A Genome-wide CRISPR screen unveils the endosomal maturation protein WDR91 as a promoter of productive ASO activity in melanoma

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SHORT TITLE

A CRISPR screen unveils protein modulators of ASO activity

ABSTRACT

Antisense oligonucleotides (ASOs) belong to promising therapeutic molecules for the treatment of neurologic, muscular and metabolic disorders. Several ASOs have been approved so far and more than a hundred clinical trials are currently underway covering a dozen therapeutic areas including cancer. Yet, the mechanisms of internalization, cell trafficking and action of these molecules remain poorly understood. Moreover, with only a small fraction of ASOs reaching the correct cellular compartment following systemic delivery, the majority of targeted diseases

requires recurrent injections of ASOs. A deeper understanding of these mechanisms would

guide the improvement of their potency and thus, reduce the amount of delivered ASOs and

their potential side-effects. Here, using a CRISPR screen, we investigated intracellular proteins

involved in ASOs efficiency using a whole genome approach and identified several potential

regulators which could significantly impact ASOs potency in melanoma cells. From these

proteins, we validated WD Repeat Domain 91 (WDR91), a regulator of endosomal maturation,

as a modulator whose depletion significantly inhibits ASO productive activity. This study

provides the first list of ASO modulators using a biologically relevant functional assay to

estimate the role of these proteins. In conclusion, these data could lead to a better understanding

of the mechanisms favoring productive uptake or improved endosomal escape of ASOs.

INTRODUCTION

Antisense Synthetic Oligonucleotides (ASOs) belong to a class of attractive therapeutic

compounds for numerous diseases. ASOs modulate cellular target gene expression through

Watson-Crick binding to complementary RNA molecules and, according to their type, act by

either promoting a RNAse-H1 mediated RNA degradation (Gapmers - GMs) or through a steric

blocking mechanism (mixmers and target site blockers – TSBs) leading to three major modes

of action: inhibition or activation of gene-expression and splicing modulation[1]. ASOs have been

developed for the treatment of different genetic disorders and they can be translated to

personalized therapies[2]. ASOs are specially taken up by fast growing cells[3] and, among

numerous advantages, bypass the current bottleneck regarding the targets that are considered

undruggable with traditional small molecule inhibitors[4]. Several ASOs are currently approved

by the Food and Drug Administration (FDA) for genetic and rare diseases[5,6] and several phase

II and III studies are ongoing in the oncology therapeutic area[7].

Although ASOs promise a great leap forward in future cancer treatments, their utilization

suffers from major hurdles. Among them, a lack of tissue specific targeting[8,9] , poor cellular

uptake[10] and the need to escape from the endo-lysosomal pathway to exert their role in either

the cytoplasm or nucleus of the cells[11,12]. Moreover, the mechanisms of internalization, cell

trafficking and action of these molecules remain poorly understood. A small fraction of ASO

reaching the right cellular compartment and target following systemic delivery[13,14] leads to

treatments consisting of high doses, recurrent injections and thus, significant accumulation in

other non-targeted cells and organs with consecutive toxicities[15]. It is therefore essential to

better understand the fate of internalized ASOs and their intracellular route and mode of action.

Such deeper characterization in different cell lines and with different ASO types and

chemistries would help in the rational design and improvement of therapeutic ASO strategies

in future clinical applications. Several studies have demonstrated that the fate of internalized

phosphorothioate (PS)-containing ASOs was determined by intracellular interacting

proteins[16,17,18]. Even if a clear mechanism is still to be fully understood, around 80 intracellular

proteins have been identified and this protein interactome appears to influence the

pharmacological activities and potential toxicities of PS-ASOs by acting on their uptake and

distribution. It is also worth noting that many other proteins that bind to ASOs have no effect

on their activity. PS-ASOs are internalized and processed through the endocytic pathway[3,19],

but proteins can modulate endosome traffic and maturation without interacting directly with

oligonucleotides. Previous studies have investigated the modulation of intracellular pathways

to increase the productive delivery and activity of oligonucleotides and to further unveil the

critical molecular factors that contribute to nucleic acids pharmacological effects[20]. Among

these, modulation of endocytic recycling[21,22], multivesicular bodies' (MVBs) fusion with

lysosomes[23], endosomal escape[24] and nuclear shuttling[25,26] were explored. All these strategies

involve the use of either genetic or non-genetic perturbations and have proven to be successful

in many *in vitro* and *in vivo* studies. ASO-interacting proteins have been mostly characterized

by *in vitro* studies using pull-down experiments on cell lysates[27,28] but such method lacks

physiological relevance as the intracellular membrane's integrity is not preserved and could

lead to many binding artefacts. Furthermore, pull-down studies may highlight some important

ASOs protein modulators but only allow the identification of direct interactants. To circumvent

these issues other authors recently used proximity biotinylation assay to highlight

oligonucleotides interactome in living cells and in pharmacologically relevant conditions[29].

Clustered Regularly Interspaced Short Palindromic Repeats (CRISPR) screen is a powerful

genetic perturbation method that can be used for functional genomic studies, by activating or

silencing genes[30]. Then, it can be implemented to identify ASOs direct and indirect modulators

in a more physiological state and preserving the cell membrane's integrity. This technique was

implemented in different studies to investigate modulators of dsRNAs[31], Antibody-Drug

Conjugates (ADCs)[32] or encapsulated mRNAs[33], but to our knowledge, only one study

describes such a functional genomic screen (CRISPR gene activation) to uncover factors

enhancing ASOs activity[34].

In the present work, we used a genome-wide CRISPR screen strategy (CRISPR knockout), to

uncover proteins that modulate the potency of an anti-proliferative tricyclo-DNA (tcDNA)

based-ASO in a melanoma cell line (501Mel). The generation of the parental knockout cell

library was performed such as every single cell had a unique depleted coding gene. The library

was then treated with ASO, and sequencing was performed on the surviving (enriched or

depleted) cells. This analysis highlighted several candidates of interest (95 activators and 55

inhibitors). From the top candidates, the robustness of our assay also allowed to highlight the

proteins Ras-related protein Rab5C (Rab5C) and Component of Oligomeric Golgi Complex 8

(COG8) which are known positive regulators of ASOs productive trafficking and activity[35,36].

We unveiled the endosomal maturation protein WDR91 as a strong positive regulator of the

tcDNA based-ASO activity in this cell line. Activity modulation by WDR91 was validated

together with Annexin A2 (ANXA2), a well characterized endosomal protein which promotes

ASOs trafficking and productive activity in different cell lines[37]. The impact of WDR91 was

not validated on a splice switching ASO in a muscle cell line, highlighting a cell type-dependent

effect. Finally, this work provides a detailed source of potential positive and negative regulators

of ASO activity, coming from an unbiased screen and with a strong physiological relevance.

RESULTS

Development and *in vitro* validation of a tcDNA-ASO to inhibit 501Mel cells proliferation

with a target-site blocking mechanism

Previous work aiming at masking a microRNA (miRNA) target site on a microRNA sponge

(*TYRP1* mRNA) led to the test and validation of a commercially-designed Locked Nucleic Acid

(LNA) TSB (named TSB-T3 for Target-Site Blocking – T3). In this study, TSB-T3 significantly

induced the reduction of melanoma tumor growth *in vitro* and in 501Mel xenografts[38]. This

ASO was validated in five different cell lines and had a dose-response anti-proliferative

activity. TSB-T3 exerts its ASO masking activity by preventing the sequestration of the miR-

16 tumor suppressor by *TYRP1* mRNA and redirecting it towards its target-RNAs, to induce

their decay and subsequently reduce tumor proliferation[39] (Figure 1A). This miRNA

displacement mediated by a Target Site Blocker ASO represents a relevant assay to investigate

the proteins involved in ASOs efficiency. The ASO blocking activity is directly monitored

through an anti-proliferative effect, which has been validated *in vivo*.

In the present study, we decided to look for protein modulators of an ASO with a clinically

relevant chemistry. We thus designed and evaluated a new TSB-T3 with the same sequence but

with a full tcDNA chemistry and phosphorothioate (PS) backbone (tcT3). This class of

conformationally constrained ASO displays enhanced binding properties to DNA and RNA as

well as unique pharmacological properties and unprecedented uptake by many tissues after

systemic administration[40,41].

To compare both chemistries, 501Mel cells were reverse-transfected in 96-well plates with

either the LNA- or the tcDNA-ASO (named respectively T3 and tcT3). We deliberately used

high doses of ASOs (up to 70nM) as their blocking activity is based on the displacement of a

sequestered miR-16 by *TYRP1* mRNA which is, besides, highly expressed in melanoma cells

(with around 3200 copies per cell)[38]. After 72h, the cell density was measured by colorimetric

assay and normalized to a control ASO treatment (C1 or tcC1). As expected, we confirmed

previous results with the commercial reagent. Both T3 and tcT3 ASOs showed a dose-response

anti-proliferative activity and, interestingly, the tcDNA chemistry improved the ASO potency

at low doses (Figure 1B). This tcDNA-ASO was selected for the subsequent screening

experiment.

Genome-wide pooled sgRNA library generation, knockout library treatment with tcDNA-

ASOs and NGS sequencing

The CRISPR-knockout cell library was generated by transducing 501Mel cells with a pooled

lentiviral library which contains the Cas9 and sgRNAs targeting 19.114 human coding genes.

This lentivirus library contains 4 different guides per coding gene (total of 76.441 sgRNAs) and

1000 non-targeting control sgRNAs. A multiplicity of infection (MOI) of 0.4 was selected to

ensure that only few cells are transduced with more than one sgRNA and avoid unspecific

screening results[42]. With 76.441 sgRNAs and a desired coverage of at least 400 cells per guide,

a total of 32 million cells have been transduced and maintained during the screen.

After transduction, the cells were positively selected with antibiotic, expanded and subsequently transfected with either the tcT3 or -C1 ASOs. A final ASO concentration of 50nM was selected based on the former dose-response experiment which showed that the anti-proliferative effect reached a plateau at this dose (Figure 1B). The treatment was performed for three days. After this period, the difference in cell density between the treated and control conditions was greater than 50%.

At the end of treatment, the cells were expanded, pooled and a pellet of 100 million cells per condition was used for genomic DNA (gDNA) extraction and PCR amplification of the integrated sgRNAs in the 3 conditions (non-treated parental cell bank, tcT3 treated and tcC1 treated). The global workflow is depicted in Figure 2A.

After amplicons sequencing by NGS, a quality check was performed and only 115 sgRNAs were not detected over 76.441 in our cell library (0.15%), which validated proper conditions before ASOs treatment. The normalized reads count in each control and therapeutic ASO condition were plotted and provided a mean of 400-500 reads per guide as expected (Figure 2B).

The sequenced sgRNAs coming from the pool of surviving cells after ASO treatment provided information regarding the enriched or depleted ones. Thus, by comparing the sgRNAs enrichment or depletion in treated *versus* control condition and for each gene, we sought to identify proteins potentially involved in the regulation of ASO uptake, trafficking, release and guidance to their RNA-target in this melanoma cell line (Figure 2C).

Identification of tcT3 ASO activity regulators in 501Mel cells

To identify proteins that could impact the tcT3 activity in 501Mel cell line, the NGS sequencing raw data accounting for the total number of sgRNA reads per gene and per sample were

analyzed as follows. First, we used MAGeCK count to collect sgRNA read count information

from the tcC1- and tcT3-treated cells sequencing files. Then, we used MA Plots to score and

identify candidates based on the sgRNA read abundance (A value) and the read counts ratio

between the treated and the control condition (M value: fold change - FC). M and A values

were computed for each of the 4 sgRNAs targeting each individual gene (Figure 3A). From the

MA plots, top activator and inhibitor candidates were extracted after using a defined M cutoff

for each sgRNA per gene. The figure 3B represents MA plot examples from selected activator

and inhibitor candidates with applied M cutoff and with 4 (GGTLC2) or 2 relevant sgRNAs

(WDR91). Because of a short time of treatment (72h), a minimum FC of 1.5 was fixed between

the tcT3 and tcC1 read counts to highlight the best hits (activator candidates: fold change tcT3

read counts *vs* tcC1 read counts $\geq$ 1.5; inhibitor candidates: fold change tcC1 read counts *vs*

tcT3 read counts $\geq$ 1.5) (Candidates examples in Figure 3C). We opted for a short time of

treatment to avoid guide selection bias.

Several sgRNAs targeting the same gene might not have a consistent behavior. However, the

Brunello library has been designed with optimized sgRNAs and is known to outperform other

knockout libraries[43]. Indeed, the robustness of this library has already been demonstrated with

the ability to identify reliable candidates with only 2 effective sgRNAs per gene[43]. We thus

extracted activator and inhibitor candidates considering two, three or four out of four guides

meeting the defined M (FC) and A selection criteria.

As shown in Figure 4A and B (and in supplementary Table 1), this cutoff allowed to highlight

a set of 95 activator candidates and 55 inhibitors. Regarding the activators, 5 genes had their 4

respective sgRNAs fulfilling the corresponding criteria; 28 genes had 3 effective sgRNAs and

62 genes had 2 effective sgRNAs over 4. From the inhibitors, 3, 7 and 45 genes had 4, 3 and 2

effective sgRNAs, respectively. Each of the candidates have been represented by an average

FC value but a detailed table of each sgRNA and their respective M, A and FC values is

available in supplementary Table 1.

Gene set enrichment analysis using PANGEA (Pathway, Network and Gene-set Enrichment

Analysis) allowed to classify the activator and inhibitor candidates based on the cellular

component gene ontology[44] (Supplementary Figures 1 and 2). Interestingly, the activator

candidates with the highest fold enrichment are mainly clustered within proteins belonging to

the peroxisome and mitochondria compartments. Inhibitor candidates are mainly clustered

within proteins belonging to the Golgi apparatus and microtubules regulation.

For subsequent validation experiments, we decided to focus on protein activators of ASOs since

we were more interested in the mechanistic uptake and trafficking of ASOs in cells. From the

list of activators having 3 effective sgRNAs we highlighted COG8 and Rab5C, two known and

well characterized positive regulators of PS-ASOs productive trafficking and activity in

different cell lines[35,36]. This finding further supports the validation and robustness of our

screening experiment. As a first set of genes, we selected Elmo Domain Containing 1

(ELMOD1), Fumarate Hydratase (FH), Transcriptional Adapter 2-Beta (TADA2B) and

Williams-Beuren Syndrome Chromosome Region 16 (WBSCR16), which are from to the top

ranked candidates with 4 sgRNAs fulfilling the chosen criteria. We also selected WDR91 as it

is an important factor that participates in the negative regulation of phosphatidylinositol–3–

phosphate (PtdIns3P) allowing the early-to-late endosome conversion[45,46]. This first pool of 5

genes was considered as a nonbiased sampling of potential activator candidates to be further

investigated.

WDR91 promotes tcT3 ASO activity in 501Mel cells

An RNA interference experiment was designed to further validate the five selected candidates

as ASO activity enhancers (Figure 5A). After protein knockdown, the tcT3 activity should be

reduced resulting in increased cell proliferation compared to a control condition.

It was already well established in previous *in vitro* studies that the protein ANXA2 was an

important facilitator of PS-ASOs endosomal trafficking in various cell lines[37]. We thus first

evaluated the effect of ANXA2 downregulation in 501Mel cells proliferation with or without

tcT3 in comparison with a control siRNA. A western blot analysis confirmed the

downregulation of ANXA2 protein after cells treatment with an ANXA2 siRNA

(Supplementary Figure 3A). As shown in Figure 5B, *ANXA2* mRNA knockdown significantly

impaired the activity of tcT3 by comparison with a control siRNA.

As for ANXA2, each individual candidate (WBSCR16, TADA2B, FH, ELMOD1 and WDR91)

was downregulated with a corresponding siRNA (or a control siRNA) for 48h. The knockdown

efficiencies were confirmed by qPCR analysis (Supplementary Figure 3B – Apart from

ELMOD1, all knockdowns were shown to be significant enough to allow a relevant biological

effect). 501Mel cells were then reverse transfected with either the siRNA alone or a

combination of siRNA and tcT3. Four days after the second transfection, the cell density was

measured by a crystal violet colorimetric assay (Figure 5A). After normalizing the cell density

in each condition to the non-treated one, WDR91 and WBSCR16 showed a significant

inhibition of tcT3 anti-proliferative activity (Figure 5C and Supplementary Table 2). To discard

any bias introduced by a siRNA treatment non-specific effect on the proliferation, the cell

density in each siRNA + tcT3 condition was then normalized to each of the corresponding

single siRNA treatment. In these conditions, WDR91 knockdown cells showed the most

significant and reproducible inhibition of tcT3 anti-proliferative activity (Figure 5D).

Melanoma cells proliferation can also be promoted by the level of *TYRP1* mRNA expression[38].

qPCR analysis show that *TYRP1* mRNA expression level is not significantly affected by the

transfection of control, ANXA2 or WDR91 siRNAs (Supplementary Figure 3C). Therefore, we

decided to focus on WDR91 in our next investigations.

WDR91 enhancer activity is PS-ASO sequence dependent

We identified WDR91 using a fully modified TSB ASO made of tcDNA and wondered whether

similar effects would hold true in a different system (different mechanism of action, chemistry

and cell line). Indeed, it is known that human cancer cell lines have very heterogenous ASO

uptake efficiencies. To address this question, we first transfected the U2OS osteosarcoma cell

line with siRNAs (control or directed against ANXA2 or WDR91) and evaluated the effect on

LNA GMs activity (mRNA knockdown) directed against Metastasis Associated Lung

Adenocarcinoma Transcript 1 (*MALAT1*) and Inhibitor of Growth Family Member 2 (*ING2*)

RNAs. From these two RNAs, *MALAT1* is a highly studied and conserved nuclear lncRNA and

is abundantly expressed in many cells. The experimental workflow is depicted in Figure 6A.

RT-qPCR in control-siRNA conditions confirmed the efficient downregulation of *MALAT1* and

ING2 mRNAs by their respective GM (Figure 6B). No impact was observed regarding either

MALAT1 or ING2 ASO-mediated mRNAs knockdowns after ANXA2 downregulation.

We observed that WDR91 knockdown efficiently abrogated MALAT1 ASO activity (Figure

6C), confirming the putative role of this protein in ASO potency. However, no such effect was

observed on ING2 ASO activity. Both 16-mers MALAT1 and ING2 GMs have the same design

and chemistry and only differ by their respective sequence. Considering that proteins interact

with ASOs in a sequence dependent manner[47], this suggests that WDR91 activity is PS-ASO

sequence dependent.

Together, these data highlight for the first time, a set of proteins that can modulate PS-ASO

potency in a melanoma cell line, and in a physiological context. Among these candidates,

WDR91 is a strong regulator. Its activity has been confirmed in two distinct cell lines but could

be ASO-sequence dependent.

WDR91 does not influence PS-ASOs activity in muscle cells

To evaluate the potency of WDR91 to affect PS-ASOs activity in a different context, we

assessed WDR91 ability to influence the activity of a splice-switching ASO used to mediate

exon skipping in skeletal muscle cells. ASO-mediated exon-skipping is indeed one of the most

promising therapeutic approaches for the treatment of Duchenne muscular dystrophy (DMD).

The mechanism of action of ASO in this context is to mask important regulatory splicing signals

to exclude the targeted exon and restore the reading frame of the DMD pre-mRNA[48].

Immortalized human myoblasts from DMD patients are typically used as a model to study

dystrophin restoration mediated by splice switching oligonucleotides (SSOs). Here we used

immortalized DMD myoblasts carrying a deletion of DMD exon 52 leading to an out-of-frame

mRNA and resulting in the absence of dystrophin. The use of an SSO directed against the exon

51 (SSOEx51) allows to restore the open-reading frame of the dystrophin mRNA.

To study the effect of WDR91 on SSOEx51 activity, the immortalized KM571 cells were first

transfected with siRNAs to knockdown WDR91 or ANXA2 expression (Figure 7A). Seventy-

two hours later cells were treated with the SSOEx51 (LNA/2'OMe PS mixmer) to study exon

51 skipping efficiency in a context where WDR91 or ANXA2 expression was reduced. RNA

was extracted to first check knockdown efficiency, and we confirmed that siRNAs treatment

resulted in a strong knockdown (>70 %) of *WDR91* and *ANXA2* respective mRNAs (Figure

7B). Exon skipping levels were then compared and normalized to the siRNA control group

(siCTL). We noted a significant reduction in the exon skipping efficacy when ANXA2

expression was reduced (Figure 7C). However, this effect was not observed with WDR91.

Similar results were obtained with a different SSO chemistry (2MOE PS) (Supplementary

Figure 4), indicating that WDR91 is not a modulator of PS-ASOs in this system.

To determine whether this effect was specific to SSOs or to KM571 cells, we used a different

type of ASO to clarify the role of WDR91 in these cells. As described above, we first transfected

the KM571 cells with siRNAs targeting *WDR91* or *ANXA2* mRNAs and then with a GM against

MALAT1 mRNA (GM MALAT1) (Figure 7D). Here again, siRNA-induced knockdown of

WDR91 and *ANXA2* was very efficient (Figure 7E). When quantifying the levels of *MALAT1*

mRNA, we observed no significant differences between the siRNA treatment (control, ANXA2

or WDR91) (Figure 7F) indicating that WDR91 or ANXA2 knockdown did not affect GM

MALAT1 activity. These results suggest that WDR91 likely does not contribute to PS-ASO

activity in KM571 cells, regardless of the type of PS-ASOs used.

DISCUSSION

Despite many clinical successes, the precise mechanisms of ASOs uptake and trafficking

remain to be fully understood. In this study, we used a genome-wide CRISPR inhibition screen

to identify without *a priori* proteins involved in PS-ASO trafficking, release and productive

activity in a 501Mel cell line. Our CRISPR knockout screening strategy has enabled us to

discover functionally involved proteins, using a 3rd generation ASO and preserving the integrity

of intracellular membranes and organelles. Moreover, the miRNA displacement mediated by a

Target Site Blocker ASO represents a relevant assay to investigate the proteins involved in

ASOs efficiency and which has been validated *in vivo*.

This study revealed a set of 95 potential activators and 55 inhibitors. Among the activators, our

assay highlighted the Rab5C and COG8 proteins, which are known positive regulators of ASOs

trafficking and productive activity[35,36]. ANXA2, which is another known positive regulator,

was not found in the list of candidates after application of our filters, which also shows that this type of CRISPR screen can be subject to false negatives.

In this study, we focused on WDR91 protein as a candidate of interest. This protein has a strong biological relevance as it is known to participate in the early-to-late endosome conversion and its knockdown showed the most significant inhibition of tcT3 anti-proliferative activity in our validation experiments.

We confirmed that WDR91 was a positive modulator of PS-ASO activity in two different assays (cell density assay and mRNA knockdown performance), with different cell models (501Mel and U2OS) and ASO chemistries (tcDNA TSB and LNA GM), a landmark result of this project. The impact of WDR91 was not validated in all the systems studied. Indeed, although our results are similar when comparing the ASO activity of WDR91 in 501Mel and U2OS cells, they tend towards an ASO sequence-related activity. In addition, WDR91 did not have any effect with a splice-switching ASO in muscle cells. Thus, as is the case for ANXA2, WDR91 may have an ASO-promoting activity that is also cell line-dependent. Indeed, it is known that identified proteins involved in ASO trafficking and productive activity might not have the same impact depending on the cell line (probably due to differences in high isoform co-expression or the establishment of compensatory proteins or pathways). The same observation was made, for example, in a study evaluating Rab5C, a well-characterized modulator of ASO activity[49].

Ultimately, the results of our validation experiments on various cell systems and ASO chemistries underline the need for caution when identifying an ASO modulator in a specific context, as it may not be applicable to all systems.

Interestingly, other studies have highlighted WDR91 as an important mediator of the release and efficacy of internalized reoviruses or antibody-drug conjugates in cells during the early

endosome maturation or from the late endosomes[50,32]. Therefore, this study tends to further

reinforce the key role of endosomal proteins in productive ASO trafficking and activity.

One of the limitations of our study is that genome-wide CRISPR screening was performed in a

single replicate. Rigorous filters were used to identify robust ASO activity modulators. We

have chosen to focus on a few selected proteins that promote internalized ASO activity, but it

would also be interesting to validate other identified proteins as well as the potential inhibitors

to confirm other candidates in 501Mel cells, as well as in other melanoma cell lines with

different states of cell differentiation. Furthermore, and given the specificity of this cell type

with regard to melanosome biogenesis and transport, involving numerous traffic processes[51], it

would be of interest to further evaluate WDR91 in other cell lines as it has been done in U2OS

and KM571 cells.

Analysis of the gene set enrichment also suggested new avenues to explore. Looking at the

inhibitory proteins, some of them were associated with the endosomal cellular compartment.

ATP6V0D2, for example, is one of the strongest inhibitor candidates in our selection and is

involved in the acidification and pH maintenance in certain intracellular compartments[52]. Some

activator candidates might be related to actin cytoskeleton regulation. From the related proteins,

CDC42 and MAP2 are known to be involved in cellular trafficking disorders[53]. It is therefore

relevant to consider that a defect in these proteins could also have an impact on intracellular

trafficking and ASO release in melanoma.

Ultimately, our results contribute to a better characterization and identification of protein

modulators of ASO activity, providing valuable information for potential new therapeutic

avenue. Potent ASO modulators validated *in vitro* could be inhibited or overexpressed in *in*

vivo experiments to assess and confirm an increase in ASO potency. Acting at the level of these

modulators or directly on ASO-modulators interaction could result in more productive ASO

activity, triggering an exacerbated inhibitory effect and an overall increase in the therapeutic

index.

MATERIALS AND METHODS

Cell lines and lentiviral library

501Mel and U2OS cells were acquired from ATCC. Before experiments, all cells were

regularly tested for absence of mycoplasma. Culture and sub-culturing were performed in

RPMI-1640 (Gibco) for 501Mel and Mc Coy's 5A (Gibco) for U2OS, supplemented with 10%

fetal bovine serum (FBS) (Gibco), 2mM L-glutamine (Gibco) and 1% penicillin/streptomycin,

(Gibco) and cultured at 37°C in a humidified incubator with 5% CO_2. Transfections and

infections were performed in the same media but without antibiotics and with a

decomplemented serum (30 minutes at 56°C). Immortalised myoblasts carrying a deletion of

DMD exon 52 (KM571) were obtained from the platform for immortalization of human cells

from the Institut de Myologie. KM571 cells were grown in a 50/50 mix of skeletal muscle cell

growth medium (Promocell, Germany) and F-10 (Thermo Fisher Scientific, USA) with 10%

fetal bovine serum, and 1% penicillin-streptomycin (100 U/mL).

Antisense oligonucleotides

miRCURY LNA™ Target site blockers TSB-C1 (ACTTTATTACAATCAT) and TSB-T3

(ACACAGTGGCAAACAC) were designed and obtained from Qiagen. tcC1 and tcT3 were

synthesized from SQY Therapeutics (Montigny le Bretonneux) as fully modified tcDNA-PS

ASOs. The TSB-C1 and tcC1 controls have no significant match to any annotated human

3'UTR. MALAT1 (CGTTAACTAGGCTTTA) and ING2 (TACGTTGGCTTGTTCA) LNA

Gapmers were designed and obtained from Qiagen. For the KM571 experiments, all ASOs were obtained from Eurogentec. Two chemistries of the splice switching oligonucleotide targeting exon 51 (SSOEx51 previously described in Saoudi et al., 2023[54]) were used: LNA/2'OMe PS mixmer and full 2MOE PS. MALAT1 GM is a 2MOE PS (previously described in Wang et al., 2016[37]). All ASOs were reconstituted in nuclease-free water (Invitrogen).

siRNAs

siRNAs pools were purchased from Santa Cruz (Negative Control A sc-37007; WDR91 sc-89398; WBSCR16 sc-89899; FH sc-105377; ELMOD1 sc-77261; TADA2B sc-156169; ANXA2 sc-270151)

Generation of 501Mel knockout library

Transduction of mycoplasma negative 501Mel cells at 60% confluence was performed in T175 flasks (standard - Sarstedt) with the Brunello knockout pooled lentiviral library from Addgene (# 73179-LV) and in RPMI-1640 decomplemented medium (Gibco) without antibiotics. The Brunello pooled lentiviral library contains 76,441 single guides RNAs (sgRNAs), targeting 19,114 coding genes (4 sgRNAs per gene). A multiplicity of infection (MOI) of 0.4 was selected to ensure that every single cell is infected with only one sgRNA. Twenty-four hours later, the infectious medium was replaced by a fresh complete medium. After 48h, infected cells were positively selected with 2.5µg/mL puromycin (InvivoGen) for 7 days. Following selection and expansion of the surviving cells, around 350 million cells were recovered. A dry pellet of 100 million cells was prepared for gDNA extraction and sequencing. The remaining cells were used for the subsequent reverse transfection.

RNA interference, ASO treatments and cell density assay

501Mel parental cells. Reverse-transfections of siRNAs were performed in 60mm dishes (standard - Sarstedt) with 224,000 cells per dish and for 48h in RPMI-1640 decomplemented medium without antibiotics. Briefly, 1mL lipoplexes layers were formed with Lipofectamine 2000 (Invitrogen) and the siRNA concentrations were set to 30nM in a final 3mL volume after addition of the cells on top of the lipoplexes. For all the transfections, lipoplexes were formed in OptiMEM®. After 16h incubation, the medium was replaced by a fresh complete medium without antibiotics. After 48h, the cells were recovered, counted with a Neubauer counting chamber and a second reverse-transfection was performed in 96-well plates (standard F-Sarstedt) with 3000 cells per well and with either the siRNA alone (at 30nM final concentration) or a combination of siRNA (30nM) and tcT3 at a final concentration of 50nM in a final volume of 150µL (100µL of cells on top of 50µL of lipoplexes). After 16h incubation, the medium was replaced by a fresh 150µL complete medium without antibiotics. After 4 days following to the second transfection, the cell density was measured with 0.5% crystal violet (10 minutes at RT, followed by three PBS washes, 100µL of 100% EtOH solubilization and absorbance reading at 590nm using a Tecan Infinite F200 Pro reader).

U2OS cells. Reverse-transfections of siRNAs were performed in 12-well plates (standard - Sarstedt) with 50,000 cells per well and for 48h in decomplemented Mc Coy's 5A medium without antibiotics. Cell density was optimized so these cells are efficiently transfected between 20 and 30% confluence. The procedure was the same as described above except that the siRNA transfection was performed with RNAiMax (Invitrogen) and 6h post seeding. After 48h, the medium was replaced by 0.4mL of a fresh decomplemented Mc Coy's 5A medium without antibiotics and a reverse-transfection with Lipofectamine 2000 was performed in the same plate

with the MALAT1 or ING2 Gapmer (at 30nM final concentration) in a final volume of 0.8mL

(0.4mL of lipoplexes on top of the cells). After 24h following to the second transfection, total

RNA was extracted for further RT-qPCR analysis.

501Mel knockout library. Reverse-transfections of tcT3 and C1 were performed in 150mm

dishes (standard - Sarstedt) with 1.5 million knockout cells per dish and for 72h in RPMI-1640

decomplemented medium without antibiotics. Briefly, 10mL lipoplexes layers were formed

with Lipofectamine 2000 (Invitrogen) and the respective ASOs concentrations were set to

50nM in a final 24mL volume after addition of the cells on top of the lipoplexes. For the

transfections, lipoplexes were formed in OptiMEM® and the mycoplasma-negative knockout

cells have been sub-cultured 24h before in T175 flasks (standard - Sarstedt). The cells

confluency at the day of transfection was maintained between 50 and 80%. After 7h of

transfection, the medium was replaced by a fresh complete medium without antibiotics. To

ensure a coverage of 400 cells per guide RNA in our library, a total of 32 million cells was

transfected with either the tcT3 or C1. Thus, 22 dishes were used per oligonucleotide

transfection. After 72h of transfection, surviving cells were recovered and pellets of 100 million

cells were kept at -80°C until further processing.

KM571 cells. Cells were plated in 6-well plates (300,000 cells per well) and transfected the

same day with 20nM of siRNA with Lipofectamine RNAiMAX according to the

manufacturer's instructions (Thermo Fisher Scientific, USA). Twenty-four hours after the first

transfection, proliferation medium was changed for differentiation medium (DMEM, 2% horse

serum, 1% penicillin / streptomycin (100 U/mL)) to induce myotubes formation. After 3 days

of differentiation, cells were treated with 100nM of the SSOEx51 for 24h with Lipofectamine

LTX according to the manufacturer's instructions (Thermo Fisher Scientific, USA). For the

transfection of the GM MALAT1, similar protocol was used, except that KM571 cells were

only treated during proliferation and that the GM MALAT1 treatment was performed for 48h.

NGS sequencing library preparation

Frozen pellets of 100 million transfected surviving cells (and from non-treated knockout

library) in 50mL poplypropylene tubes (Sarstedt) were thawed on ice for 20 minutes and lysed

at room temperature. Genomic DNA was purified according to the manufacturer's instructions

(NucleoBond HMW DNA, Macherey-Nagel). A total of 280µg of genomic DNAs was used for

PCR amplification of sgRNA sequences, using the Herculase II Fusion polymerase (Agilent).

Illumina P5- and P7-barcoded adaptors were used, and PCR amplification and quality controls

have been carried out as described by Zhang laboratory (Joung *et al*, 2017). Amplified PCR

products were purified using AMPure XP beads (Beckman Coulter) according to the

manufacturer's instructions, eluted in 14µL of nuclease-free water (Invitrogen) and stored at -

20°C until Bioanalyzer quality control (TapeStation 4200, Agilent) was used to measure the

size, quality and concentration.   The pooled samples were sequenced using Illumina NGS

sequencing platform (Novaseq6000 – CurieCoreTech ICGex Platform).

NGS data analysis

MAGeCK (v0.5.9.4) was used to extract sgRNA read counts from the samples fastq.gz files

(mageck count program with the --norm-method median option). For each sgRNA, we

transformed the read counts onto M (log ratio) and A (mean average): $M =$

$\log2(\text{sgRNA\_count\_in\_TRT}+1) - \log2(\text{sgRNA\_count\_in\_CTL}+1)$, and $A =$ mean

(count_TRT, count_CTL) in log2 scale. Fold-changes between TRT and CTL conditions were

also computed from the M values of each sgRNA.

RNA extraction and RT-qPCR analysis

Total RNA form cell lysates was obtained using a NucleoSpin® RNA kit (Macherey-Nagel), according to the manufacturer's instructions and with on-column DNAse treatment. After Nanodrop evaluation of purity and concentration, 500ng of RNA was used for reverse-transcription (MultiScribe RT – Applied Biosystems). Obtained cDNA was diluted to 2.5ng/µL and used as template for qPCR using a QuantStudio5 system (Applied Biosystems). SYBR Green (PowerSYBR® Green PCR Master Mix – Applied Biosystems) was used according to the manufacturer's instructions. For each sample measurement, 3 technical replicates were performed. TBP was used as internal standard. TYRP1 and ING2 primers were purchased from Eurogentec. % knockdown was calculated as $100*(1-2^{-ddCt})$. Total RNA was isolated from cultured human myoblast cells using TRIzol reagent, according to the manufacturer's instructions (Thermo Fisher Scientific, USA). Aliquots of 1 µg of total RNA were used for RT-PCR analysis. The cDNA synthesis was carried out with LunaScript™ RT SuperMix Kit (New England Biolabs). Exon 51 skipping was measured by TaqMan qRT-PCR, using TaqMan assays that were designed against the exon 51-53 or exon 50-53 templates using the Prime Time qPCR probe assays (Integrated DNA Technology) (Assay Ex51-53 - forward : 5'-CAGGTTGTGTCACCAGAGTAA-3'; reverse 5'-TGAGTGGAAGGCGGTAAA-3'; probe : 5'-/56-FAM/TGACCACTA/ZEN/TTGGAGCCTCTCCTAC/3IABkFQ/-3' and assay Ex50-53: forward: 5'-ACTGATTCTGAATTCTTTCAAAGGC-3'; reverse: 5'-TTCAAGAGCTGAGGGCAAAG-3'; probe: 5'- /56-FAM/ACCTAGCTC/ZEN/CTGGACTGACCACT/3IABkFQ/-3') . gBlocks Gene Fragments (Integrated DNA Technology) from human exon 49-54 and human exon 49-54 Delta 52 were used as standards for DNA copy number. 70 ng of cDNA was used as input per reaction, and all assays were carried out in triplicate. Assays were performed under fast cycling conditions on a Bio-Rad CFX384 Touch Real-Time PCR Detection System. For a given sample, the copy

number of skipped product (exon 50-53 assay) and unskipped product (exon 51-53 assay) was

determined using the standards Ex49-54 and Ex49-54 Delta52, respectively. Exon 51 skipping

was then expressed as a percentage of total dystrophin. Knockdown analysis was performed by

using the appropriate probes for the studied targets and were purchased from Integrated DNA

technologies (IDT) (MALAT1 Hs.PT.58.26451167.g; WDR91 Hs.PT.58.39523053 and

ANXA2 Hs.PT.56a.40676274). The expression of the different targets was then normalized to

a reference gene (GAPDH Hs.PT.39a.22214836).

Protein isolation and Western blotting

Total protein extracts were obtained by resuspension of PBS-washed cell pellets in 40µL of

ice-cold RIPA buffer (Tris-HCl 50 mM, ph7.4, NaCl 150 mM, Sodium Deoxycholate 0.5%,

Triton 1%, SDS 0.1%), including protease inhibitor cocktail (Sigma-Aldrich, P8340) and

centrifugation at 16,000xg for 15min at 4°C. Proteins quantification from the cleared lysates

was performed using a Pierce™ BCA Assay kit (Thermo scientific). After 4-12% SDS-PAGE

in NuPAGE MES buffer (Invitrogen), proteins were transferred onto PVDF membranes with a

turbo transfer system (BIO-RAD) for 10 minutes at 25V and 2.5A. After transfer, the

membranes were washed in Tris-buffered saline and 0.1% Tween 20 (TBST) and blocked for

30 minutes at room temperature in a solution of TBST + 5% w/v non-fat dry milk. Blocked

membranes were washed three times in TBST for 5 minutes and diluted primary antibody was

incubated at 4°C overnight with shaking. The diluted HRP-conjugated secondary antibody was

added for 1h at room temperature with shaking, after three TBST washes of 5 minutes. Imaging

was performed after ECL reagent addition and chemiluminescence detection with G:Box

Chemi XX6 imager from Syngene. ANXA2 antibody was purchased from Santa Cruz (sc-

28385).

Statistical analysis

GraphPad Prism software (San Diego, CA, USA) version 9.5.1 was used for statistical analysis and graphs design. Each data is presented as mean of at least three independent biological replicates with standard deviation (SD). P-values were calculated by two-sided unpaired *t*-tests with Welch's correction and differences were statistically significant at $*p \leq 0.05$; $**p \leq 0.01$; $***p \leq 0.001$; $****p \leq 0.0001$. For exon skipping experiments, normal distribution of samples was assessed by using Shapiro-Wilk test. Comparisons of statistical significance were assessed by one-way ANOVA parametric test or Kruskal-Wallis non-parametric test and followed by appropriate post-hoc tests if applicable.

DATA AVAILABILITY STATEMENT

Data are available upon request to the corresponding author.

KEYWORDS

CRISPR screen; NGS; Antisense Oligonucleotides (ASOs); Melanoma; Target Site Blockers; protein modulators of ASOs; endosomes; productive activity; WDR91.

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AUTHOR CONTRIBUTIONS

553 G.M., R.P., A.Go. and A.Ga. conceived and analyzed the experiments. G.M. and A.Ga.

554 performed the experiments. M.A. analyzed the NGS raw data. A.M. and A.B. helped in the

555 library preparation. G.M. wrote the manuscript. All the authors reviewed the manuscript.

DISCLOSURE AND COMPETING INTERESTS STATEMENT

558 The authors declare no competing financial interests.

FIGURE LEGENDS

Figure 1. Inhibition of 501Mel cells proliferation with Target Site Blocker ASOs targeting

***TYRP1* mRNA.** (A) A competition mechanism occurs with binding of TSB-T3 to a sequence

overlapping the miR-16 site in the 3'UTR of *TYRP1* mRNA, thus releasing miR-16 whose

tumor suppressor activity is restored. TSB-C1 (Control ASO) has no match with *TYRP1*

3'UTR[38]. The cell density assay upon TSB-C1 or -T3 treatment is measured through a crystal

violet colorimetric assay. The figure 1A was generated with BioRender.com (B) 501Mel cell

density assay at day 3 with increasing concentrations of reverse-transfected LNA- (T3) or

tcDNA- (tcT3). Experiments were performed in independent biological triplicates. Data were

normalized to the corresponding control conditions (C1 or tcC1) at the same concentrations

(10, 30, 50 and 70nM). Data are presented as mean (SD). Unpaired *t*-test with Welch's

correction were performed. The statistical significance is **P=0,0040 (T3 *vs* C1 – 30nM);

*P=0,0241 (T3 *vs* C1 – 50nM); **P=0,0061 (T3 *vs* C1 – 70nM); **P=0,0078 (tcT3 *vs* tcC1 –

30nM); **P=0,0036 (tcT3 *vs* tcC1 – 50nM); *P=0,0105 (tcT3 *vs* tcC1 – 70nM).

Figure 2. Generation and treatment of the 501Mel cells knockout library. (A) Workflow

of the experimental setup. S1: Step 1 (cells transduction – non infected cells in grey on the

workflow); S2: Step 2 (transduced cells positive selection with antibiotic); S3: Step 3 (ASO

exposure); S4: Step 4 (gDNA purification and sgRNAs amplification). The figure was

generated with BioRender.com (B) Distribution of the number of normalized read counts per

sgRNA in the tcT3 and the tcC1-treated library. The mean is represented by a red bar (C)

Method for identifying genes promoting or inhibiting ASO uptake and/or efficiency after NGS

sequencing and based on normalized read counts after tcC1 or tcT3 treatment.

Figure 3. NGS sequencing data sorting and analysis. (A) After sgRNA extraction, MA plots

are used to visualize the differences between measurements (read counts) between two

conditions: treatment (tcT3) *versus* control (tcC1). For each sgRNA, the read counts are

transformed onto M (log ratio) and A (mean average) scales. M is equal to

$\log2(\text{sgRNA\_count\_in\_TRT}+1)$ - $\log2(\text{sgRNA\_count\_in\_CTL}+1)$ and A is the mean between

count_TRT and count_CTL in log2 scale. Candidates' selection was performed according to

the following criteria: $A \geq 6$ and $M \geq 0.6$ (enriched sgRNAs, ASOs activators); $A \geq 6$ and $M \leq$

-0.6 (depleted sgRNAs, ASOs inhibitors). Control sgRNAs (non-targeting guides) are located

between $M \geq 0.6$ and $M \leq -0.6$. On the obtained MA plot, red, green and black dots represent

the genes with the 4, 3 and 2 sgRNAs over 4 fulfilling the defined criteria, respectively (B) MA

plot examples from selected activator and inhibitor candidates with applied M and A filters and

with 4 (GGTLC2) or 2 relevant sgRNAs (WDR91). The yellow dots represent the genes with

a very low expression in either the treatment or the control condition and as a consequence, an

elevated but non-significant fold change (C) Representation of the post-sequencing normalized

read counts in the control (CTL – tcC1) and treated (TRT – tcT3) conditions for the sgRNAs

of four sorted modulator candidates (COG8, WBSCR16, WDR91, in red – activators; GGTLC2

in blue – inhibitor). The fold change is calculated as: tcT3 read counts / tcC1 read counts (for

activators); tcC1 read counts / tcT3 read counts (for inhibitors).

Figure 4. ASO activators and inhibitors ranking and selection. (A) Distribution of the

average fold change (tcT3 read counts *vs* tcC1 read counts) from the fold changes of the 2, 3 or

4 corresponding sgRNAs per gene, for 53 of the 95 selected ASO activator candidates (fulfilling

the criteria A ≥ 6 and M ≥ 0.6 on the MA plot). Green stars represent candidates that have

already characterized in the literature. Black stars correspond to the 5 candidates that have been

chosen for further functional validation (B) Distribution of the average fold change (tcC1 read

counts *vs* tcT3 read counts) from the fold changes of the 2, 3 or 4 corresponding sgRNAs per

gene, for 31 of the 55 selected ASO inhibitor candidates (fulfilling the criteria A ≥ 6 and M ≤ -

0.6 on the MA plot). The fold change threshold was fixed to 1.5. The full list activator and

inhibitor candidates is provided in Supplementary Table 1.

Figure 5. Functional validation of tcT3 activity enhancer candidates in 501Mel cells. (A)

Workflow of the experimental design (B) Setup of the 501Mel cell density assay with ANXA2

positive control. Cell density measurement was performed by crystal violet assay after tcT3

transfection on normal, control or ANXA2 knockdown cells (NT: Non-Treated; siCTL: control

siRNA). The relative cell density in each condition is normalized to the non-treated cells. (C)

501Mel cell density assay after tcT3 transfection on normal, control or candidate's knockdown

cells. Data are represented with a cell density normalized to the non-treated cells (100%) (D)

Same data as above but represented with a cell density normalized to 100% for each treatment

with the siRNA alone, to discard any proliferation bias induced by the siRNA's effects.

Experiments were performed in independent biological replicates. Data are presented as mean

(SD). Unpaired *t*-test with Welch's correction were performed. In the lower panel, the statistical

significance is *P=0,0468 (TADA2B, N=3); **P=0,0011 (WDR91, N=4); ****P≤0,0001

(ANXA2, N=5); NS= non-significant (P=0,0588).

Figure 6. Functional validation of WDR91 in U2OS cells. (A) Workflow of the experimental

design (B) *MALAT1* and *ING2* mRNA quantification by RT-qPCR at D4 and D5 respectively,

after corresponding GM transfection on non-treated, control or ANXA2 knockdown cells. The

relative mRNA fold change was normalized to the non-treated condition (no siRNA

transfection). Experiments were performed in independent biological triplicates (MALAT1)

and quadruplicates (ING2). Data are presented as mean (SD). Unpaired *t*-test with Welch's

correction were performed. The statistical significance is **P=0,0019 (NT *vs* siCTL);

****P<0,0001 (NT *vs* siCTL; NT *vs* siANXA2) (C) *MALAT1* and *ING2* mRNA quantification

by RT-qPCR at D4 and D5 respectively, after corresponding GM transfection on non-treated,

control or WDR91 knockdown cells. The relative mRNA fold change was normalized to the

non-treated condition (no siRNA transfection). Experiments were performed in independent

biological triplicates (MALAT1) and quadruplicates (ING2). Data are presented as mean (SD).

Unpaired *t*-test with Welch's correction were performed. The statistical significance is

**P=0,0019 (NT *vs* siCTL); NS= non-significant (P=0,1755); ***P=0,0001 (NT *vs* siWDR91);

****P<0,0001 (NT *vs* siCTL).

Figure 7. Functional validation of WDR91 in an immortalized DMD muscle cell line (KM571). (A) Experimental setup for the double transfection protocol of siRNAs and SSOs in KM571 (B) *WDR91* and *ANXA2* mRNAs silencing efficiency (siCTL: Control siRNA) (C) *WDR91* and *ANXA2* mRNAs silencing effects on exon 51 skipping efficiency of the SSOEx51 (D) Experimental setup for the double transfection protocol of siRNAs and a GM against MALAT1 (GM MALAT1) in KM571 (E) *WDR91* and *ANXA2* mRNAs silencing efficiency (siCTL: Control siRNA) (F) *WDR91* and *ANXA2* mRNAs silencing effects on MALAT1 knockdown induced by the GM MALAT1. Results are shown as the average of at least four independent biological replicates. Data are presented as mean (SD). The relative mRNA fold change was normalized to the appropriate control condition (Mock or siCTL). Unpaired *t*-test with Welch's correction were performed. The statistical significance is ** P <0,005; ****P<0,00005.

Supplementary Figure 1. Gene set enrichment analysis on activator candidates. Gene set enrichment analysis using PANGEA (Pathway, Network and Gene-set Enrichment Analysis) allowed to classify the activator candidates based on the cellular component gene ontology. Each gene set is classified according to its highest value (log2 fold change). In green are framed the proteins that are part of the peroxisome cellular component. In red are framed the proteins that are part of the mitochondrion cellular component. In purple are framed the proteins that are part of the actin cytoskeleton cellular component. The color code and corresponding lines highlight common candidates between each corresponding cellular component.

Supplementary Figure 2. Gene set enrichment analysis on inhibitor candidates. Gene set

enrichment analysis using PANGEA (Pathway, Network and Gene-set Enrichment Analysis)

allowed to classify the inhibitor candidates based on the cellular component gene ontology.

Each gene set is classified according to its highest value (log2 fold change). In green are framed

the proteins that are part of the Golgi apparatus cellular component. In red are framed the

proteins that are part of the microtubule cytoskeleton cellular component. In purple are framed

the proteins that are part of the endosomal cellular component. The color code and

corresponding lines highlight common candidates between each corresponding cellular

component.

Supplementary Figure 3. (A) Western blot analysis of ANXA2 protein expression at 48h and

72h on non-treated 501Mel cells and after ANXA2 or control siRNA reverse transfections. NT:

non-treated; siANXA2: ANXA2 siRNA; siCTL: Negative control siRNA. Alpha-tubulin was

used as a loading control (B) Evaluation and quantification of the candidate's knockdown

efficiency by RT-qPCR on total RNAs coming from non-treated (NT) or siRNA transfected

501Mel cells. Data are calculated from three technical replicates. % knockdown (KD) was

calculated as $100*(1-2^{-ddCt})$. TBP was used as housekeeping gene (C) TYRP1 mRNA

quantification by RT-qPCR on total RNAs coming from non-treated (NT) or siRNA transfected

501Mel cells (CTL: control siRNA). Results are shown as the mean of at least three independent

biological replicates (SD).

Supplementary Figure 4. WDR91 do not affect the activity of a methoxyethyl chemistry

splice switching oligonucleotide in DMD muscle cells. SSOEx51 used in these experiments

is an 2MOE PS. (A) *WDR91* and *ANXA2* mRNAs silencing efficiency (siCTL: Control siRNA)

(B) *WDR91* and *ANXA2* mRNAs silencing effects on exon 51 skipping efficacy of the SSOEx51

2MOE PS. Results are shown as the average of at least four independent biological replicates.

Data are presented as mean (SD). The relative mRNA fold change was normalized to the

appropriate control condition (Mock or siCTL). P-value was calculated by two-sided unpaired

t-tests against the Mock transfected or control siRNA condition. The statistical significance is

** P <0.005; ****P<0.00005.

Supplementary Table 1. Detailed list of the ASO activator and inhibitor candidates sorted

after applying M, A and fold change filters. The corresponding 95 and 55 activator and

inhibitor candidates are represented with their respective sgRNAs fulfilling the defined criteria.

M (log ratio) = log2(sgRNA_count_in_TRT+1) - log2(sgRNA_count_in_CTL+1); A (Mean

average) = mean (count_TRT, count_CTL) in log2 scale. Fold-changes (FC) between TRT

(tcT3-treated cells) and CTL (tcC1-treated cells) conditions were computed from the M values

of each sgRNA as FC (activator) = TRT read counts / CTL read counts; FC (inhibitor) = CTL

read counts / TRT read counts. KO is the number of read counts in the parental non-treated

knockout library. d value represents the absolute difference between the CTL and the TRT read

counts.

Supplementary Table 2. Quantification by absorbance at 590nm of the cell density after

crystal violet coloration. Raw absorbance data after candidate's knockdown and measure of

the inhibition of tcT3 anti-proliferative activity after four days of ASO treatment. Cell density

was measured with 0.5% crystal violet (10 minutes at RT, followed by three PBS washes,

100uL of 100% EtOH solubilization and absorbance reading at 590nm using a Tecan Infinite

F200 Pro reader). N1 to N8 are the biological replicates.

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Figure 1

Figure 2

A

B

C

Figure 3

A

Selected enriched sgRNAs:
→ ASOs Activators

Control sgRNAs

Selected depleted sgRNAs:
→ ASOs Inhibitors

B

WDR91

GGTLC2

C

sgRNA	Normalized Read counts		Fold change
	CTL	TRT	
sgCOG8-1	110	204	1,854545455
sgCOG8-3	83	152	1,831325301
sgCOG8-4	85	165	1,941176471
sgWBSCR16-1	57	160	2,807017544
sgWBSCR16-2	107	204	1,906542056
sgWBSCR16-3	43	116	2,697674419
sgWBSCR16-4	156	360	2,307692308
sgWDR91-1	61	209	3,426229508
sgWDR91-3	219	664	3,03196347
sgGGTLC2-1	244	104	2,346153846
sgGGTLC2-2	375	144	2,604166667
sgGGTLC2-3	408	215	1,897674419
sgGGTLC2-4	341	203	1,679802956

Figure 4

Figure 5

Figure 6

Figure 7