathway is initiated by binding of the TGF β ligand to the TGF β receptors (TGFBR1 and TGFBR2). This leads to TGF β receptor complex formation, which results in the phosphorylation of TGFBR1 by TGFBR2. Subsequently, SMAD2 and SMAD3 are phosphorylated by the TGFBR1, which leads to their translocation to the nucleus. In the nucleus the activated SMADs can form a complex with SMAD4. This activated SMAD complex recruits transcriptional co-factors which assist in the binding of SMAD responsive DNA elements in the promoters of TGF β target genes, thereby regulating their transcription [3].

The TGF β pathway plays a dual role in cancer pathogenesis. In normal epithelium and early stage tumors, the TGF β pathway was reported to have an inhibitory effect on cell proliferation [4]. This is achieved mainly through induction of a G1 cell cycle arrest through up-regulation of the CDK inhibitors *CDKN1A* (encoding p21^{CIP1}) and *CDKN2B* (encoding p15) and downregulation of the *MYC* proto-oncogene [5-7]. However, cancer cells can become insensitive to this proliferation control by loss of expression of the TGF β receptor or SMADs. The TGF β pathway subsequently promotes cancer progression through induction of

EMT, angiogenesis and evasion of immune surveillance [1, 2]. Furthermore, it was recently shown that tumors with an activated TGF β pathway have a worse outcome than tumors without activation of the TGF β pathway [8, 9]. For this reason different anti-cancer strategies are developed to inhibit the TGF β pathway. Clinical trials have been performed with TGF β antisense oligonucleotides, TGF β antibodies and a TGFBR1 small molecule inhibitor [10].

Several approaches have been taken to identify new players in the TGF β pathway. For example protein-protein interaction screens have been used to extend the knowledge about the TGF β pathway [11, 12]. In addition, a functional genetic screen to identify new players in the mammalian TGF β network has been performed by Levy and colleagues. They describe the screening of a siRNA library targeting the ubiquitin E3-ligase gene-family in a cell line with an integrated TGF β responsive reporter. Through this approach they identified Arkadia as a positive regulator of the pathway [13].

We describe here a functional genetic screen aimed at the identification of novel kinases that function in the TGF β pathway. We identify here an unexpected new kinase that contributes to TGF β signaling.

Results

The screening of a TGF β reporter cell line with a human kinome siRNA library

To screen siRNA libraries in high throughput format for novel modulators of TGF β signaling, we generated an U2OS osteosarcoma cell line with a stably integrated pCAGA₁₂-Luc TGF β responsive reporter (this cell line was named U2OS-CAGA) [14]. This reporter has been described to be primarily responsive to SMAD3/4 dependent transcription [14]. To test the responsiveness of the integrated reporter in the U2OS-CAGA cell line, we transfected siRNAs targeting a positive and a negative regulator of TGF β signaling. As expected, ablation of the positive regulator TGFBR2 by RNAi led to complete abrogation of both basal and TGF β induced reporter activity (fig. 1a). Moreover, knockdown of a negative regulator of the TGF β signaling cascade, SKIL caused the opposite effect, showing increased reporter activity. It is worth noting that in absence of exogenous TGF β knockdown of SKIL still causes enhanced signal of the TGF β responsive reporter (fig.1a). We also observed a slight induction of the TGF β reporter upon addition of control siRNAs (fig. 1a).

These initial experiments showed that the integrated TGF β reporter in the U2OS-CAGA cell line behaved as expected. Therefore we used this cell line to screen a siRNA library targeting 700 kinases and kinase related proteins. The siRNA library that we used consists of siRNA pools; each gene is targeted

by 4 separate siRNA, which are used as a pool. The U2OS-CAGA cells were transfected in triplicate with siRNA pools of the human kinome library and the entire screen was performed in presence of TGF β . To identify siRNAs that modulate the reporter, we measured both luciferase activity and cell viability. The cell viability was measured to exclude siRNAs that cause a decrease in cell viability as these might be identified as false positive repressors in the screen. Data was normalized and a hit list was generated by calculating a Z-score for every tested siRNA pool (fig. 1b).

Only siRNA pools that produced a Z-score greater than 2 (20 genes) or lower than -2 (17 genes) were selected for further analysis (Supplementary table 1). Among the genes targeted by siRNA pools that repressed the reporter were the positive controls: *TGFBR1* and *TGFBR2*. In addition, we identified the siRNA pool against *ALK1* (*ACVRL1*) as an activator of the TGF β responsive reporter. ALK1 was previously identified as a TGF β superfamily receptor type I protein that can complex with TGFBR2 and directly antagonizes TGF β transcriptional activation mediated by TGFBR1 [15, 16]. The fact that the screen was able to identify these genes that are part of the canonical TGF β signaling network support the notion that at least some of the other genes in the hit list are genuine players in the TGF β pathway.

As a first step to validate

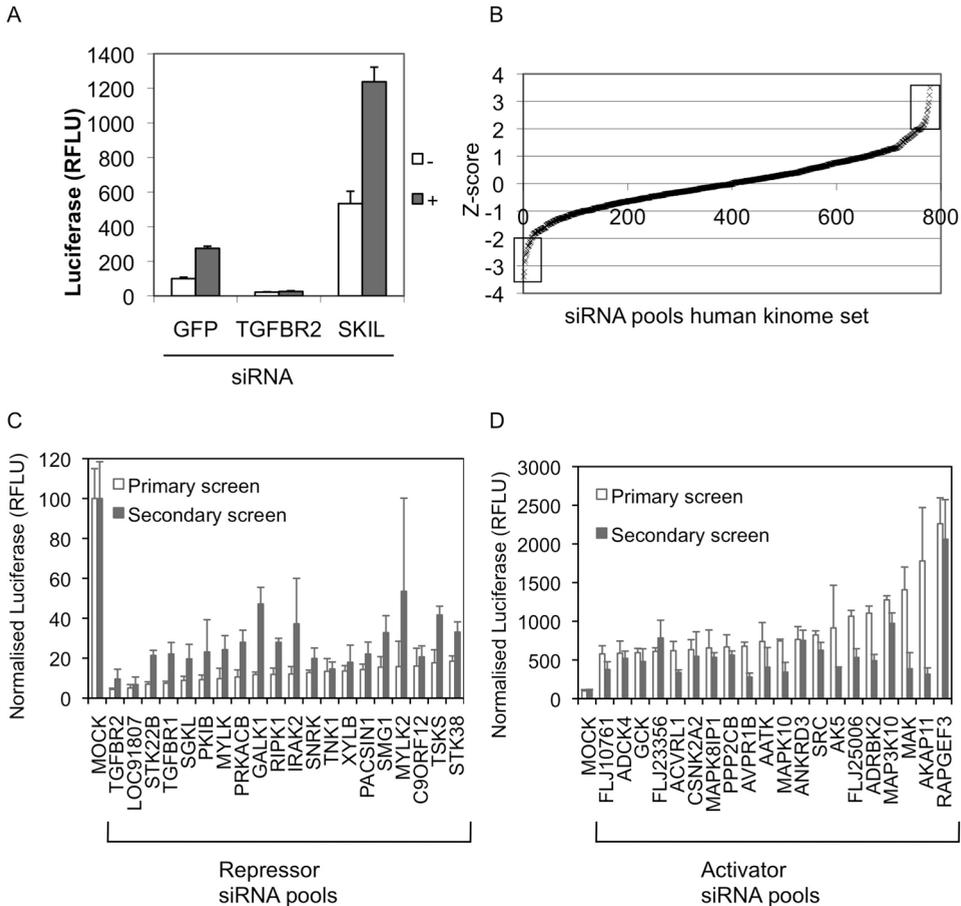


Figure 1

Screen with TGFβ responsive reporter identifies modulators of the TGFβ pathway

U2OS-CAGA cells harboring a stable TGFβ responsive luciferase reporter were transfected with siRNAs against GFP, TGFBR2 or SKIL and treated with 200 pM TGFβ (+) for 14 hrs or left untreated (-) (a). Results from a kinase siRNA screen, Z-scores were calculated and plotted in ascending order. Boxed areas indicate the siRNA pools that were selected for follow-up which respectively repress or activate the TGFβ responsive reporter (b). Seventeen siRNA pools that repress the reporter (c) and twenty siRNAs that activate the reporter (d) were tested in a follow-up experiment. The normalized luciferase counts from the screen (white bars) and follow-up (black bars) are plotted.

our screen we re-tested the same siRNA pools that were identified by the screen to verify that they could indeed reproduce the phenotype from the primary screen. Therefore, we transfected 37 siRNA pools into the U2OS-CAGA cell line and measured the luciferase signal.

All 37 siRNA pools, selected by their Z-score, could significantly reproduce the phenotype that was measured in the primary screen, indicating that the initial screen with the siRNA pools was reproducible (fig. 1c and 1d).

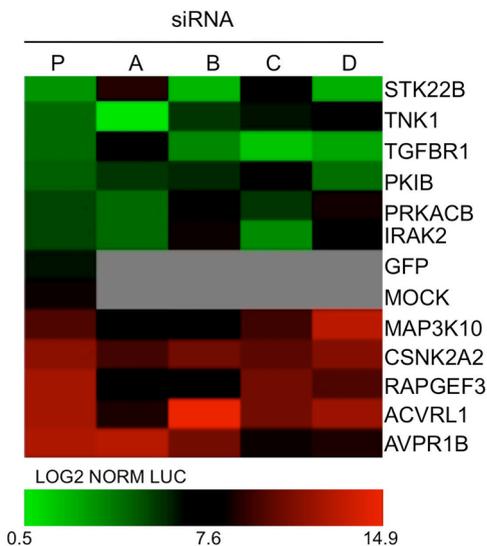
One of the mayor drawbacks

of using RNAi as a screening tool is that some observed phenotypes can potentially be caused by 'off-target' effects [17, 18]. Therefore we performed a second round of validation for a subset of our hits. We selected hits based on the position in the primary hit list. In addition, protein-protein interaction databases were used to preferentially select hits that interact with known TGF β pathway members. Sixteen hits (eight siRNA pools that could activate the reporter and eight that repressed) were selected for a second round of validation. In this second round validation the four siRNAs of each siRNA pool were tested separately, to test if they could reproduce the originally observed phenotype. For eleven of the sixteen hits tested we identified two or more individual siRNAs that could reproduce the original phenotype. The genes targeted by these siRNAs are considered to be 'on target' [19]

(fig. 2, supplementary fig. S1a and S1b).

Effect of knockdown of 'on-target' hits on endogenous TGF β signaling

Since the reporter system used here is only an indirect measurement of TGF β pathway activity, we set out to test if the validated hits could also affect TGF β target gene expression. Many different genes are directly regulated by TGF β ; among these genes are *CDKN1A*, *SMAD7*, *PAI-1* and *MYC*. As a model for endogenous TGF β signaling we used the prostate cancer cell line PC3, in these cells transcription of *CDKN1A*, *SMAD7*, *PAI-1* is upregulated while *MYC* is transcriptionally repressed after addition of TGF β . Because we identified a relative large number (11) of hits that proved to be 'on-target', we decided to proceed with only the genes whose downregulation impaired activation of the TGF β reporter (5 in total)



Repressors

Figure 2

Eleven hits from the screen are 'on-target'

The four separate siRNAs that form the siRNA pool (P) were tested separately (A,B, C, D) in the U2OS-CAGA cell line. MOCK (only transfection reagent) and a GFP siRNA were taken along as negative controls. LOG₂ normalized luciferase counts of hits that validate with two or more separate siRNAs were plotted in a heatmap.

Activators

as these genes are potential novel targets for therapy in cancer. These five hits, together with TGFBR2 used as a control, were tested for their ability to modulate endogenous TGF β target gene expression. Indeed, all hits tested showed impaired target gene regulation for two or more endogenous TGF β targets (fig. 3a-d).

Identified hits are involved in SMAD2/3 cytoplasmic to nuclear translocation

TGF β target gene activation is a downstream event in the TGF β signaling cascade, which

is preceded by the translocation of SMAD2/3 from the cytoplasm to the nucleus. For this reason we tested if the genes that could repress target gene activation also impaired SMAD2/3 translocation. As a control, we measured the effect of the knockdown of TGFBR2 on TGF β induced SMAD2/3 nuclear translocation by immunohistochemistry. We quantified the effect by determining the ratio of SMAD2/3 in the nucleus versus the cytoplasm using Cellprofiler software [20] (fig. 4a). PC3 cells were transfected with siRNAs targeting the 'on

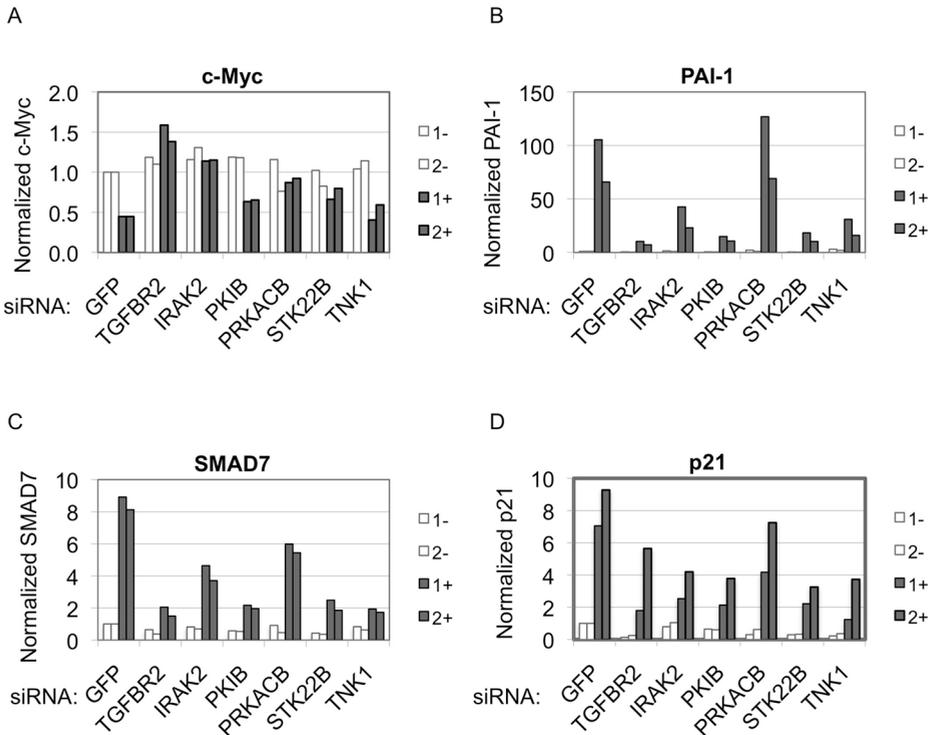
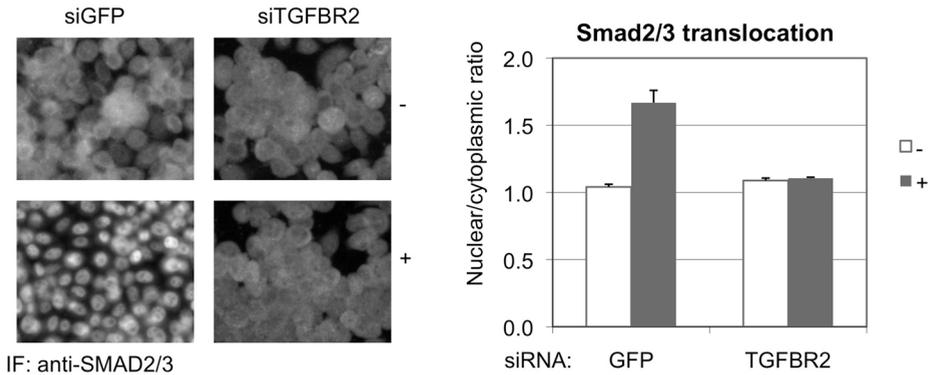


Figure 3
Endogenous TGF β target gene regulation

The siRNAs targeting 'on target' hits which repress the reporter were transfected in PC3 cells and target genes were not induced (in duplicate; 1- and 2-) or induced with TGF β ; 2 hrs for c-Myc (a) and p21^{CIP1} (d) or 8 hrs for PAI-1 (b) and SMAD7 (c) (in duplicate; 1+ and 2+). The mRNA levels of the target genes were determined by quantitative PCR and were normalized to the reference gene RPL13.

A



B

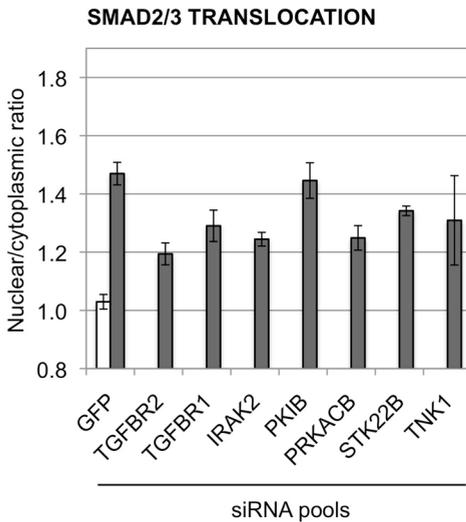


Figure 4

Effect of knockdown of the hits on SMAD2/3 translocation

PC3 cells were transfected with siRNAs against GFP and TGFB2, cells were treated with TGFβ (+) for 1 hr or left untreated (-). Immunohistochemistry was performed with an antibody specific for smad2/3 and cells were counterstained with DAPI to determine the position of the nuclei. The ratio of nuclear and cytoplasmic smad2/3 is determined with cell profiler (a). PC3 cells were transfected with siRNA pools and treated with TGFβ for 1 hr (+). The negative control siGFP was also tested in non-treated condition (-). Immunofluorescence for smad2/3 was performed and the images were quantified with Cellprofiler (b).

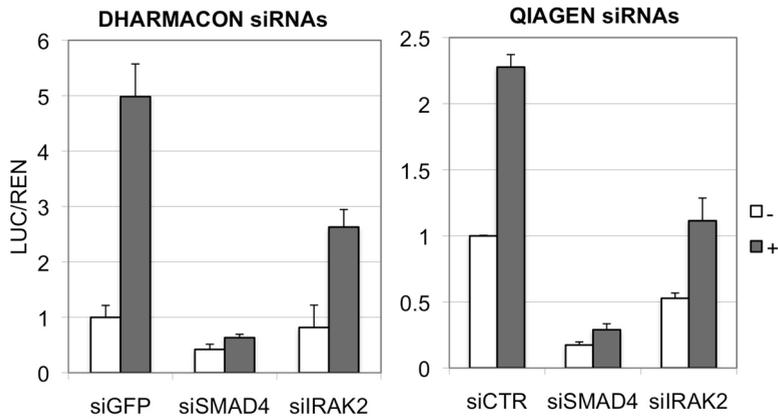
target' hits in order to determine the nuclear/cytoplasmic ratio of SMAD2/3 in presence of TGFβ. A clear reduction in SMAD2/3 nuclear accumulation was measured in cells transfected with siRNAs against *TGFB1* and *TGFB2*. In addition, we measured a lower SMAD2/3 nuclear/cytoplasmic ratio for cells transfected with siRNA pools against *IRAK2*, *PRKACB*, *TNK1* and *STK22B* (fig. 4b). This suggests that *IRAK2*, *PRKACB*, *TNK1* and *STK22B* function upstream or at the level of

SMAD2/3 translocation in the TGFβ pathway. For *PKIB* the SMAD2/3 translocation seems to be intact suggesting that *PKIB* inactivates the TGFβ target gene activation at a lower level.

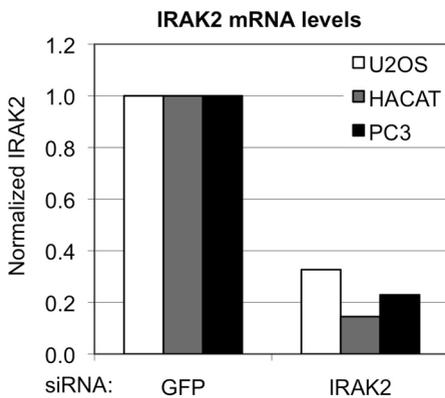
IRAK2 is a genuine player in the TGFβ signaling cascade

As can be seen in figure 3, only knockdown of *IRAK2* expression affected all bona fide TGFβ target genes tested, which was accompanied by reduced nuclear

A



B



C

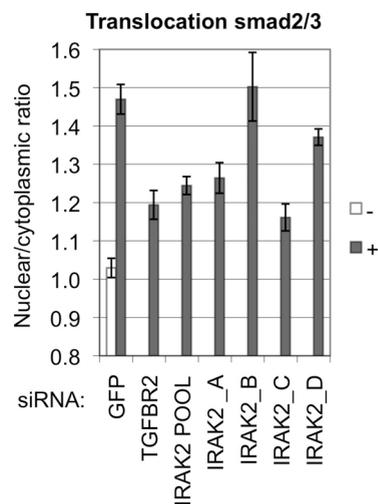


Figure 5

IRAK2 is a genuine regulator of TGFβ signaling

U2OS cells were transfected with CAGA₁₂-Luc and TK-Renilla. Subsequently, Dharmacon and Qiagen siRNA pools were reverse transfected and the cells were treated with TGFβ (+) for 14 hrs or left untreated (-). Renilla normalized luciferase counts are plotted on the y-axis and siRNAs against GFP and SMAD4 were used as negative and positive controls respectively (a). U2OS, HaCaT and PC3 cells were transfected with a GFP siRNA or the Dharmacon siRNA pool against IRAK2. The mRNA levels of the IRAK2 were determined by quantitative PCR and were normalized against the reference genes RPL13 (U2OS) or GAPDH (HaCaT and PC3) (b). PC3 were transfected with the separate siRNAs and the siRNA pool (both from Dharmacon) against IRAK2 and treated with TGFβ for 1 hr (+). The negative control, siGFP was also tested in non-treated condition (-). Immunofluorescence for smad2/3 was performed and the images were quantified with CellProfiler (c).

translocation of SMAD2/3. Therefore, we decided to perform an additional validation round and a more in-depth analysis on the function of IRAK2 in the TGF β signaling pathway. Previously, IRAK2 (IL-1R-associated kinase) was described to play a role in Toll like receptor signaling [21].

As an extra round of validation we tested if siRNAs targeting *IRAK2* obtained from a different vendor (QIAGEN) could also repress a TGF β responsive reporter. The new pool of siRNAs contains siRNAs duplexes that target different sequences in the *IRAK2* transcript. When we transfected these siRNAs we again observe repression of the TGF β responsive reporter.

Furthermore we tested in different cell-lines if the *IRAK2* siRNA pool that was used in the primary screen confers knockdown of *IRAK2* mRNA. In all cell-lines used reduced *IRAK2* mRNA levels were measured in the cells transfected with *IRAK2* siRNAs (fig. 5b). Subsequently we determined if separate siRNAs targeting *IRAK2* could also block the translocation of SMAD2/3. For the two siRNAs (A and C) that can repress the TGF β responsive reporter we could also show a decrease off SMAD2/3 nuclear translocation (fig. 5c).

IRAK2 knockdown affects SMAD2, but not SMAD3, translocation to the nucleus

As shown earlier knockdown of the identified hits has a clear effect on the TGF β induced translocation of SMAD2/3. However it must be noted the antibody used in the

immunofluorescence assay (fig. 4) detects both the SMAD2 and SMAD3 proteins. This can potentially lead to misinterpretation of the results as the individual contributions of SMAD2 and SMAD3 cannot be determined. For this reason we measured the effect of *IRAK2* knockdown specifically on SMAD2 and SMAD3 individually. Therefore we transfected PC3 cells with either control or *IRAK2* siRNAs and after incubation treated the cells with TGF β for 1 hour. Nuclear and cytoplasmic extracts were prepared and the lysates were analyzed by western blot using antibodies that can specifically detect either SMAD2 or SMAD3 (fig. 6a). In control transfected cells (siRNA GFP) a regular translocation of SMAD2 and SMAD3 can be observed after treatment with TGF β . Strikingly in cells that were transfected with *IRAK2* siRNAs showed a normal translocation of SMAD3, but an impaired translocation of SMAD2. This points into a specific role for *IRAK2* in the activation of SMAD2.

IRAK2 knockdown impairs SMAD2 but not SMAD3 phosphorylation

SMAD2/3 translocation is preceded by a phosphorylation by the TGF β receptors [22-24]. For this reason we measured the level of phosphorylation of both SMAD2 and SMAD3 upon *IRAK2* knockdown. PC3 cells were transfected with siRNAs targeting GFP and *IRAK2* and incubated for 48 hours. Transfected cells were subsequently treated with TGF β for 1 hour. Protein lysates were prepared and analysed by western blot. No change in total

levels of either SMAD2 or SMAD3 could be detected while a reduction in phosphorylated SMAD2, but not SMAD3, was observed. This supports the notion that IRAK2 is specifically required for SMAD2 activation by TGF β .

IRAK2 knockdown abrogates the TGF β induced cell cycle arrest

Knockdown of *IRAK2* impaired the TGF β target gene activation of *MYC*, *PAI-1*, *p21^{CIP1}* and *SMAD7* (fig. 3). At least three of these genes are involved in cell cycle regulation (*MYC*, *PAI-1* and *p21^{CIP1}*) and it has been shown that *p21^{CIP1}* and *PAI-*

1 are required for a TGF β induced proliferative arrest [25, 26]. For this reason we setup an experiment to test if *IRAK2* is also required for a TGF β induced cell cycle arrest. TGF β is known to induce a G1 cell cycle arrest and consequently fewer cells will enter the DNA replication Phase (S phase). This arrest can be clearly measured in the HaCat cell-line which is derived from human keratinocytes. As expected a TGFBR2 targeting siRNA pool can block the proliferative arrest. Moreover, we also observed that knockdown of *IRAK2* can also partly block the G1 cell cycle arrest (fig. 6c).

Discussion

In this study we describe the identification of new modulators of the TGF β pathway through the screening of a siRNA library targeting kinases and kinase related genes. Data analysis of the screen revealed a relatively large number of genes that could either repress or activate the TGF β responsive reporter. Somewhat surprising was the fact that the data-distribution is exponential instead of linear. However, this was also observed in two previously performed reporter based RNAi screens [13, 27]. Some RNAi screening efforts have reported high levels of 'off-target' effects caused by aspecific suppression of mRNAs [28, 29]. Therefore we were pleased to find that about 70% (11 out of 16 genes) of the hits tested could be indicated as 'on target' [19]

Observations made in

reporter assays can be are not necessarily reflecting endogenous pathway activation. Therefore we tested if the 5 'on target' hits that repressed the reporter also repress endogenous target gene induction. This experiment was performed in a different cell line than the original U2OS-CAGA to excluded cell type specificity of the identified hits. For all 5 'on target' hits impaired activation of two or more endogenous target genes was observed. The fact that not all 5 hits show a full repression on all TGF β target genes can be explained by various previously reported observations. For instance the fact that the ratio of SMAD2, 3 and 4 dictates the selectivity for certain target genes [30-33]. In addition the availability of SMAD co-factors can also determine the specific regulation of subsets of TGF β target

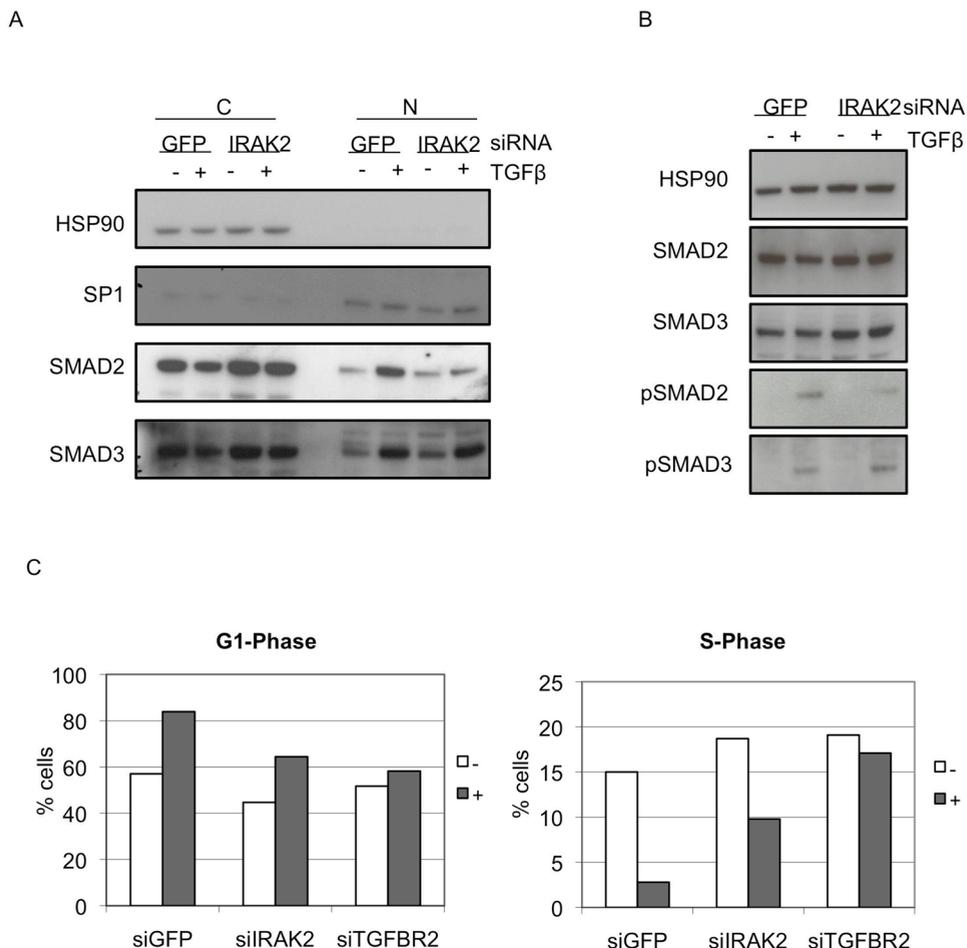


Figure 6

IRAK2 knockdown impairs SMAD2 and SMAD3 translocation and phosphorylation

PC3 cells were transfected with siGFP and IRAK2 siRNAs (siRNA pool) and cells were treated with TGFβ (+) for 1 hr or left untreated (-). Nuclear and cytoplasmic fractions were immunoblotted for HSP90; cytosolic loading control, SP1; nuclear loading control and antibodies specific for SMAD2 and SMAD3 (a). To study the SMAD2 and 3 phosphorylation whole cell lysates were immunoblotted for HSP90 (loading control), total SMAD2 and SMAD3 protein and with phospho-SMAD2 (Ser465/476) and phospho-SMAD3 (Ser423/425) antibodies (b). HaCaT cells were transfected with siGFP, TGFBR2 or IRAK2 siRNAs (siRNA pool) and cells were treated with TGFβ (+) for 24 hrs or left untreated (-). The cells were fixed and stained with propidium iodide. Cell cycle profiles were measured and the amount of cells in G1 phase and S phase is plotted.

genes [3]. The fact that our newly identified hits can regulate the TGF β dependent transcription of certain TGF β targets suggests that these genes indeed have a role in the TGF β pathway.

The TGF β /SMAD signaling pathway can be regulated at many different levels, co-factors that regulate SMAD dependent transcription, nucleopore proteins assist in SMAD nuclear accumulation and of course the phosphorylation by the TGF β receptors. Strikingly for four out of five of the newly identified modulators of TGF β signaling (IRAK2, PRKACB, STK22B and TNK1) we observed a defective SMAD2/3 translocation. This points into a direction for these genes to be function upstream of the SMAD translocation event.

IRAK2 is specifically required for SMAD2 activation

When we tested the effects of all newly identified genes on endogenous TGF β target genes only *IRAK2* knockdown impaired the regulation of all tested TGF β target genes. Further analysis showed that *IRAK2* seems specifically required for the TGF β dependent phosphorylation and subsequent translocation of SMAD2. Therefore it is expected that the observed effects of *IRAK2* knockdown at the CAGA₁₂-Luc reporter are also caused by an impaired activation of SMAD2. However several studies have reported that SMAD3 is responsible for the majority of the TGF β induced phenotypes and that SMAD2 is often dispensable [32-34]. More recently it was reported that under some conditions SMAD2

indeed plays a critical role in transmitting TGF β signals from the cell membrane to the nucleus [35]. More experiments are required to fully understand the mechanism of the loss of SMAD2-phosphorylation in cells with knockdown of *IRAK2*.

IRAK2 and SMAD2: connecting IL-1 and TGF β signaling

IRAK2 is part of a family of four IL-1R-associated kinases (IRAKs) and it was previously predicted that *IRAK2* does not contain an active kinase domain [36, 37]. As it's name suggest *IRAK2* has been found downstream of the IL-1R in a complex with TRAF6 and MyD88 [38]. It was only recently, unveiled that *IRAK2* also has a functional role in Toll like receptor signaling [21, 39]. Our observation that *IRAK2* ablation leads to an impaired TGF β response potentially suggests a possible interaction between TGF β and IL-1/TLR signaling. This is supported by various previously performed studies. For example the fact that *IRAK2* was found in a luminescence based interactome screen to interact with both SMAD2 and SMURF1 [12]. In addition it was recently shown that TRAF6, which interacts with *IRAK2*, mediates TGF β dependent activation of JNK and p38. This effect was reported to be SMAD independent and which was proven by the fact that TRAF6 knockdown does not lead to activation of a TGF β responsive reporter [40]. Finally it was shown that stimulation of cells with IL-1 β leads in many cases to phosphorylation of SMAD2 and subsequent target gene activation [41]. Taken together our and others

observations indication cross talk between two important cellular signaling pathways involved in immunity and other processes.

Methods

Cell lines & culture conditions

U2OS, HaCaT and PC3 cells were cultured in DMEM supplemented with 10% FCS, penicillin, streptomycin and glutamine. All cells were cultured at 37°C in 5% CO₂.

Generation of stable reporter cell line

U2OS cells were transfected using calcium phosphate with the TGFβ responsive reporter pGL3-CAGA₁₂-Luc and a puromycin resistant plasmid pBabe-puro in a ratio 10:1. Next the cells were sparsely and selected with 2 μg/ml puromycin. Subsequently, colonies were picked and tested these for TGFβ dependent induction of luciferase signal.

siRNA transfection

Cells were reverse transfected with siRNAs according to manufacturers instructions (Dharmacon) (Day 1). Dharmafect 1 (Dharmacon) was used for U2OS cells and Dharmafect 2 (Dharmacon) for HaCaT and PC3 cells. At day two penicillin and streptomycin was added. TGFβ (200 pM) was added overnight on day 3 (U2OS) or for 24 hrs (HaCaT). For PC3 cells TGFβ (200 pM) was added on day 4 for 2 or 8 hrs in order to assay target gene activation or 1 hr for the SMAD2/3 translocation assay.

Human kinase siRNA screen

Cells with stably integrated TGFβ responsive reporter were reverse transfected in 384 well plates in triplicate with the human kinome library of Dharmacon. Dharmafect 1 (0.1 μl per 384-well) was used as transfection reagent and the siRNA pools were transfected at a concentration of 50 nM. 3000 cells were seeded per well with a cell dispenser (Wellmate, Matrix). The transfection was performed in absence of antibiotics. Some 18 hrs after the transfection we added the penicillin and streptomycin. 48 hrs after transfection cells were stimulated with TGFβ (200pM is used in all experiments) for 14 hrs. Cell titer blue reagent (Promega) is used in order to determine the cell viability. After 1 hr incubation 560_{EX}/590_{EM} fluorescence is measured with a plate reader (Envision multilabel reader 2101, Perkin Elmer). Subsequently, medium was aspirated with a robot (STAR liquid handling workstation, Hamilton) and luminescence was measured with the same plate reader using Steady-Glo Luciferase (Promega).

The cell viability counts were used to calculate a viability score and siRNA pools that are less than 75% viable are not taken along in the further validation rounds. The luciferase counts were corrected for cell viability that gives the

normalized luciferase counts (NORM LUC). Subsequently, the NORM LUC counts are LOG2 transformed in order to get a normal distribution. The transformed NORM LUC counts are used to calculate the Z-score ($Z = (\text{luciferase measurement} / \text{average luciferase of the population}) / \text{standard deviation of the population}$) per plate in order to be able to compare the different plates with each other. We did further validation on the siRNA siRNA pools that scored a $Z < -2$ or a $Z > 2$.

Validation of single siRNAs

The four separate siRNAs and the siRNA pool were tested in the U2OS cell-line with stable TGF β reporter. Two controls were taken along; GFP siRNA and MOCK (only transfection reagent). All experiments were performed three times in using quadruplicate transfection and one representative experiment is shown. For the heatmap representation data was normalized to GFP and the counts were LOG2 transformed. The heatmap was created with TM4 software [42].

Immunohistochemistry to quantify SMAD 2/3 translocation

Cells were cultured in 96 or 384 well plates. Formaldehyde was used for fixation of the cells and we permeabilized with 0.2% Triton X-100. Subsequently, samples were blocked with 5% BSA in PBST (0.05% Tween 20 in PBS). A SMAD2/3 (BD Transduction Laboratories, 610842) specific 1st antibody was used and subsequently a mouse FITC 488 conjugated

(Alexa Fluor 488, Invitrogen) secondary antibody. The cells were counterstained with DAPI in order to define the position of the nuclei. Readout was performed with a high content imager (Pathway 855, BD biosciences) using a 20x objective (Olympus). CellProfiler software [20] has been used to quantify the nuclear/cytoplasmic SMAD2/3 ratio of all individual cells per well.

Western blotting

Cell lysates were separated using 4-12% Bis-Tris gels (Nupage, Invitrogen). Proteins were transferred to PVDF membrane and incubated with primary antibody as indicated. Primary antibodies were detected using a secondary HRP-conjugated antibody. Antibodies used for these studies: Hsp90 (Santa Cruz H-114, sc-7947), SP1 (Santa Cruz PEP 2, sc-59), SMAD2 (Cell Signaling (L16D3) #3103), SMAD3 (Cell Signaling (C67H9) #9523), p-SMAD2 ser465/467 (Cell Signaling #3101) p-SMAD3 ser423/425 (Cell Signaling (C25A9) #9520).

Quantitative PCR

Total RNA was isolated using TRIzol (Invitrogen). From the total RNA cDNA was generated using Superscript II (Invitrogen) using random primers (Invitrogen). cDNA was diluted and QRT reaction was performed using FAST Cyber green (Invitrogen) with specific primers (Supplementary table 1). All QRT reactions were run in parallel for RPL13 or GAPDH to control of for input cDNA. The QRT reactions were run at a fast Real Time PCR system (AB7500, Applied Biosystems).

Cell-cycle analysis

For fluorescence-activated cell sorting (FACS) analysis, siRNA transfected HaCaT cells that were TGF β treated for 24 hrs are fixed, stained and assayed as described previously [43].

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Supplementary tables and figures

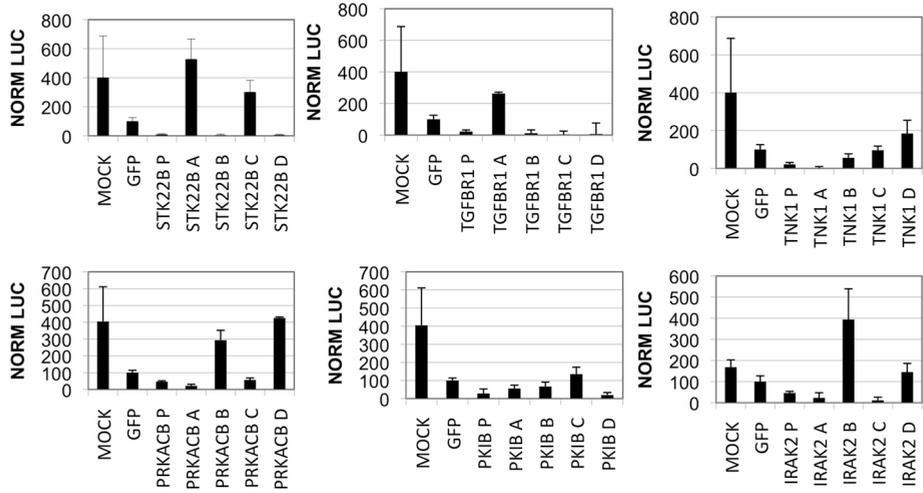
siRNA POOL	NCBI RefSeq	AVG COUNTS	STDEV	Z score	Hitsort and number
TGFBR2	NM_003242	445	64	-3.4	REPRESSOR REPORTER 1
LOC91807	NM_182493	570	195	-3.2	REPRESSOR REPORTER 2
STK22B	NM_053006	714	122	-2.9	REPRESSOR REPORTER 3
TGFBR1	NM_004612	765	101	-2.8	REPRESSOR REPORTER 4
SGKL	NM_013257	908	214	-2.7	REPRESSOR REPORTER 5
PKIB	NM_032471	1037	267	-2.5	REPRESSOR REPORTER 6
MYLK	NM_005965	1098	590	-2.4	REPRESSOR REPORTER 7
PRKACB	NM_002731	1191	403	-2.4	REPRESSOR REPORTER 8
RIPK1	NM_003804	1219	329	-2.3	REPRESSOR REPORTER 9
GALK1	NM_000154	1233	123	-2.3	REPRESSOR REPORTER 10
SNRK	NM_017719	1315	124	-2.2	REPRESSOR REPORTER 11
IRAK2	NM_001570	1359	418	-2.2	REPRESSOR REPORTER 12
TNK1	NM_003985	1379	660	-2.2	REPRESSOR REPORTER 13
XYLB	NM_005108	1396	276	-2.2	REPRESSOR REPORTER 14
SMG1	NM_014006	1594	546	-2.0	REPRESSOR REPORTER 15
PACSN1	NM_020804	1612	311	-2.0	REPRESSOR REPORTER 16
C9ORF12	NM_022755	1677	935	-2.0	REPRESSOR REPORTER 17
RAPGEF3	NM_006105	236250	35033	3.5	ACTIVATOR REPORTER 1
AKAP11	NM_016248	185965	72124	3.2	ACTIVATOR REPORTER 2
MAK	NM_005906	158950	33275	3.0	ACTIVATOR REPORTER 3
MAP3K10	NM_002446	144278	5978	2.9	ACTIVATOR REPORTER 4
ADRBK2	NM_005160	115431	9590	2.7	ACTIVATOR REPORTER 5
FLJ25006	NM_144610	111246	7961	2.6	ACTIVATOR REPORTER 6
AK5	NM_012093	95504	57637	2.5	ACTIVATOR REPORTER 7
SRC	NM_005417	84798	5495	2.3	ACTIVATOR REPORTER 8
MAPK10	NM_002753	84297	2516	2.3	ACTIVATOR REPORTER 9
ANKRD3	NM_020639	79917	17361	2.3	ACTIVATOR REPORTER 10
AATK	XM_375495	77166	25618	2.2	ACTIVATOR REPORTER 11
PPP2CB	NM_004156	75428	17818	2.2	ACTIVATOR REPORTER 12
MAPK8IP1	NM_005456	73987	26314	2.2	ACTIVATOR REPORTER 13
AVPR1B	NM_000707	70746	5557	2.1	ACTIVATOR REPORTER 14
CSNK2A2	NM_001896	66154	13509	2.1	ACTIVATOR REPORTER 15
ACVRL1	NM_000020	64707	12487	2.0	ACTIVATOR REPORTER 16
FLJ23356	NM_032237	63775	4867	2.0	ACTIVATOR REPORTER 17
PRPS2	NM_002765	63347	6626	2.0	ACTIVATOR REPORTER 18
PFKP	NM_002627	62607	4563	2.0	ACTIVATOR REPORTER 19
GCK	NM_000162	62005	5789	2.0	ACTIVATOR REPORTER 20

10666 **AVG all values**

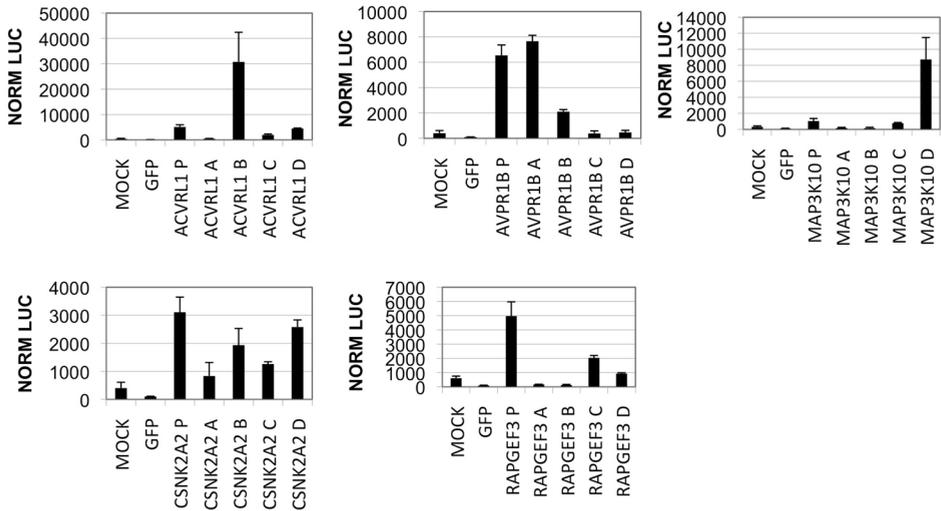
Supplementary table 1

Overview of the top siRNA siRNA pools that repress and activate the TGF β responsive reporter with a Z score respectively <-2 or >2 .

A



B



Supplementary figure 1

Validation of four separate siRNAs targeting the outliers of the screen

The four separate siRNAs that form the siRNA pool (P) were tested separately (A, B, C, D) on the stable TGFβ responsive luciferase reporter like in the screen. MOCK and a GFP siRNA were taken along as negative controls. Normalized luciferase counts of hits that validate with two or more separate siRNAs as repressor (a) or activator (b) of the reporter are plotted.

CHAPTER VII

General discussion

General discussion

The origin of functional genomics

It was not until the 1940s that discoveries were made which established that genes are the carriers of genetic information [1]. Subsequently, it was shown that this genetic information can be transformed into a biochemical action through the synthesis of proteins [2]. Historically, functional genomics has been the study of gene function through the generation of mutant alleles. This can be a gain of function mutant allele by over-expression of the wildtype coding sequence or a cDNA containing an activating mutation. Loss of function phenotypes can be generated through inactivating mutations or deletions.

Functional genomics were instrumental in the early searches for cancer genes. Many oncogenes were initially identified through cell fusion or chromosome transfer [3-5]. Improvements of gain of function genetic screens included the generation of retroviral cDNA libraries that can be used for the more specific over-expression of single cDNAs [6]. Many different screens have been performed using retroviral cDNA libraries. Some identified novel human oncogenes as *TBX2*, *TBX3*, *BCL6* and *TWIST* & *DERMO* [7-10]. However, also in other fields of research these libraries have proven their use, i.e. through the identification of the cellular receptor for the Ebola virus [11].

Loss of function can be brought about by different techniques to inactivate genes, i.e. chemical mutagenesis [12, 13], random insertional mutagenesis using retroviruses [14] and conventional knockout generation through homologous recombination [15, 16]. The discovery of RNAi has revolutionized the opportunities to perform loss of function screens in model organisms ranging from nematodes to mammals.

Building RNAi collections

Immediately after the discovery of vector-based RNAi, many efforts were started to create collections of shRNA vectors to perform genetic screens. Different methods have been established to build RNAi libraries. The most common method uses the annealing of a set of complementary oligonucleotides that contain the shRNA sequence. We were among the first labs to create a large shRNA library to be used in human cells [17-19]. This library has subsequently been used efficiently to identify genes in many different cancer related pathways [20-23]. Advantages of using the oligo-based construction of shRNA libraries are that the composition of the library is known and can be verified. On the other hand this requires substantial investment, not only financially, but also in labor and automation.

An alternative approach to shRNA library construction was developed independently by three labs [24-27]. Instead of designing shRNAs,

an enzymatic reaction is used to generate shRNA-expressing vectors. Both approaches make use of a restriction enzyme (Mme I) that cuts DNA 20 nt from its recognition site. Using this enzyme in combination with linker DNA fragments it is possible generate an shRNA cassette that can be cloned into a conventional shRNA producing plasmid. The major advantage of this approach is that shRNA libraries can be generated in an unbiased manner and at relatively low cost.

In addition, two individual efforts have been described that generated libraries consisting of shRNA plasmids that contain a random targeting sequence [28, 29]. Like the enzymatic-generated libraries this is a very cost effective approach. One mayor drawback is the complexity of the library, which can be as high as 1×10^9 for the case of a random 19-mer. This severely hampers the cell culture and shRNA identification processes of a screening effort. Even by today's standards of high throughput sequencing this is a formidable number.

In addition, many collections of siRNAs have been created. This is mainly done through commercial efforts, as it requires extensive infrastructure for production and storage. However siRNAs can also be obtained through the enzymatic cleavage of long dsRNAs. This esiRNA (for: endoribonuclease-prepared short interfering RNA) technology is a relative easy approach to constructing siRNA

libraries at low cost en little automation required. EsiRNAs have subsequently been used for some elegant screens to find genes that function in the mammalian cell cycle [30, 31]

Screening the p53 pathway

In this thesis, three loss-of-function genetic screens using RNAi have been described to identify novel regulators of the p53 tumor suppressor protein. These screens were based on the bypass of a cell cycle arrest that is induced by p53. In the first approach we used a genetically modified cell line that was screened with an shRNA library. The active shRNAs were identified by sequencing of the shRNAs in the colonies that escaped p53-induced growth arrest (Chapter 1). In the second approach, we treated cells with a MDM2 inhibitor and performed an RNAi barcode screen to find shRNAs that mediated bypass of the arrest (Chapter 2). Finally, we used again the cell line from first screen, but now screened the entire library with the shRNA barcode technique. Together, these three genetic screens have led to the identification of 9 genes (table 1) that, when suppressed, allow proliferation under activated p53 conditions.

Many other approaches to perform genetic screens to study the p53 pathway have been reported. Some used antisense RNA libraries instead of RNAi libraries to screen for bypass of a p53-induced cell cycle arrest [32-34]. Other approaches were based on p53 reporter plasmids, these screens have been

performed in both gain- and loss-of-function settings including the use of microRNA libraries [34-36]. Although these screens have identified a number of genes that regulate p53 function, very little overlap between our screening efforts and other approaches can be seen. This can be attributed to differences between the screening systems used, including libraries and cell types. In addition most screens have not been performed till full saturation. In other words, no conclusion can be drawn from genes that were not positively identified. Nevertheless, it is striking that we and others have independently identified two genes of the family of s-adenosyl-homocysteine hydrolases to be essential for the p53 induced cell cycle arrest [18, 32]. It will be important to study the biochemical interaction of these enzymes with components of the p53 pathway in the future.

Clinical relevance of the novel identified p53-modulating genes

Although we have shown that the genes identified can override the function of p53 in *in vitro* assays, this does not directly mean that they are also involved *in vivo* carcinogenesis. Further analysis is required to investigate whether these genes are indeed functionally impaired in human cancer samples. This has been done for a number of the 9 genes identified through comparing the expression profiles of these genes between cancer and normal tissue samples [37]. From this study it can be concluded that the expression levels of *HDAC4*,

TIP60, *KIAA0828* and *RPS6KA6* are significantly down regulated in colon tumor samples. Although it is not shown in this study that the specific tumors with low expression retain a wild type p53 protein, this could be a putative mechanism of functional inactivation of p53 in these tumors.

Besides the suggestion that some hits are lower expressed is encouraging, the case for 53BP1, another hit in our screens, is much stronger. We identified that knockdown of *53BP1* makes cells insensitive to activation of p53 through the inhibition of the MDM2-p53 interaction by small molecules. The 53BP1 protein, which has been shown to interact with p53, is a mediator of the DNA damage response [38, 39]. Therefore it is believed that at least one of the functions of 53BP1 is to transfer the DNA damage signal from the DNA lesion to p53. This is supported by several studies that show that abrogation of the *Trp53bp1* gene in mice can lead to chromosomal instability and tumorigenesis [40, 41]. In support of a true tumor suppressive function it was shown that protein levels of 53BP1 are lower in human tumors that surrounding healthy tissue [42, 43].

One surprising finding was the fact that two enzymes with potentially opposing functions were identified in the same setting. These two enzymes, *TIP60* a histone acetyl transferase and *HDAC4* a histone deacetylase, are both involved in chromatin remodeling [44, 45]. For

both *HDAC4* and *TIP60* knockout mouse models have been created. Unfortunately in both cases the homozygous knockout presented a strong developmental phenotype, leading to death in the prenatal stage or shortly after birth, making it impossible to study tumor onset [46, 47]. Strikingly for *TIP60* a tumor suppressive function was observed in the heterozygous knockout mouse [46]. In addition the *TIP60* gene was also found to be essential to keep embryonic stem cells pluripotent [48].

The studies above show that genes identified through RNAi screening approaches can indeed have tumor suppressive functions. So far a true tumor suppressive phenotype has been observed for three out of the nine genes discovered by us. Obviously these propensities can only be fully uncovered by the use of mouse models. Although not pursued in the studies presented here, the use of shRNA plasmids *in vivo* can potentially speed up the validation of the genes identified in a screen [49]. Future studies are required to show if any of the other six genes also possesses a *bona fide* tumor suppressor function.

ARNTL: A role for the circadian clock in cancer onset or progression?

By screening a large shRNA library, we uncovered that the circadian clock regulator *ARNTL* (*BMAL1*) is essential for a p53-dependent cell cycle arrest (chapter 3). This observation points into the direction that circadian rhythm might be involved in p53 pathway

regulation and therefore tumor suppression. Support for this can be found in studies that show a tumor suppressive function of the *Period 2* circadian target gene [50]. In addition it has been shown that the timing of the cell cycle is also regulated in circadian fashion [51-53].

As we identified nine hits in the p53 pathway, the possibility exists that some of these hits regulate other's hits function. A putative connection between two hits could be found in a study that reported the involvement of *TIP60* in mediating cisplatin resistance [53]. Analysis of the promoter led to the identification of two E-boxes that were shown to be activated by the circadian regulators *CLOCK* and *BMAL1* (*ARNTL*) [53]. This opens up the possibility that the effect measured by the *ARNTL* knockdown is in effect a result of lower *TIP60* levels.

These biochemical findings are also reflected in some epidemiological and drugs response studies. For instance, it was reported that shift-workers have an increased risk of developing cancer [54, 55]. At this moment however, there is no consensus if the reported increase in cancer incidence can be attributed to disruption of circadian rhythm or other confounding factors. Another very interesting observation was the fact that efficacy and tolerability of chemotherapy depends on the time of the day administration [56]. This can at least partially be explained by circadian regulation of liver function [57]. It will be very interesting to see if this so called

chronotherapy can be expanded into a clinical setting.

RNAi drug screens: insight into mode of action and clinical response

Besides the identification of gene functions that were previously not associated with cancer, RNAi screen can also be used to give insight in drug responses. Two aspects of drug response can be studied namely, the identification of resistance factors and the investigation of mode of action of a given drug. We have applied RNAi barcode screening to identify genes that are essential for the cytotoxic effects of an acyl sulfonamide, a novel anti-cancer drug. When cells are treated with this drug they enter a G2 arrest and after some time will die through apoptosis. The screen yielded shRNA vectors targeting two genes, *RBX1* and *DDB1*. These two proteins can form a complex that has ubiquitin E3 ligase enzymatic activity [58, 59].

Some studies have previously shown that *RBX1* and *DDB1* are involved in the ubiquitination of cell cycle regulating proteins like *CDT1* [60]. Loss of *RBX1/DDB1* could therefore lead to increase of *CDT1* protein concentration. As *CDT1* is required for DNA replication this could be a mechanism of resistance. Another intriguing observation was the fact that the knockdown of *DDB1* by itself can shift the cell cycle distribution to the G2 phase of the cell cycle while it can also cause abrogation of a viral induced G2 arrest [61-63]. This shows that at least in some cases the *DDB1*

protein is involved in regulating the G2 cell cycle checkpoint, although the exact mechanism is poorly understood.

Besides the fact that genes identified through RNAi-based screening approaches give insight in the mechanism of action of a drug, they can also be used as potential treatment response indicators. This has been successfully attempted for drugs currently used for the treatment of cancer patients [23, 64]. For *RBX1* and *DDB1* it remains to be seen if they can be used as biomarkers of clinical response in patients treated with acyl sulfonamide anti-cancer drugs. This depends on many factors, including whether a reliable method of detection of *RBX1* and *DDB1* can be developed.

As described above, the development of a diagnostic biomarker from a gene identified from a genetic screen requires sizeable amount of validation and optimization. Performing more specified phenotypic screens can circumvent some of this optimization process. Many currently-used biomarkers are based on the detection of the presence or absence of certain gene products by immuno staining, DNA FISH or RNA quantification. Designing screening techniques that make use of clinical detection modalities can potentially shortcut the development of clinical useful biomarkers.

Reporter based screening to identify novel TGF β pathway modulating factors

Countless cellular processes can influence cell viability and proliferation. For this reason it can be difficult to assign a specific function to genes identified through functional genetic approaches using “proliferation” as a read out of such screens. More specific phenotypes on the other hand can be very difficult to screen using phenotypic read outs. This can be circumvented by the use of reporters systems that reflect the activity of a certain pathway. This has been performed in model organisms with great success (examples: [65, 66]).

By performing a genome wide siRNA screen (data only reported for kinase screen in this thesis) in a cell line with an integrated TGF β responsive promoter, we have identified genes that were previously not known to be involved in the TGF β pathway. One major point of concern is the fact that it has been reported that ‘off-target’ effects are potentially responsible for the majority of hits isolated from these types of screens [67]. However other reporter screening efforts have been able to isolate genes that are very important in signaling pathways involved in cancer [68, 69]. We have identified genes that are candidates to be genuine regulators of the TGF β pathway. This is supported by the fact that we have also identified four *bona fide* players in the TGF β pathway (SMAD3/SMAD4/TGFBR1 and TGFBR2).

We have focused on the IRAK2 kinase that was identified to be essential for the TGF β response. This could

be determined both by reporter based assays, but also through incomplete induction of genuine TGF β target genes. The IRAK2 kinase was previously described to be involved in Interleukin-1 and Toll-like-receptor signaling [70, 71]. Some interplay between TGF β and IL-1 receptor signaling has been reported like the inhibition of IL-1R effects by the SMAD6 protein [72]. Recently an inverse effect was described, namely the interaction of TRAF6 protein with the TGFBR1 which lead to SMAD independent TGF β signals [73, 74]. As IRAK2 can bind to TRAF6, a mechanism can be envisioned in which IRAK2 is in proximity of the TGFBR1 facilitating SMAD phosphorylation.

Off-target effects in RNAi screens

As more RNAi screens are being performed and reported, some pitfalls also have become apparent. One of these pitfalls is characterized by a-specific phenotypes that can be associated with knockdown of genes through RNAi, the so-called ‘off-target’ effect [67, 75, 76]. Unfortunately the appearance of these adverse effects is very difficult to predict and usually can only be circumvented by creating large numbers of RNAi molecules targeting the same transcript.

Both the effectiveness of knock-down and degree of ‘off-target’ effects seem to be related directly to the sequence of the siRNA or shRNA. Currently-used design rules consider properties as thermodynamic stability and sequence identity to create effective siRNAs [77, 78].

One way to improve the use of RNAi is to increase the understanding about which sequences produce a very efficient knockdown without inducing 'off-target' effects. This can be done by improving design rules that dictate which bases are allowed at certain positions combined with target sites in the mRNA.

An easier approach to increase the efficacy of hit identification through RNAi screening is the use of the creation of RNAi libraries containing many different RNAi molecules targeting every transcript (some efforts are under way [79]). This will allow the parallel identification of several RNAi molecules targeting a single transcript lowering the possibility that this observation is caused by an 'off-target' effect. This requires the design and construction of RNAi libraries that consist of somewhere between $3 - 10 \times 10^5$ RNAi molecules to cover a mammalian genome. The use of these types of libraries will need the development of novel screening technology to identify phenotype producing RNAi molecules from these libraries.

Do RNAi-based loss-of-function screens live up to our expectations?

The RNAi revolution [80] has changed the way researchers can design and perform experiments. As discussed previously, RNAi screens can be designed with the intention to identify drug targets. Up to now various screens have yielded a variety of genes that are involved in all types of processes

contributing to cancer pathogenesis. Very few of these findings have been transformed into successful treatment options. However given the time clinical development paths usually take, this is too early to call. One exception is the very nice translation of the outcome of an RNAi screen into clinical application by Brummelkamp and colleagues [81, 82].

Many screens do not have the objective to identify drug targets directly, but rather try to elucidate molecular mechanisms. One example is a duo of screens that were aimed to find essential genes in human cells [83, 84]. This is an excellent example of screens that could not be performed without the use of RNAi. In addition RNAi screens have elucidated drug-gene interactions for some widely used anti-cancer drugs: cisplatin and paclitaxel [85, 86]. Finally some preliminary screening efforts to identify synthetic lethal interactions with the well-known RAS oncogene have been performed [87, 88].

Taken together, over the last 8 years over 100 RNAi screens have been performed ranging in scale from a dozen genes to genome wide efforts. Through these efforts functions were assigned to hundreds of genes many of which were not described before. This shows that RNAi can be used with significant success in mammalian cell systems.

The future of RNAi screening in mammalian cells

Much advancement has been made

since the introduction of RNAi libraries in the cancer research field. The majority of RNAi screens that have been published up to date were limited to the screening of relative simple assays like cell viability or reporter assays. Many of these assays do not properly reflect the situation that is seen in *in vivo* tumors. To be able to identify genes that have a true relevance for tumors in patients it might be advisable to use readouts that better reflect the clinical situation.

One technical innovation that might pave the way to the screening of more complex and clinical relevant phenotypes is the so-called living cell microarray. This technique is based on the reverse transfection of cells with either cDNA or RNAi molecules that are deposited on a glass slide [89, 90]. The use of very small siRNA containing spots allows the simultaneous screening of up to 10,000 individual siRNAs on a single glass slide. Because the cells are growing on a glass slide this method is ideal for assays based on immunohistochemical stainings with antibodies of interest. This allows the screening of endogenous processes like protein expression, localization and post-translational modifications. Furthermore it is possible to perform these screens in very high throughput with use of minimal amounts of reagents because of the small size of the glass slide. Another benefit is the fact that the cell microarray technique does not require extensive robotics and is relatively inexpensive.

Another way to screen more

complex phenotypes is by limiting the number of genes to be screened. Especially the screening of *in vivo* phenotypes is very attractive, but this is limited to very small sets of shRNAs. Determining which selection of genes to be screened is most promising can be done in many ways. However, to increase the chance of making a clinical relevant observation this is best achieved by using datasets obtained of human tumor specimens. So far, two elegant approaches have shown that this is indeed a feasible method to find cancer relevant genes [91, 92]. Further developments of these types of screens will require the use of sophisticated mouse models that can truly mimic human pathologies. Generation of these mouse models can be assisted by the use of DNA constructs carrying combinations of cDNAs and shRNAs [93, 94]. The use of these constructs allows the simultaneous expression of i.e. oncogenes while inactivating a tumor suppressor by the shRNA in the very same cells.

Other future application could be the functional analysis of patient material by RNAi to assess which genes are essential for survival of an individual tumor. By regular DNA sequencing and gene expression profiling it is possible to determine which genes are mutated or aberrantly expressed. However this does not necessarily indicate the specific dependency of a tumor on a certain cell-signaling pathway. It was recently shown that in some cases cells with identical oncogenic mutations differentially depend on downstream effectors. An example

of this situation was reported for the *PIK3CA* oncogene that was shown to activate either the AKT and SGK3 pathway when mutated [95]. By transfecting isolated tumor cells from patient with a *PIK3CA* mutation with siRNAs targeting either *AKT* or *SGK3* the specific dependency can

be determined. In the future these small-scale targeted RNAi based diagnostics could be very useful in guiding therapies in the right direction.

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APPENDICES

Summary

Samenvatting

Cirriculum Vitae

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Dankwoord

Summary

One of the characteristics of cancer is the occurrence of aberrant gene products. Many mutations both activating and inactivating are found in genes controlling the cell cycle and other processes that regulate survival of cells. Some of these mutated genes have been used as targets for cancer therapy. For the majority of human cancers however not adequate treatment regimens are available. It is therefore of great importance to find other genes that are involved in cancer pathogenesis which can subsequently be inhibited by still to be developed drugs. RNA interference (RNAi) is a technique that was recently adapted for use in mammalian cells and can be used to very efficiently suppress expression of specific genes. RNAi can be used to identify genes that are essential for cancer proliferation. The genes identified can potentially be used as drug targets. In addition to finding new targets for drugs RNAi can also be used to identify markers for drug response in tumors. These markers can be used to predict clinical responses to therapies of individual tumors.

This thesis describes the construction and screening of one of the first human RNAi libraries. The screens are performed using conventional and high throughput techniques to find novel cancer relevant genes.

The application of large scale RNAi screens requires the construction of collections of RNAi molecules. This was made possible by the discovery that RNAi can be mediated

through plasmid based techniques. In **chapter II** the construction of one of the first large scale collections of short hairpin RNAs (shRNAs) that targets 8000 human genes is described. This library is subsequently screened in a genetic cell model that recapitulates the function of the p53 tumor suppressor. Several genes are identified that when suppressed can abrogate the function of the p53 pathway. These genes are potentially themselves tumor suppressors in human cancer.

Besides screening genetic models RNAi can also be amended for the use of chemical induced phenotypes. Nutlin is an inhibitor of the MDM2 protein which is the protein that is responsible for the degradation of the p53 tumor suppressor protein. Inhibition of MDM2 leads to increase of p53 concentration which induces a cells cycle arrest. The RNAi library was used to find genes that are involved in this cell cycle arrest (**chapter III**). Through this screen it was shown that the 53BP1 protein was essential for this Nutlin induced cell cycle arrest. This was surprising as 53BP1 was previously reported to function upstream of p53.

RNAi screens can be performed in many different ways. Conventional screening options are often very labor intensive and time consuming. Innovative techniques that make use of microarray detection of shRNAs that produce a phenotype made the screening

of RNAi libraries much easier. By screening the same genetic cell system as in chapter 1 but now using the microarray technique a novel set of genes was identified (**chapter IV**). One of these genes is the circadian transcription factor ARNTL. This observation supports the notion that abrogation of the circadian clock might play a role in tumor suppression.

Another very interesting application of RNAi screening involves the testing of anti-cancer drugs. Many drugs currently used to treat cancer patients act through a mechanism that is poorly understood. Even more worrisome is the fact that many patients fail to respond to the administered drugs due to acquired or intrinsic resistance mechanisms. To increase the treatment efficacy of cancer patients it is therefore of great importance to be able to foretell if patient will or will not respond to a certain therapy. RNAi screens can be used to identify genes that mediate resistance and mode of action of cancer drugs. A novel cancer drug with unknown mechanism was tested through a shRNA barcode screen (**chapter V**). This led to the identification of two genes that are part of an ubiquitin E3 ligase complex that mediate resistance to the drug. These two genes can subsequently be developed as markers of response to this novel drug.

In addition to phenotypic assays based on cell proliferation RNAi screens can also be used to study cellular signaling pathways directly. The TGF-beta pathway is a pathway

that has a very diverse role in cancer onset and progression. In the first stages of cancer TGF-beta is reported to have a tumor suppressive function while later it can promote the metastasis process. Through a large scale siRNA single-well screen we have attempted to identify novel genes that regulate TGF-beta signaling (**chapter VI**). One of the genes identified encodes the IRAK2 kinase which was previously reported to be involved in IL-1 signaling. This finding shows that RNAi screening can lead to insight in crosstalk between signaling pathways involved in cancer.

More insight in the genes that contribute to cancer onset and progression can lead to the development of novel cancer therapies. In this thesis a series of screens using RNAi is presented showing the potential of RNAi in human cells. Genes were identified in genetic- and drug-screening efforts giving insight in biochemical pathways and drug responses. These genes will have to be tested in more clinically relevant cancer models to show their true involvement in the carcinogenesis process.

Nederlandse samenvatting

Een belangrijk kenmerk van kanker is het voorkomen van afwijkende genproducten. Zowel activerende als inactiverende mutaties zijn gevonden in genen die de cel-cyclus en andere processen reguleren. De inactivatie van gemuteerde eiwitten kan gebruikt worden om de tumorgroei af te remmen. Helaas is voor de meerderheid van de tumoren echter nog geen effectieve therapie beschikbaar. Daarom is het van groot belang om nieuwe genen te vinden die betrokken zijn bij het ontstaan en in stand houden van tumoren.

De functie van genen kan door middel van verschillende methoden worden onderzocht. Het uitschakelen van genen is een effectieve manier om de functie te achterhalen. Dit was echter lange tijd onmogelijk in menselijke cellen. Een nieuwe techniek genaamd RNA interferentie (RNAi) heeft het mogelijk gemaakt om specifiek genen en hun eiwit producten te remmen. Zo kan RNAi onder meer worden gebruikt om genen te identificeren die essentieel zijn voor de proliferatie van kanker cellen. Deze genen kunnen vervolgens worden gebruikt voor de ontwikkeling van nieuwe medicijnen. Naast het vinden van nieuwe doelwitten van medicijnen is het ook mogelijk om RNAi te gebruiken om indicatoren van klinische respons te vinden in individuele tumoren. Door deze indicatoren kan worden voorspeld of een tumor wel of niet op een bepaalde behandeling zal reageren.

Dit proefschrift beschrijft de constructie en screening van een van de eerste grote RNAi collecties voor gebruik in humane cellen. De beschreven screens zijn uitgevoerd middels conventionele en nieuwe technieken met het doel om nieuwe kanker genen te vinden.

Het screenen van grote aantallen genen in humane cellen vereist de constructie van een collectie van RNAi inducerende moleculen. Dit werd pas mogelijk nadat was ontdekt dat RNAi kan worden toegepast door middel van een plasmide dat een kort haarspeld RNA maakt. In **hoofdstuk II** wordt de constructie van een RNAi collectie die 8000 humane genen kan onderdrukken beschreven. Deze collectie is vervolgens gebruikt in een genetisch celweek model dat de activatie van het p53 tumor onderdrukkend eiwit simuleert. Een aantal verschillende genen die de activiteit van p53 kunnen blokkeren werd opgepikt door middel van deze screen. Het is mogelijk dat de opgepikte genen zelf een tumor onderdrukkende functie hebben.

Naast het gebruik van genetische cel systemen is het ook mogelijk om screens met chemische stoffen uit te voeren. Nutlin is een klein molecuul dat de functie van het MDM2 eiwit kan remmen. Het MDM2 eiwit is verantwoordelijk voor de afbraak van de p53 tumor suppressor. Onderdrukking van MDM2 functie leidt daarom tot een verhoogde concentratie van het p53 eiwit wat een remming

van cel cyclus tot gevolg heeft. De eerder beschreven RNAi collectie is vervolgens gebruikt om genen te vinden die betrokken zijn bij de remming van de cel cyclus onder invloed van Nutlin (**hoofdstuk III**). Middels deze screen werd aangetoond dat het 53BP1 eiwit noodzakelijk is voor Nutlin om de cel cyclus te kunnen stoppen. Deze observatie was enigszins verassend aangezien het 53BP1 eiwit voornamelijk een functie heeft in het activeren van het p53 eiwit na DNA schade.

Verscheidene methoden kunnen worden gebruikt voor het screenen van RNAi collecties. Gebruikelijke technieken zijn vaak arbeids- en tijds-intensief. Een nieuwe methode die gebruik maakt van de hybridisatie van shRNAs die een fenotype genereren op microarrays maken het uitvoeren van RNAi screens veel eenvoudiger. Deze techniek is toegepast op het zelfde genetische model systeem als in hoofdstuk I en heeft geleid tot de identificatie van een aantal nieuwe genen (**hoofdstuk IV**). Een van deze genen is de transcriptie factor ARNTL die de circadiane klok reguleert. Deze observatie ondersteunt een model waarin de circadiane klok een rol speelt in het onderdrukken van tumor vorming.

Naast de toepassing van RNAi in de zoektocht naar nieuwe kanker genen is het ook mogelijk om deze techniek toe te passen in het onderzoek naar medicijnen. Een groot probleem bij de behandeling van kanker patiënten is dat veel gebruikte medicijnen een zeer

bepaalde effectiviteit hebben. Dit wordt veroorzaakt door intrinsieke of verworven resistentie van de tumor tegen een bepaald medicijn. Om de effectiviteit van kanker therapie te vergroten is het daarom van groot belang om te kunnen voorspellen welke patiënten wel of niet zullen reageren op een bepaalde therapie. RNAi screens kunnen worden toegepast om genen te identificeren die betrokken zijn bij resistentie en mechanisme van actie van een anti kanker medicijn. Deze aanpak is toegepast op een nieuw medicijn met een onbekend werkzaam mechanisme (**hoofdstuk V**). Door middel van deze screen hebben we gevonden dat de inactivatie van twee eiwitten resistentie tegen dit medicijn kan veroorzaken. Deze twee eiwitten kunnen mogelijk worden ontwikkeld tot functionele biomarkers om de effectiviteit van dit nieuwe medicijn te voorspellen.

Naast het onderzoeken van cell groei fenotypen door RNAi screens is het ook mogelijk om signaal transductie routes direct te bekijken. De TGF-beta signaal transductie route heeft een ambivalente invloed op het ontstaan en progressie van tumoren. Het is beschreven dat in de eerste fase van tumorgroei TGF-beta een remmende werking heeft terwijl het later de metastase van tumoren lijkt te versnellen. Door het gebruik van een grote RNAi screen hebben we geprobeerd om nieuwe genen te vinden die nog niet in de TGF-beta waren geplaatst (**hoofdstuk VI**). Een van de genen die gevonden is, is het IRAK2 kinase dat betrokken is bij de signalering

van interleukine-1. Deze observatie laat zien dat RNAi screening connecties kan blootleggen tussen verschillende cellulair signaal transductie routes.

Inzicht in de genen die het ontstaan en de progressie van kanker reguleren kan leiden tot de ontwikkeling van nieuwe therapieën. In dit proefschrift wordt beschreven hoe RNAi kan worden gebruikt om kanker-relevante genen te vinden. Zowel het screenen van

genetische-modellen en modellen voor de werking van medicijnen worden beschreven. De genen die zijn gevonden zullen moeten worden getest in klinische relevante modellen om aan te tonen dat deze genen werkelijk functioneel betrokken zijn bij kanker.

Curriculum Vitae

Jasper Mullenders was born on November 17th, 1977 in Nijmegen. He graduated from Teylingen College, Noordwijkerhout in 1996. In the same year he started as a chemistry major at Leiden University. During his studies he performed several research projects. The first project was aimed to identify antibodies against the FSHD associated gene product FRG1 through phage-display technology using llama antibodies. This study was performed as a joint-venture between Leiden University and Unilever Research Vlaardingen under supervision of Hans de Haard, Silvère van der Maarel and Arn van den Maagdenberg. Subsequently he performed his second internship at the University of Southern California, Los Angeles. In this study he tried to find chromatin binding sites of the WRN protein. In January 2003 he started his PhD in the lab of René Benards at the Netherlands Cancer Institute. During his PhD he was involved in the construction and screening of large scale RNAi collections to identify novel cancer genes.

List of publications

IRAK2 is a novel modulator of the TGF-beta signaling cascade

Mullenders J, Fabius AW, Van Dongen MMW, Kuiken HJ, Beijersbergen RL and Bernards R

Submitted to Molecular Cancer Research

Loss of function genetic screens as a tool to improve the diagnosis and treatment of cancer

Mullenders J and Bernards R

Accepted for publication by Oncogene

Candidate biomarkers of response to an experimental cancer drug identified through a large-scale RNA interference genetic screen.

Mullenders J, Von der Saal W, Van Dongen MMW, Reiff U, Van Willigen R, Beijersbergen RL, Tiefenthaler G, Klein C and Bernards R

Accepted for publication by Clinical Cancer Research

A large scale shRNA barcode screen identifies the circadian clock component ARNTL as putative regulator of the p53 tumor suppressor pathway.

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Involvement of MINK, a Ste20 family kinase, in Ras oncogene-induced growth arrest in human ovarian surface epithelial cells.

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Kolfschoten IG, van Leeuwen B, Berns K, **Mullenders J**, Beijersbergen RL, Bernards R, Voorhoeve PM, Agami R. Cell. 2005 Jun 17; 121 (6):849-58.

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Berns K, Hijmans EM, **Mullenders J**, Brummelkamp TR, Velds A, Heimerikx M, Kerkhoven RM, Madiredjo M, Nijkamp W, Weigelt B, Agami R, Ge W, Cavet G, Linsley PS, Beijersbergen RL, Bernards R. Nature. 2004 Mar 25; 428 (6981):431-7.

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Jasper



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