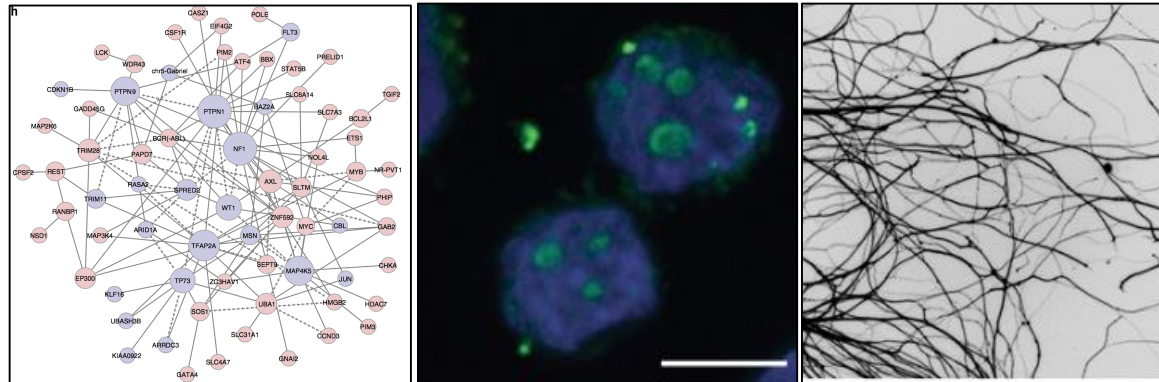


How CRISPR-Cas9 screens unlock novel ways of genetic interactions and disease mechanisms



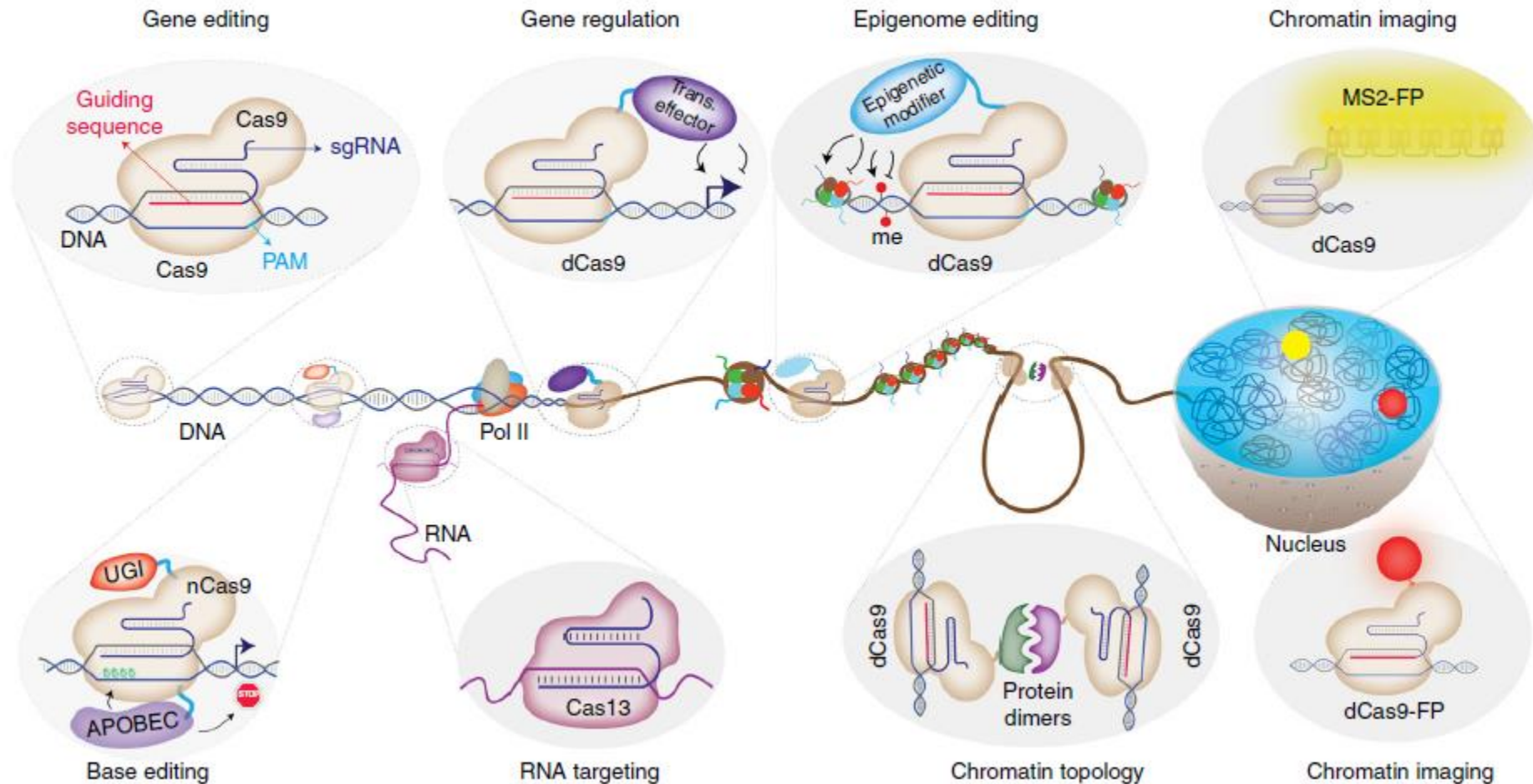
Francesca D. Franzoso, PhD



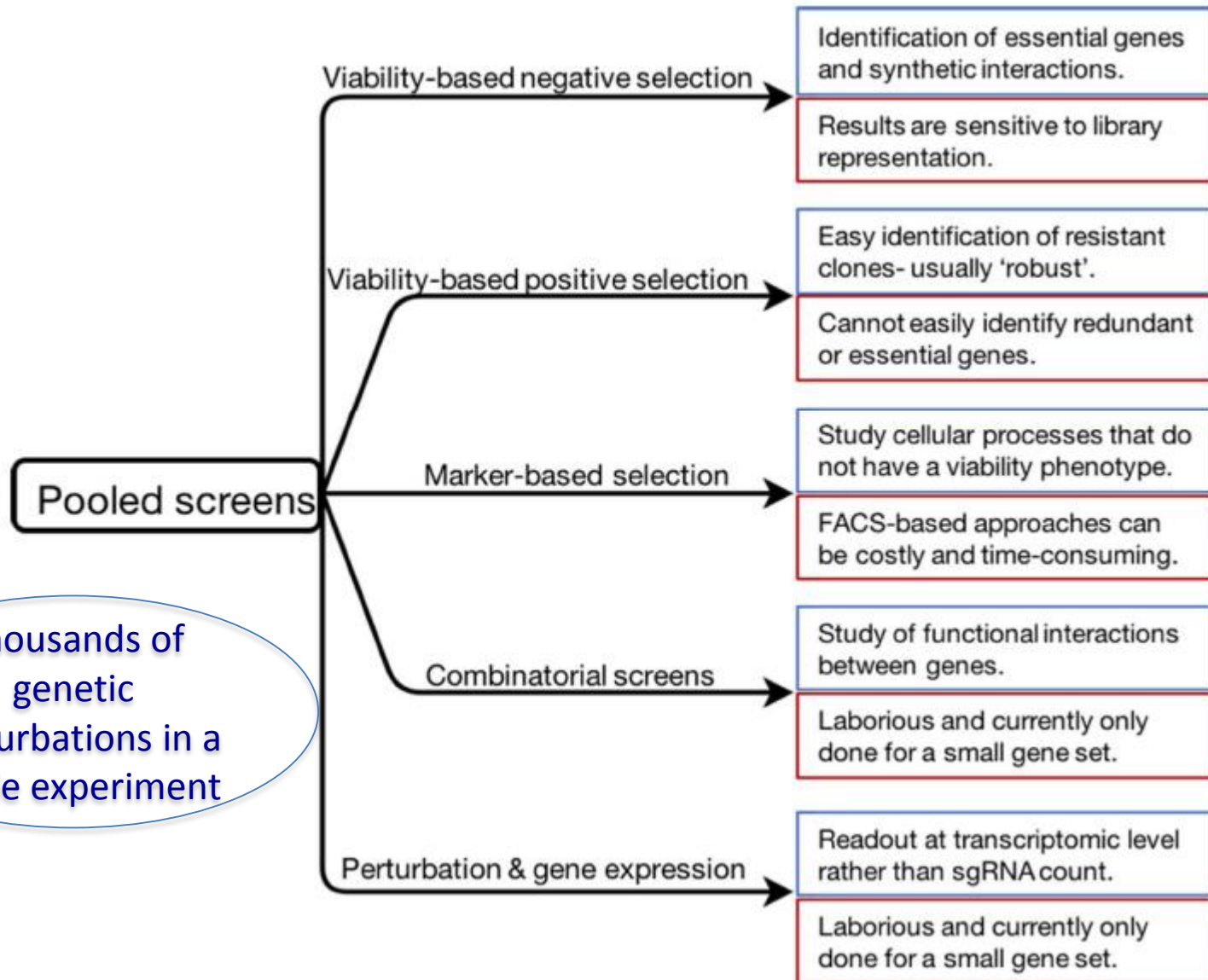
UniversitätsSpital
Zürich

Applications of CRISPR-Cas-based technologies

CRISPR technology: Beyond genome editing



CRISPR Screening Approaches



nature
biotechnology

Orthologous CRISPR–Cas9 enzymes for combinatorial genetic screens

Fadi J Najm^{1–3,5}, Christine Strand^{1,5}, Katherine F Donovan^{1,5}, Mudra Hegde^{1,5}, Kendall R Sanson^{1,5}, Emma W Vaimberg¹, Meagan E Sullender¹, Ella Hartenian¹, Zohra Kalani¹, Nicolo Fusi¹, Jennifer Listgarten¹, Scott T Younger¹, Bradley E Bernstein^{1–3}, David E Root¹ & John G Doench¹

nature
biotechnology

→ Dual-Cas9 system to identify genetic interactions - orthogonal Cas9 enzymes paired *S. aureus* and *S. pyogenes* for interactions – “Big Papi” screens

Dual gene activation and knockout screen reveals directional dependencies in genetic networks

Michael Boettcher¹, Ruilin Tian², James A Blau¹, Evan Markgard³, Ryan T Wagner¹, David Wu¹, Xiulei Mo⁴, Anne Biton^{5,6}, Noah Zaitlen⁵, Haian Fu⁴, Frank McCormick³, Martin Kampmann² & Michael T McManus¹

→ Orthogonal screening to identify directional genetic interactions between genes after activation/ablation in cancer CML cells

nature
genetics

ARTICLES

<https://doi.org/10.1038/s41588-018-0070-7>

CRISPR-Cas9 screens in human cells and primary neurons identify modifiers of *C9ORF72* dipeptide-repeat-protein toxicity

Nicholas J. Kramer^{1,2,6}, Michael S. Haney^{1,6}, David W. Morgens¹, Ana Jovičić^{1,5}, Julien Couthouis¹, Amy Li¹, James Ousey¹, Rosanna Ma¹, Gregor Bieri^{1,2}, C. Kimberly Tsui¹, Yingxiao Shi³, Nicholas T. Hertz⁴, Marc Tessier-Lavigne⁴, Justin K. Ichida³, Michael C. Bassik^{1*} and Aaron D. Gitler^{1*}

→ Comprehensive genome-wide KO screens in human cells and targeted screens in mouse primary neurons – genetic modifiers of *C9ORF72* DPR toxicity

ARTICLES

<https://doi.org/10.1038/s41588-018-0174-0>

nature
genetics

CRISPR-Cas9 genome editing in human cells occurs via the Fanconi anemia pathway

Chris D. Richardson^{1,2}, Katelynn R. Kazane^{1,2}, Sharon J. Feng^{1,2}, Elena Zelin^{1,2}, Nicholas L. Bray^{1,2}, Axel J. Schäfer², Stephen N. Floor^{2,3} and Jacob E. Corn^{1,2*}

→ Coupled inhibition-editing screening platform Human Cas9-induced single-strand template repair (SSTR) requires FA pathway

Combinatorial genetic screens

- ✓ To explore complex gene networks
- ✓ To deconvolute complex cellular signaling pathways
- **Current limitations:** interference between the sgRNAs; limited gene targeting activity

Solution:

- orthogonal Cas9 enzymes from *S. aureus* and *S. pyogenes* & paired *S. aureus* Cas9 with *S. pyogenes* Cas9 to achieve dual targeting in a high fraction of cells
- «Big Papi» approach: **p**aired **a**ureus and **p**pyogenes for **i**nteractions

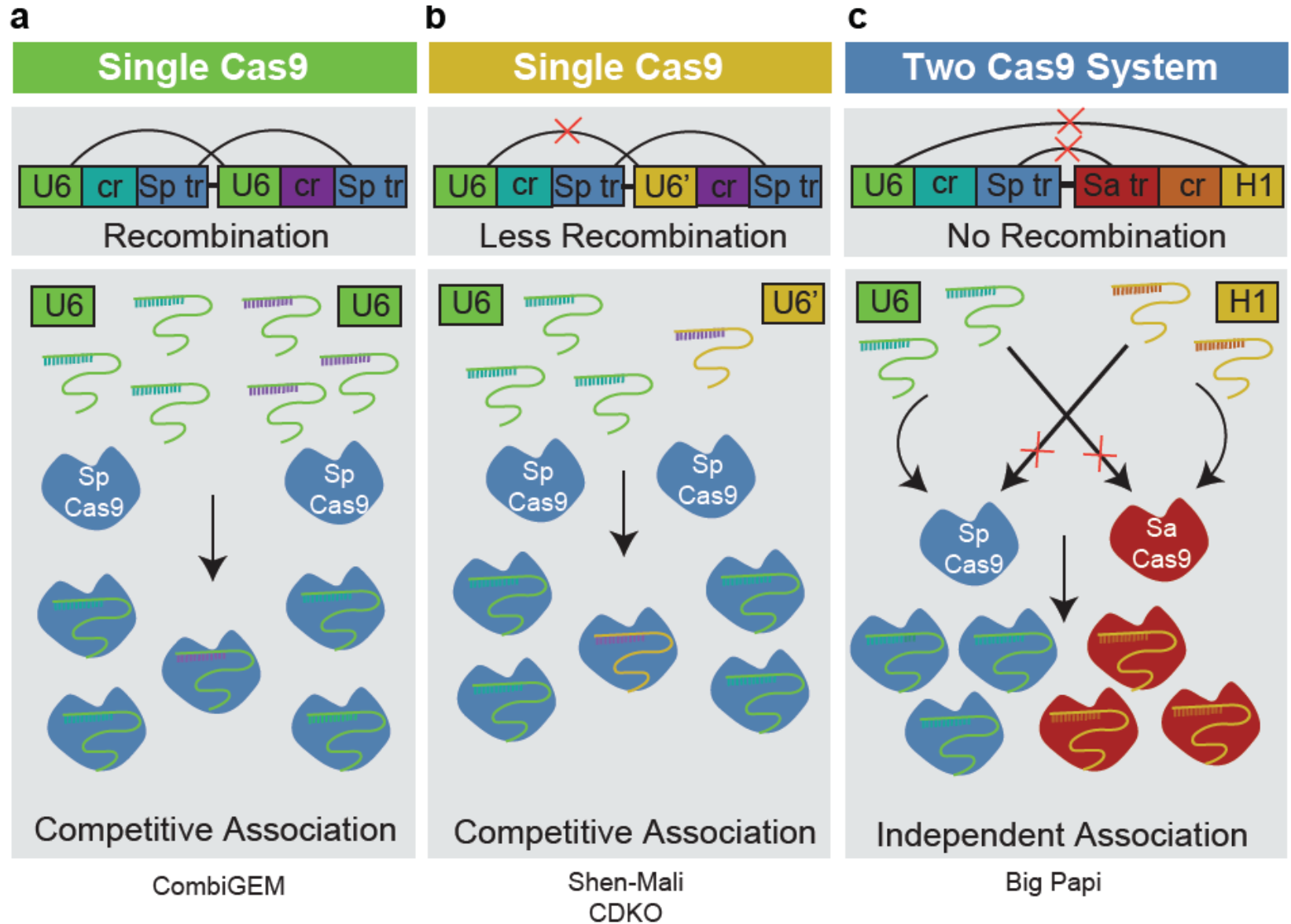
Study Rationale

→ To develop an approach using orthogonal Cas9 enzymes **SpCas9** and **SaCas9** → dual knockout efficiencies → robust screening

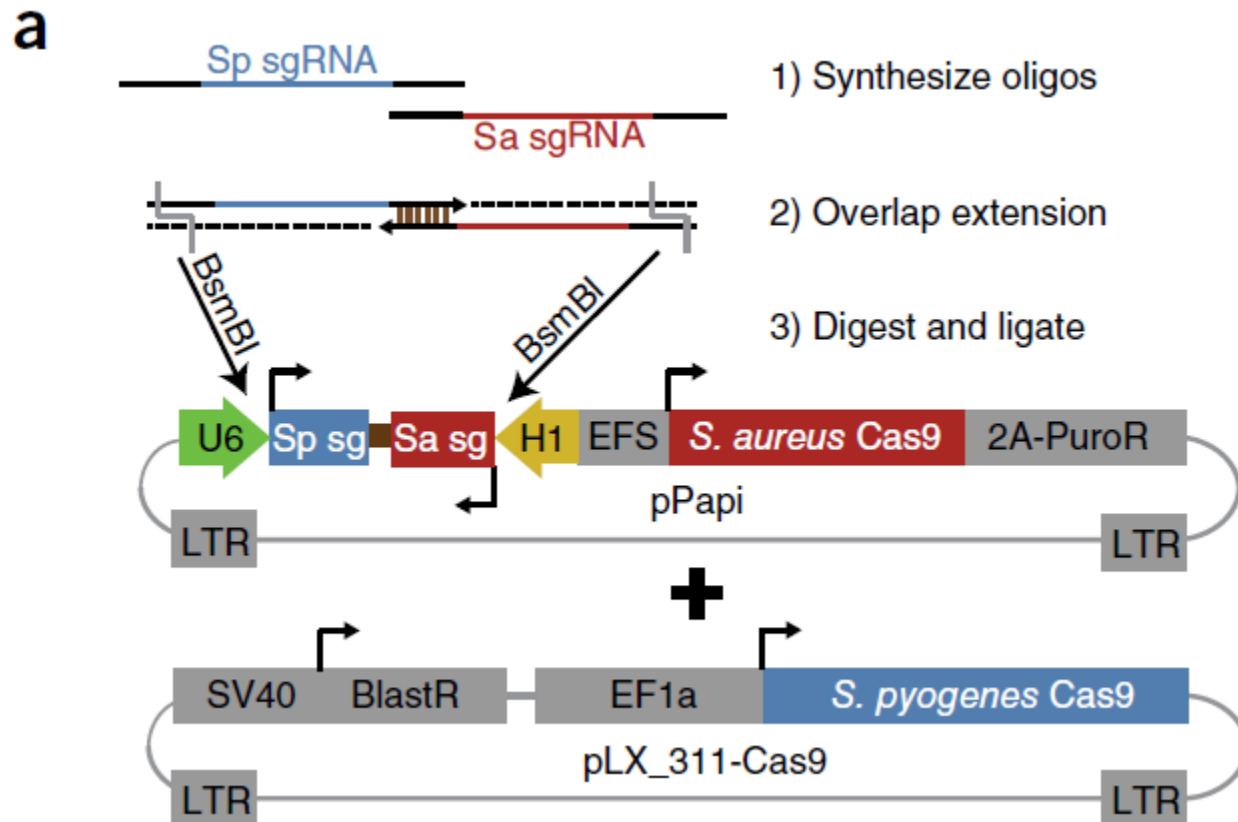


Combine knockout and overexpression (CRISPRa) in the same screen
Dubbed Big Papi screens

Aim: to develop a system with maximal on-target efficiency at two independent genomic sites

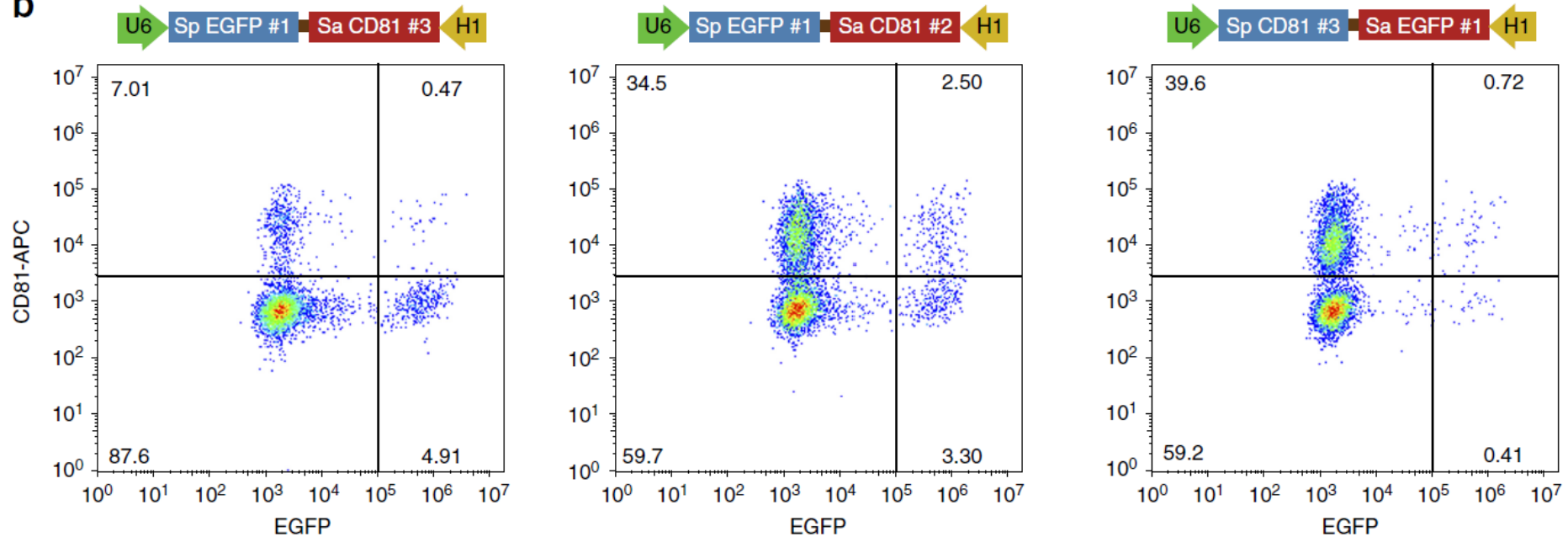


Design a lentiviral construct pPapi to express SaCas9 and two sgRNAs from the U6 and H1 promoters

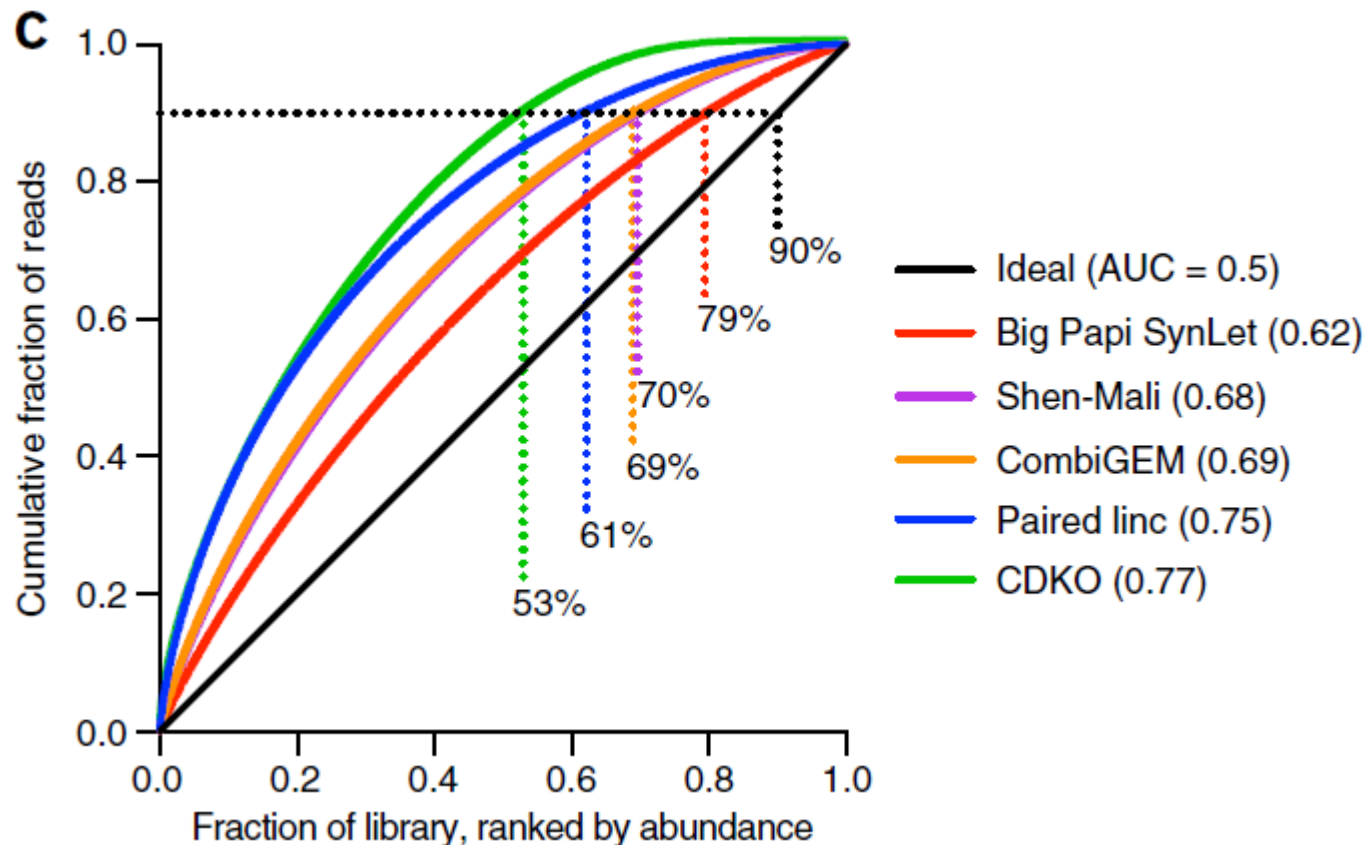


Double knockout efficiency by partenering SaCas9 and SpCas9 sgRNAs

b



Comparing Big Papi SynLet library to four other published libraries



79% of sgRNA pairs were found in the top 90% of the reads

Design sgRNAs for CRISPRko (*S. pyogenes* and *S. aureus*)

For notes about revisions, updates, and bug fixes please see our [sgRNA Design Tool Changelog](#).

This tool ranks and picks candidate sgRNA sequences for the targets provided, while attempting to maximize on-target activity and minimizing off-target activity. For more information about the inputs and outputs of this tool, see [How to use the sgRNA Designer \(CRISPRko\)](#).

On-target scoring is performed using the "Rule Set 2" method described in [Doench, Fusi et al., Nature Biotechnology 2016](#). The current Microsoft implementation of this scoring model is [Azimuth 2.0](#). Off-target sites are evaluated using the CFD (Cutting Frequency Determination) score. Please see [How the sgRNA Designer Works](#) for more details on these annotation strategies. For general discussion on sgRNA design, see [Addgene](#). The [Brunello](#) and [Brie](#) human and mouse libraries using this design methodology and an earlier version of the Rule Set 2 model are available from Addgene.

Looking for a downloadable tool to compute CFD scores for existing sgRNA designs? Go [here](#).

Select CRISPR Enzyme:

The scope of this tool is currently limited to the *S. pyogenes* (NGG PAM) and *S. aureus* (NNGRR PAM) CRISPR Cas9 enzyme families; i.e. only on-target sites that include the appropriate PAM are considered, and off-target CFD scores are reduced for sites that depart from this PAM.

Select Target Genome:

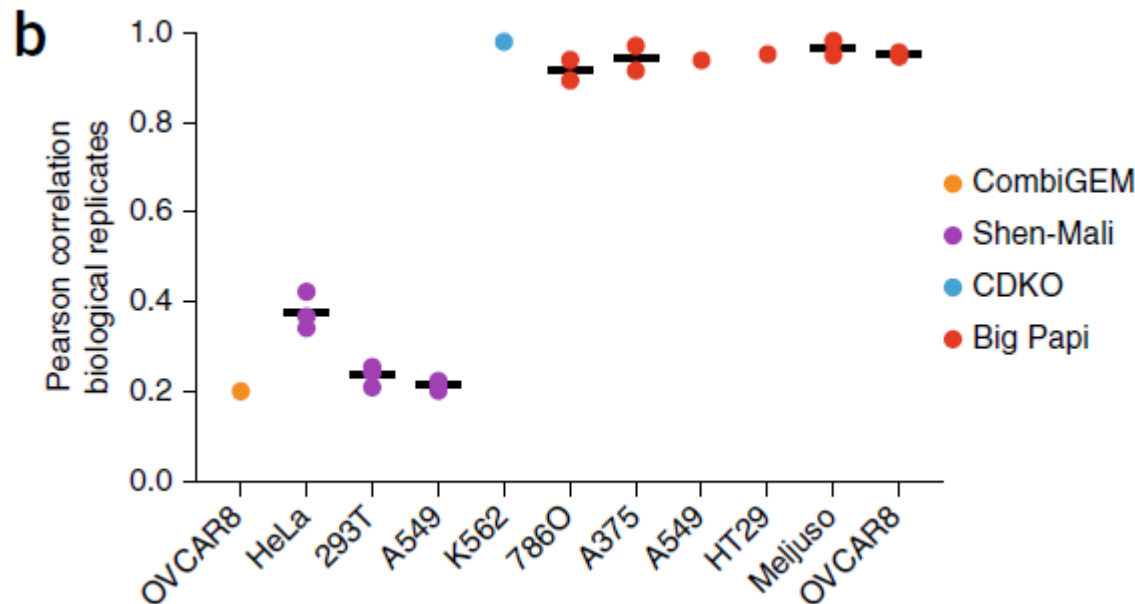
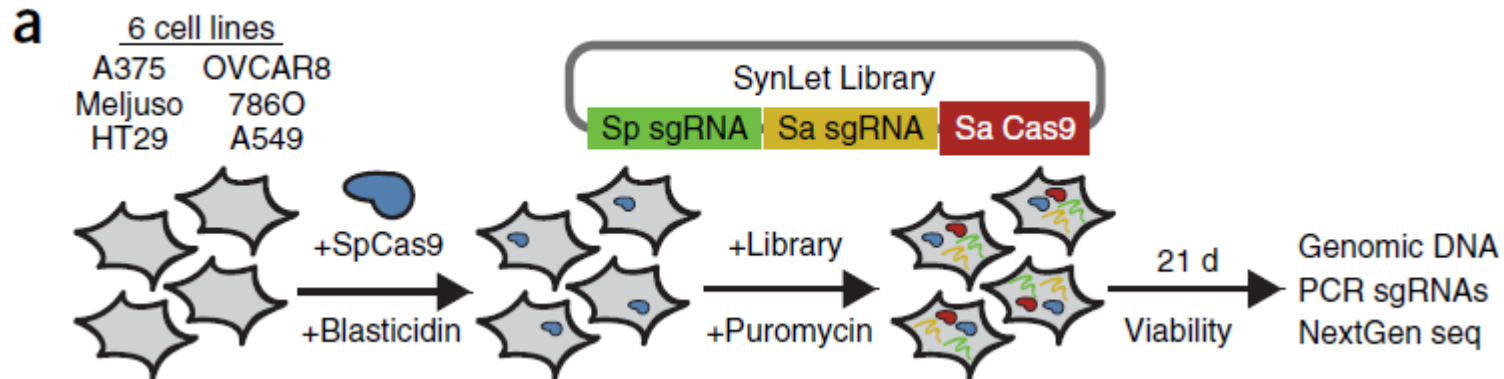
Input Transcript IDs, Gene IDs/Symbols, or raw DNA sequence:

Enter up to 100 Human or Mouse RefSeq Transcript IDs (e.g., NM_014911, NM_014911.3, etc.), NCBI Gene IDs or Gene Symbols (e.g., 988, CDC5L, etc.), or a single nucleotide sequence of at least 30 bases.

Please refer to our [sgRNA Designer Help Page](#) for details on how a transcript is chosen for a gene input.

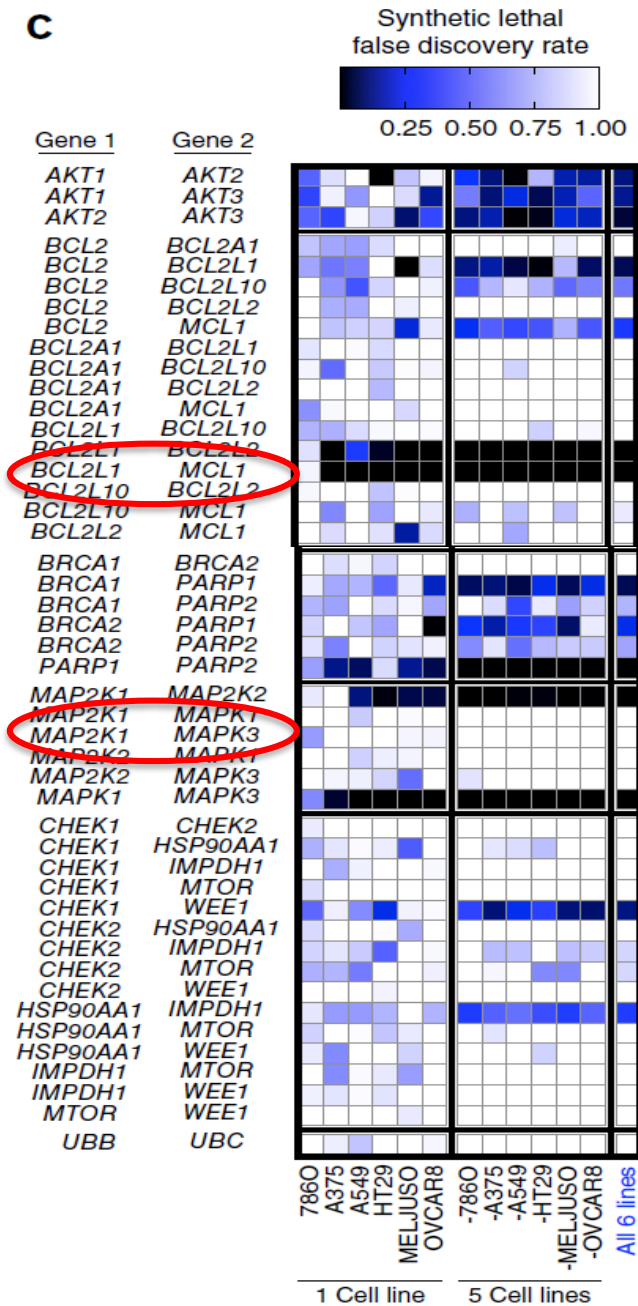
Or Upload a list of Transcript IDs, Gene IDs/Symbols, or a FASTA file of DNA sequences:

- To test the Big Papi approach by screening for **synthetic lethal gene combinations**
- Selected gene families with known or potential redundancy in their function, including **MAPKs, AKTs, and ubiquitins**
- Each gene pair was assessed with **18 unique sgRNA combinations** (2 Cas9s \times 3 gene A sgRNAs \times 3 gene B sgRNAs)
- Targeted two control genes: **EEF2** (3 sgRNAs), a core essential gene, and **CD81** (10 sgRNAs), a cell surface marker with two sets of negative controls, sgRNAs that target introns of **HPRT1** (5 sgRNAs)
- The resulting $96 \times 96 = 9,216$ member **SynLet library** was packaged into lentivirus for use in six diverse tumor cell lines engineered to express SpCas9: A375 (skin); Meljuso (skin); HT29 (colon); A549 (lung); 786O (kidney) and OVCAR8 (ovary)



Independent infection
replicates well correlated for
all six cell lines

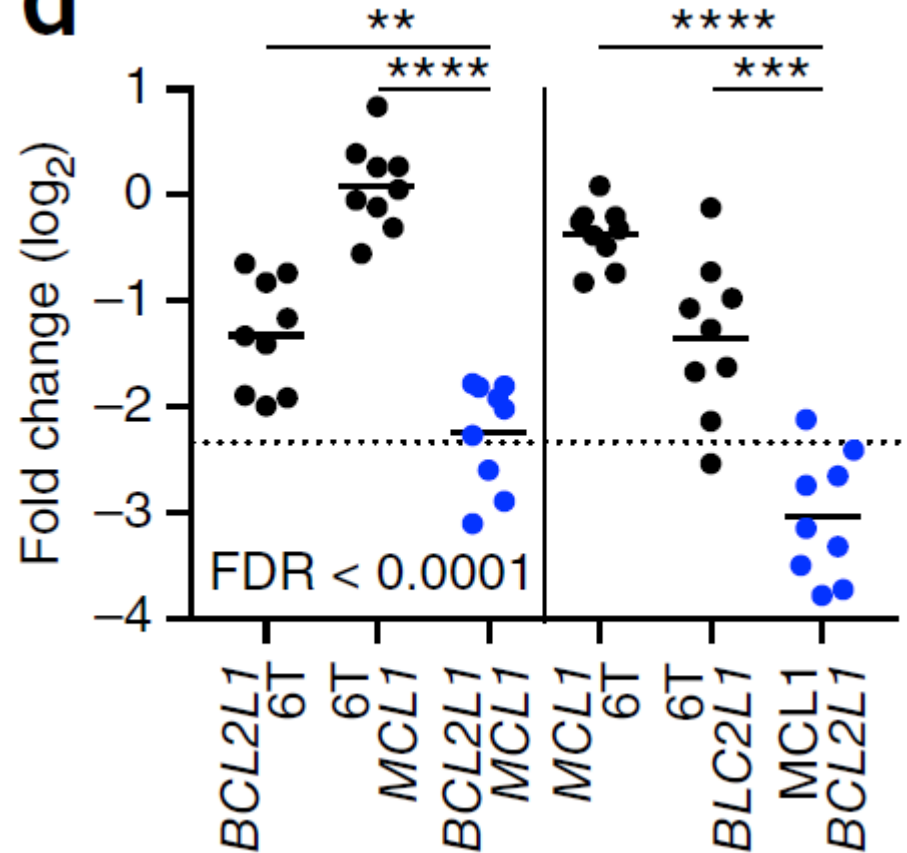
c



Primary screen data

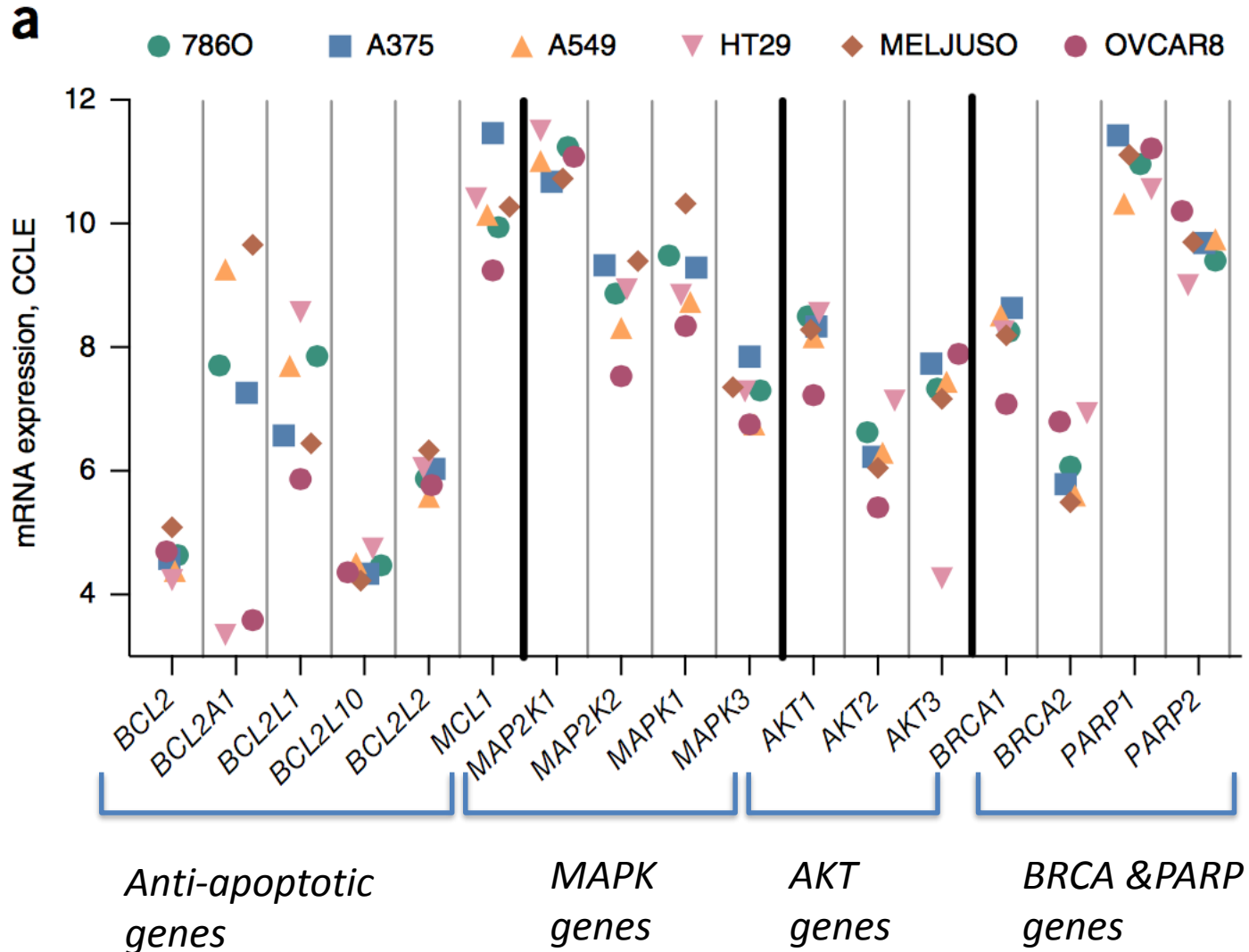
Performance of sgRNAs for BCL2L1 & MCL1

d

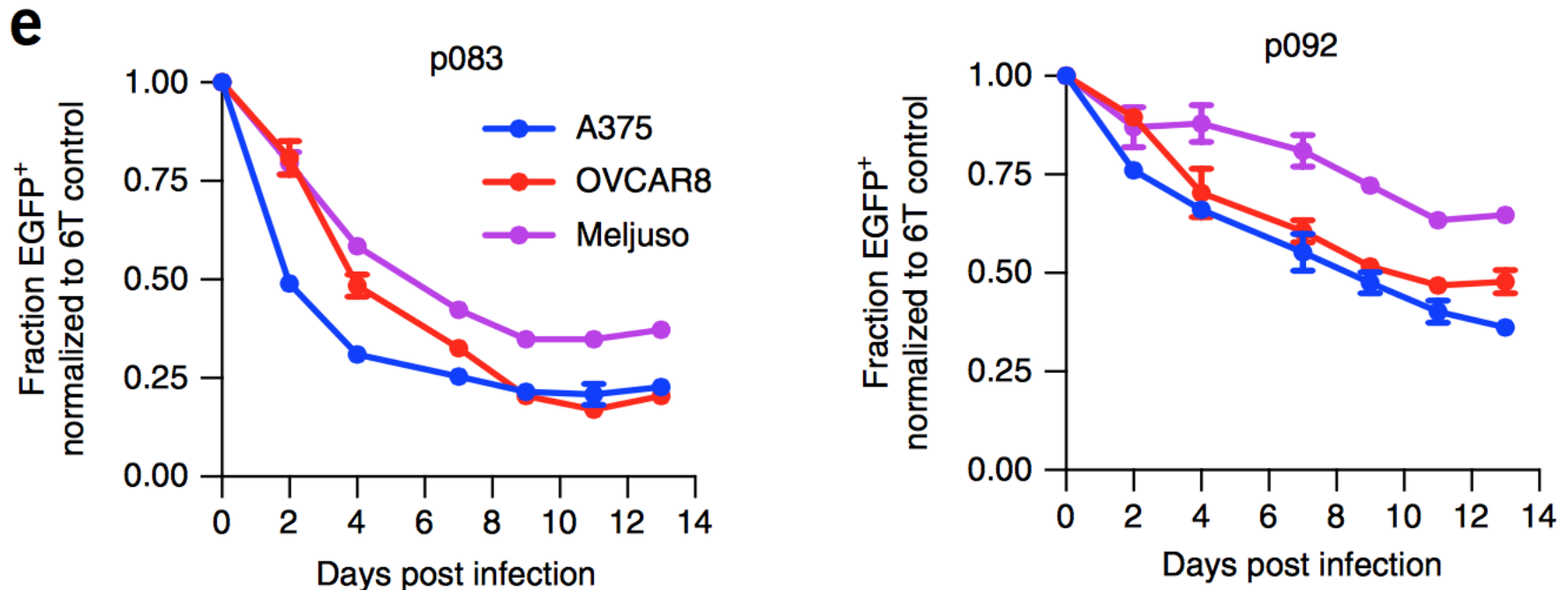
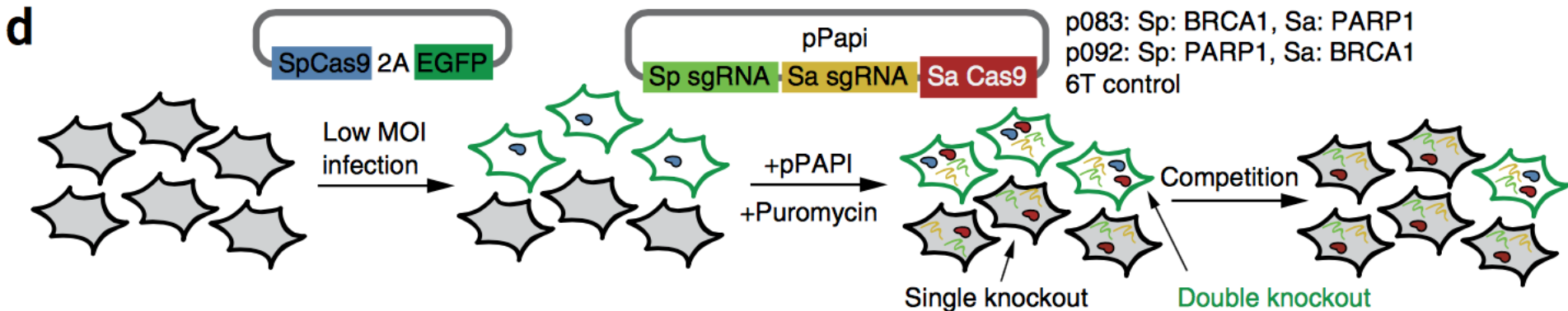


Genetic interactions & Gene expression values

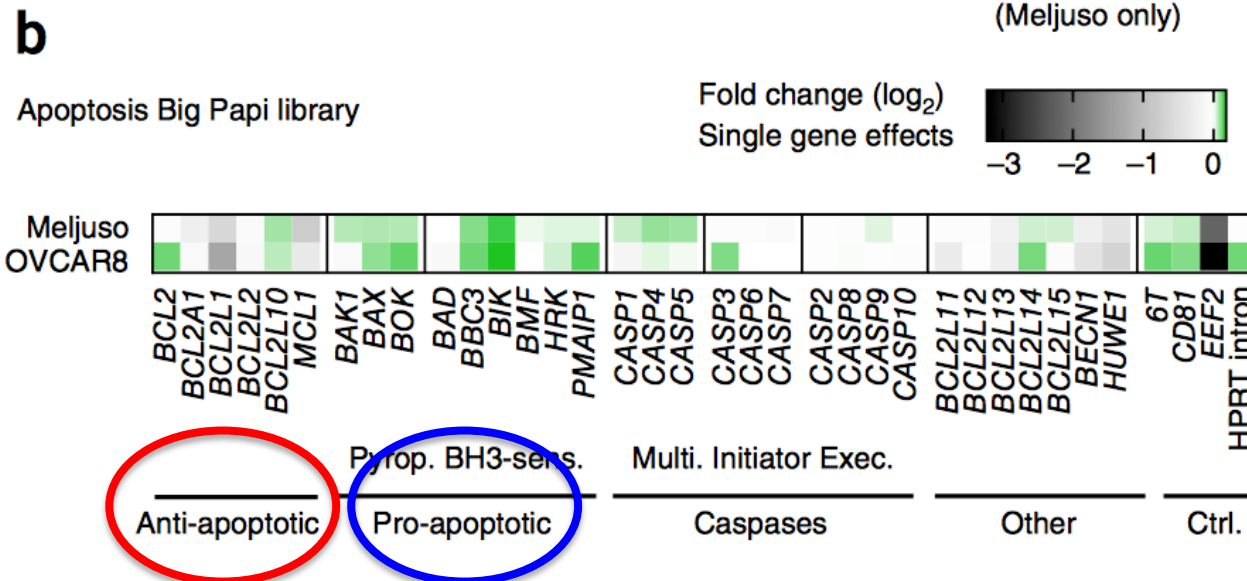
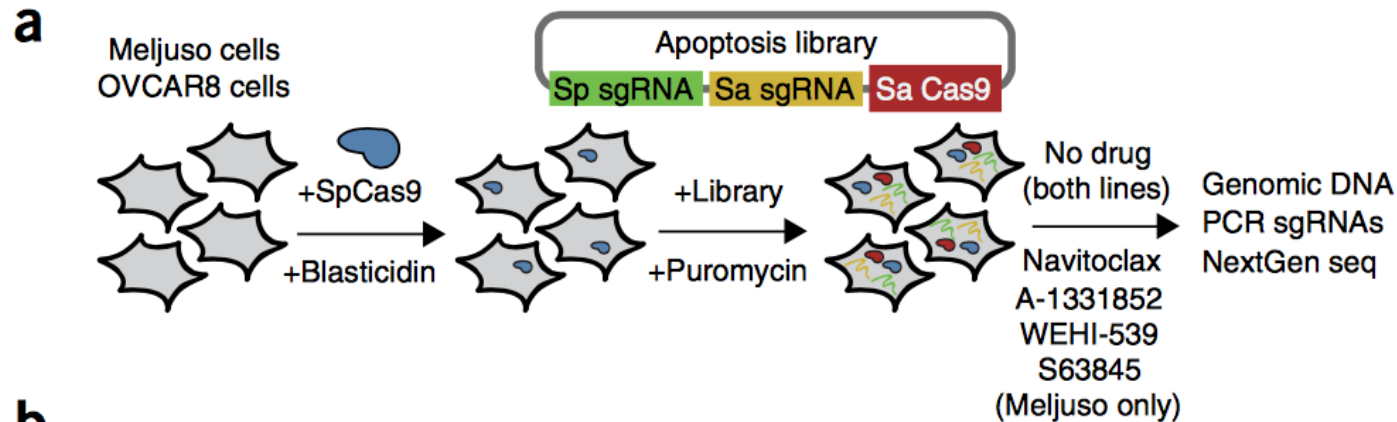
6 tumor cell lines engineered to express SpCas9 (kidney, skin, lung, colon, skin, ovary)



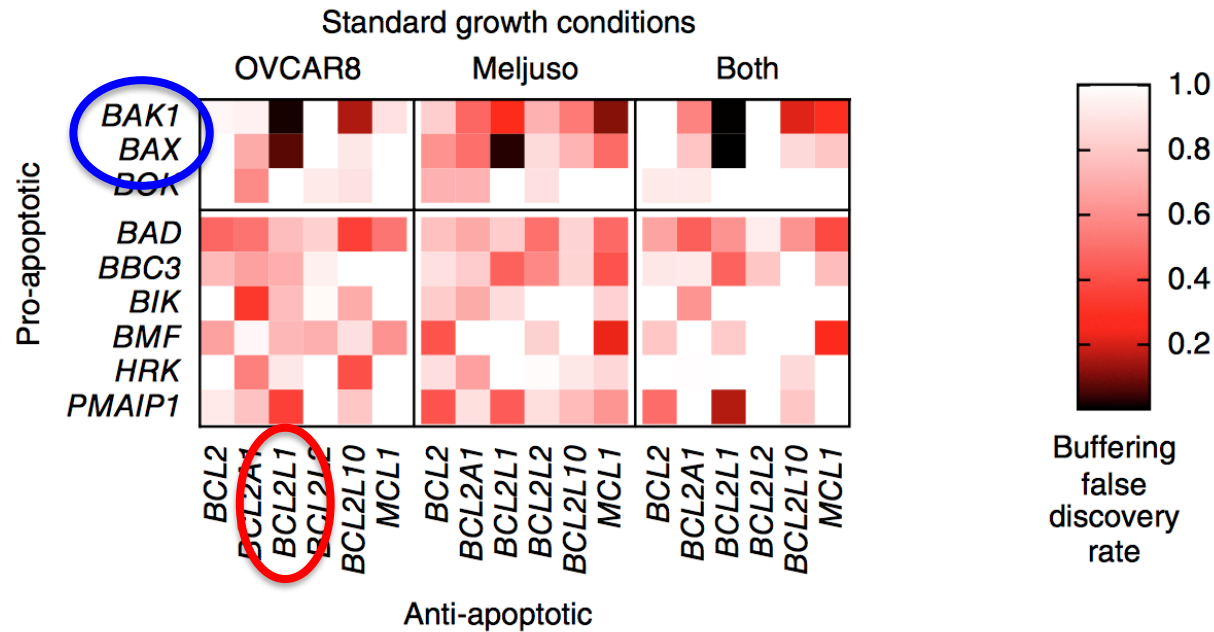
To compare cell viability of single vs. double KO of BRCA1 and PARP1



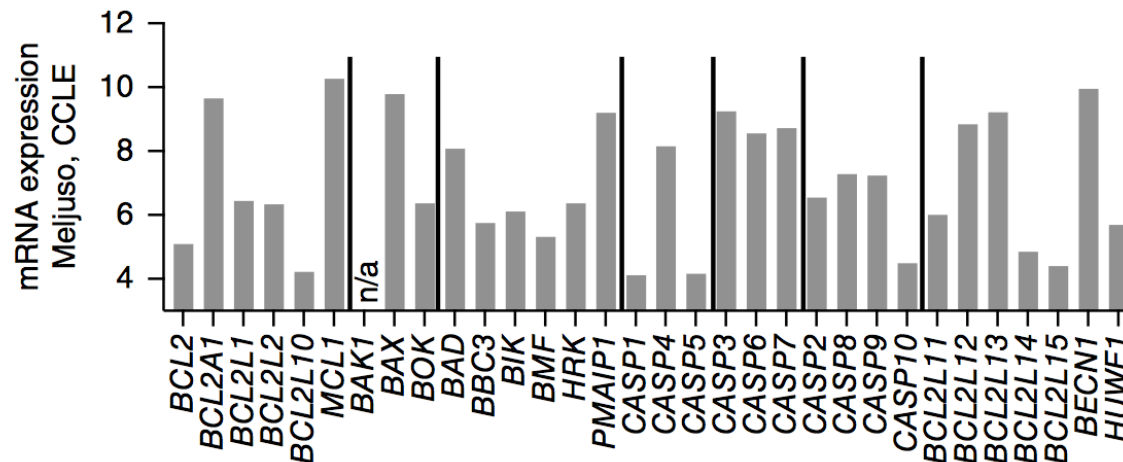
Genes targeted by the Apoptosis library and cell viability effects



c



d



Applications / Advantages

- efficient, cost effective, and supports pooled library generation and screening
- identified interactions within several groups of functionally related genes with high statistical confidence
- to map buffering interactions between genes involved in apoptosis, both in standard growth conditions, revealing additional genetic interactions
- combined CRISPR-mediated knockout and overexpression to uncover interactions with *TP53*
- reasonable performance with only two sgRNAs per gene
- **Big Papi approach: powerful mean to map genetic interactions in mammalian cells**

Open questions / Disadvantages

- The importance of cell context in detecting interactions
- **SynLet Library**: no gene pair scored strongly ($\text{FDR} < 0.01$) in all six cell lines
- Some interactions detected more strongly in some lines compared to others: influence of mutation status and mRNA expression?
- Combining information across cell lines – useful strategy for detecting generalizable interactions?

Dual gene activation and knockout screen reveals directional dependencies in genetic networks

Michael Boettcher¹, Ruilin Tian², James A Blau¹, Evan Markegard³, Ryan T Wagner¹, David Wu¹, Xiulei Mo⁴, Anne Biton^{5,6}, Noah Zaitlen⁵, Haian Fu⁴, Frank McCormick³, Martin Kampmann² & Michael T McManus¹

¹Department of Microbiology and Immunology, University of California San Francisco Diabetes Center, WM Keck Center for Noncoding RNAs, University of California, San Francisco, San Francisco, California, USA. ²Institute for Neurodegenerative Diseases, Department of Biochemistry and Biophysics, University of California, San Francisco and Chan Zuckerberg Biohub, San Francisco, California, USA. ³Helen Diller Family Comprehensive Cancer Center, Department of Microbiology and Immunology, University of California, San Francisco, San Francisco, California, USA. ⁴Department of Pharmacology and Emory Chemical Biology Discovery Center, Emory University School of Medicine, Atlanta, Georgia, USA. ⁵Department of Medicine, Lung Biology Center, University of California, San Francisco, San Francisco, California, USA. ⁶Centre de Bioinformatique, Biostatistique et Biologie Intégrative (C3BI, USR 3756 Institut Pasteur et CNRS), Paris, France. Correspondence should be addressed to M.T.M. (michael.mcmanus@ucsf.edu).

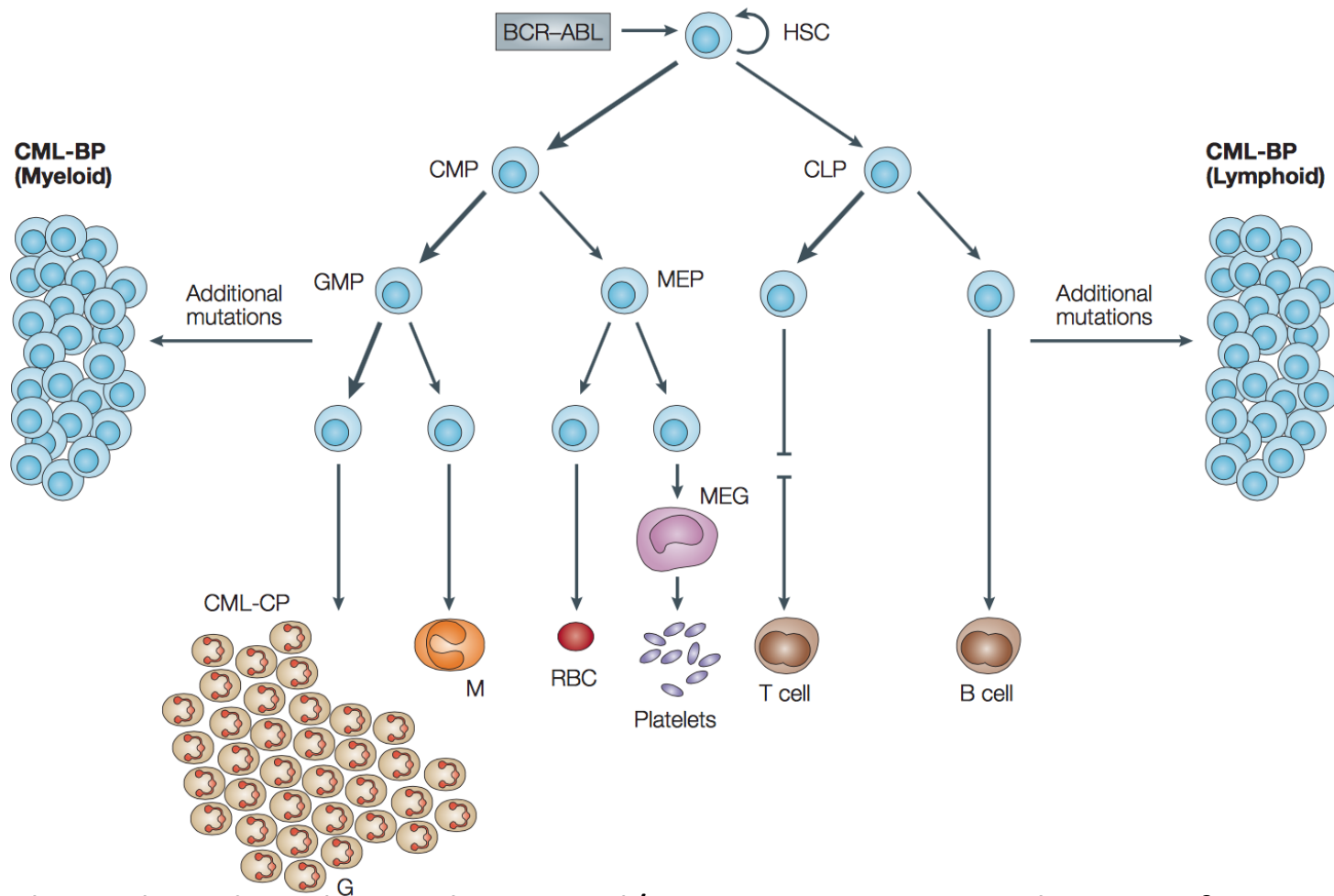
Study Rationale

→ To identify directional genetic interactions between genes whose activation or ablation alter the fitness of human chronic myeloid leukemia (CML) cells



- ✓ Orthogonal screening approach can quantify loss- and gain-of-function phenotypes from the same cell
- ✓ To systematically identify genetic interactions between cancer-relevant genes

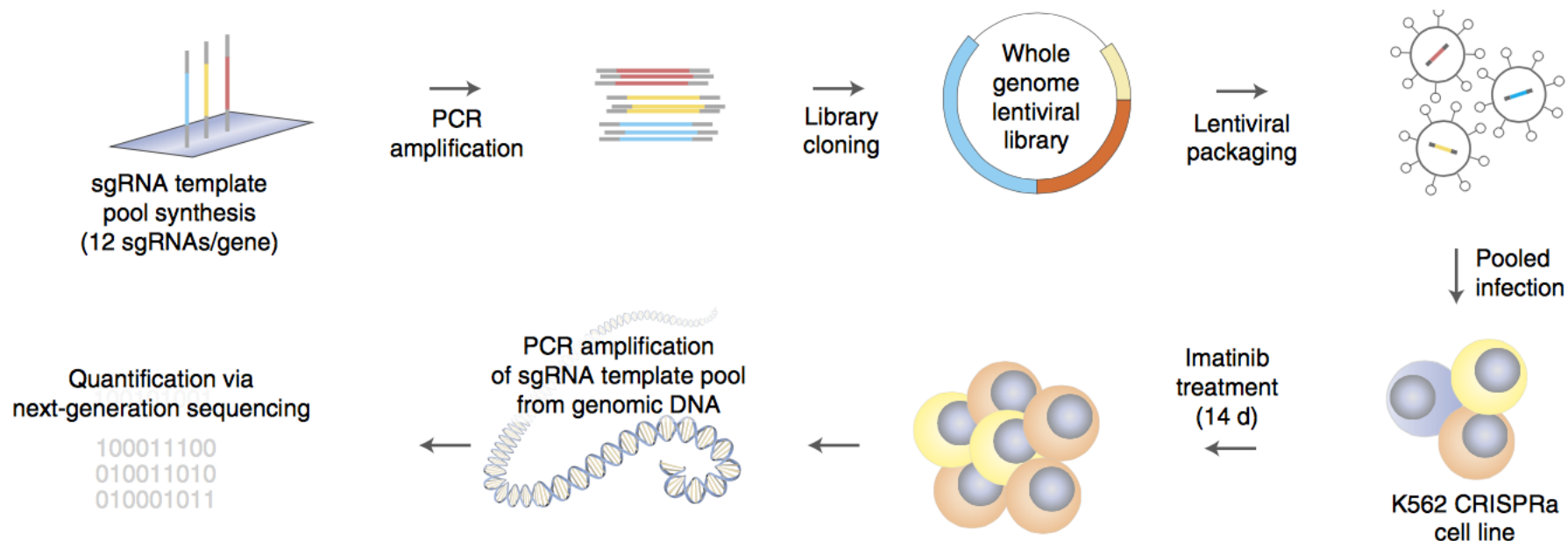
Development of chronic myeloid leukemia



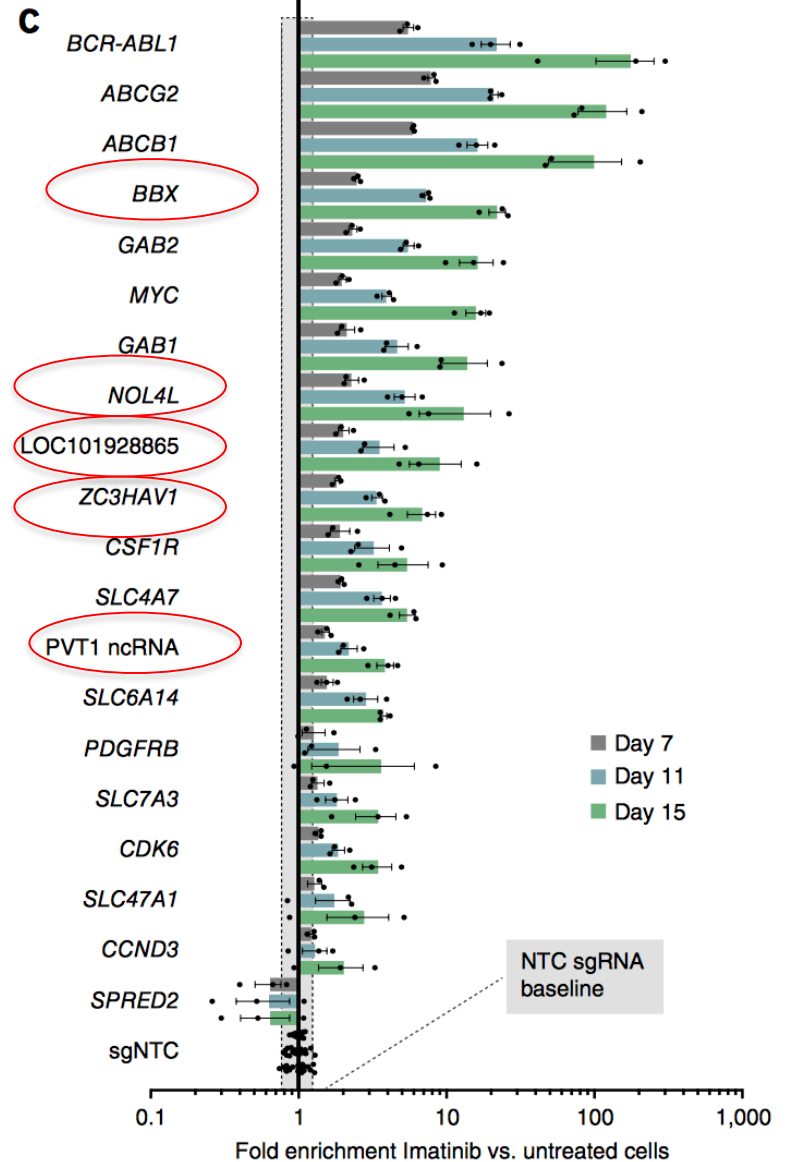
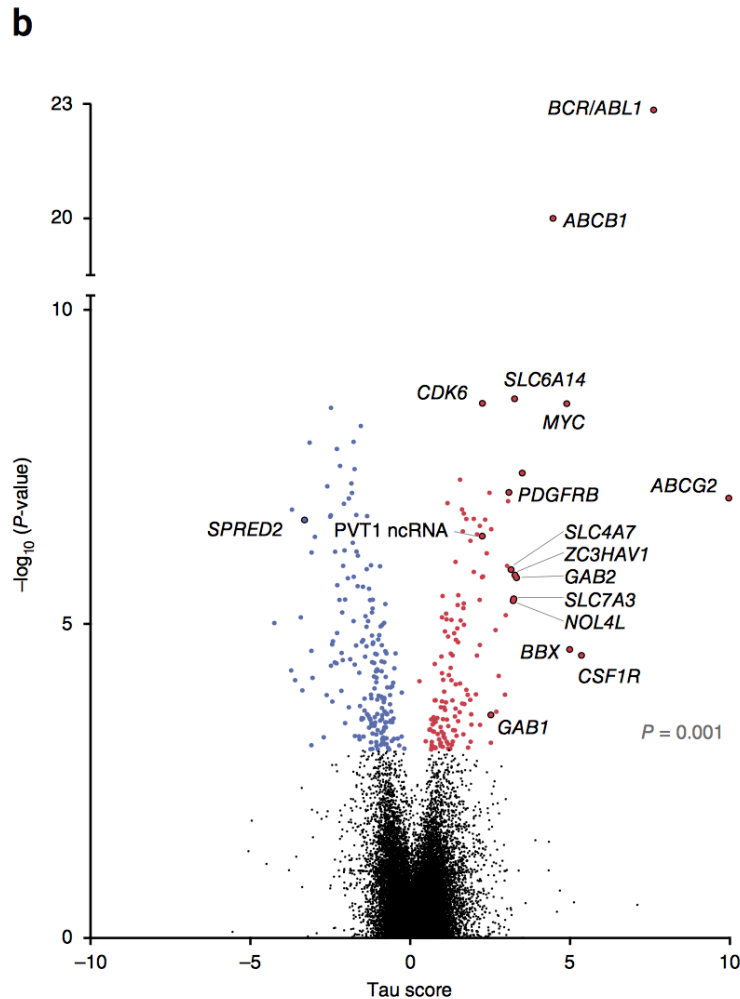
Three single-nucleotide polymorphisms and/or mRNA expression changes of **ABCB1** gene were demonstrated to be associated with inter- individual variability of **imatinib** response in CML patients

- Ultra-complex, genome-scale sgRNA library consisting of over 260,000 total sgRNAs targeting every coding and over 4,000 non-coding Refseq annotated (hg19) transcripts in the human genome
- ✓ Characterize K562 cell response to a broad range of imatinib drug concentrations
- ✓ Quality-controlled sgRNA libraries
- ✓ Abundance of sgRNA-encoding sequences via NGS: comparing the beginning (baseline) and endpoint (day 14) of the screen
- ✓ Normalized to define an enrichment score (τ) for each gene

To systematically identify genes whose activation can alter imatinib drug response



Red: cell enrichment (43%)
Blue: depletion (57%)

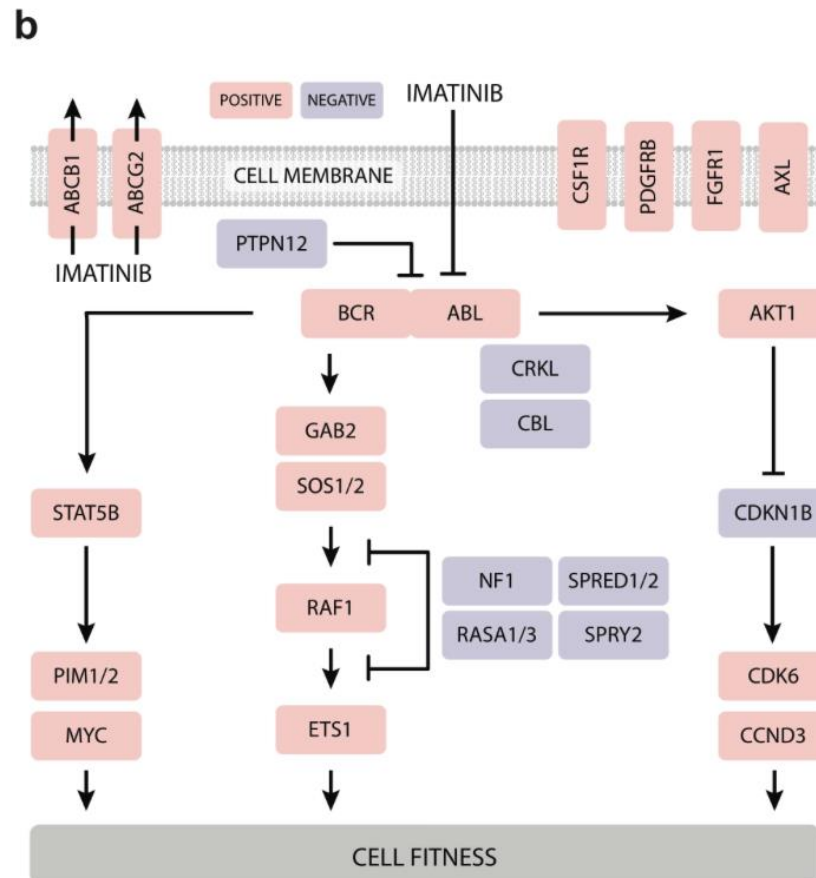


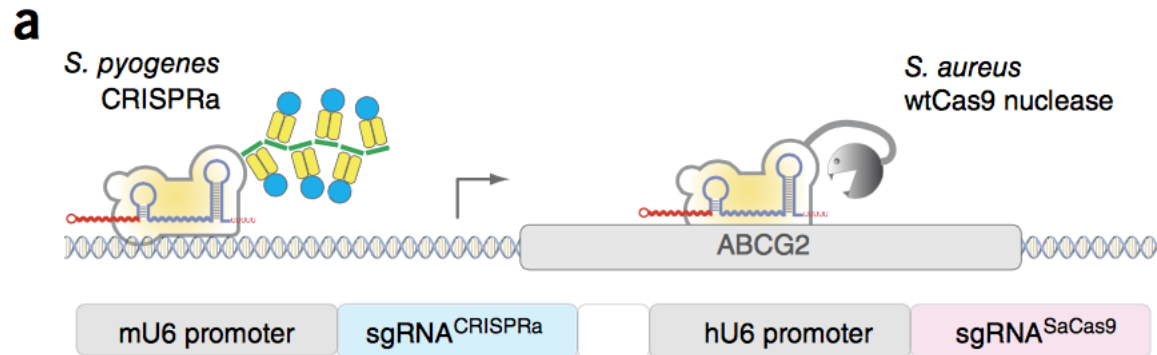
332 target genes identified
in the imatinib CRISPRa screen

Quality of the screening data:
Gene Set Enrichment Analysis
(GSEA)

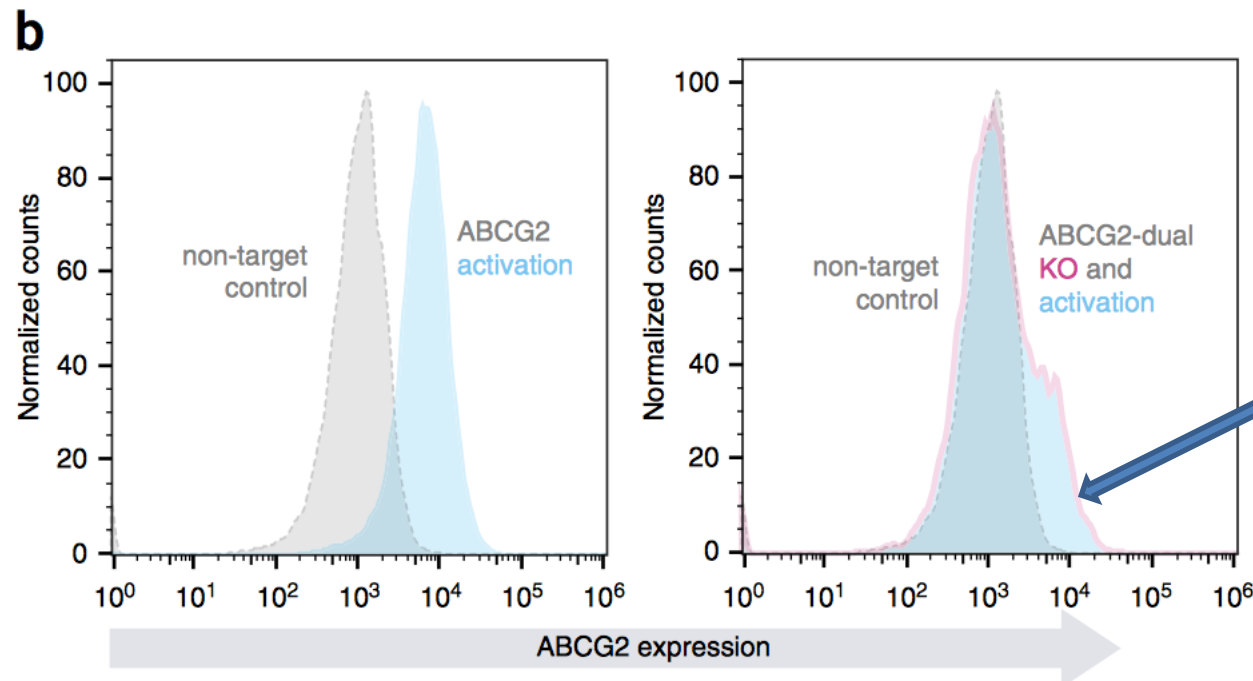
a

KEGG Pathway	Enrichment	p	FDR
Acute myeloid leukemia	11.54	6.6E-10	8.08E-07
Chronic myeloid leukemia	9.67	1.2E-09	1.45E-06
ErbB signaling pathway	8.00	1.3E-08	1.63E-05
Pathways in cancer	3.42	4.5E-08	5.49E-05
Transcriptional misregulation in cancer	5.03	1.9E-07	2.30E-04
MAPK signaling pathway	3.90	6.0E-07	7.45E-04

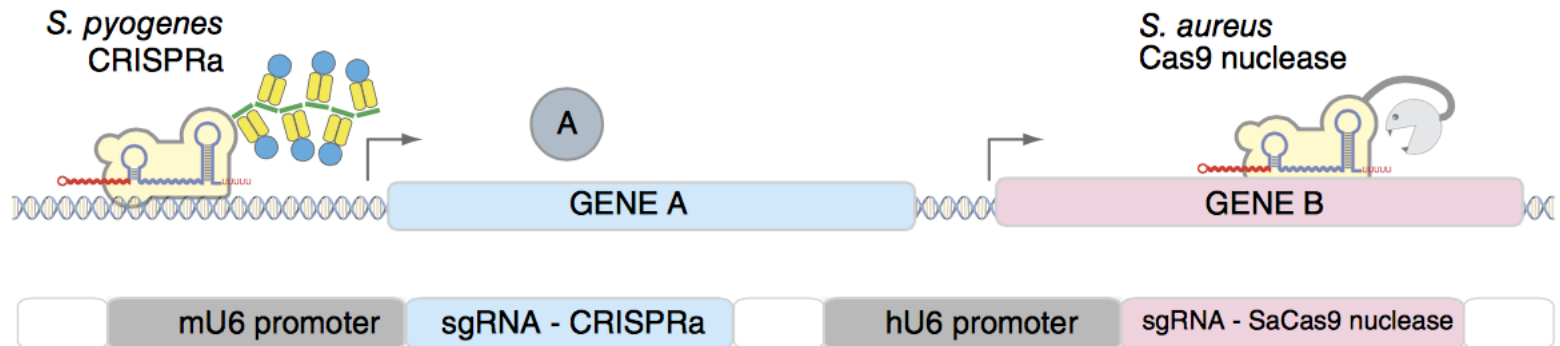
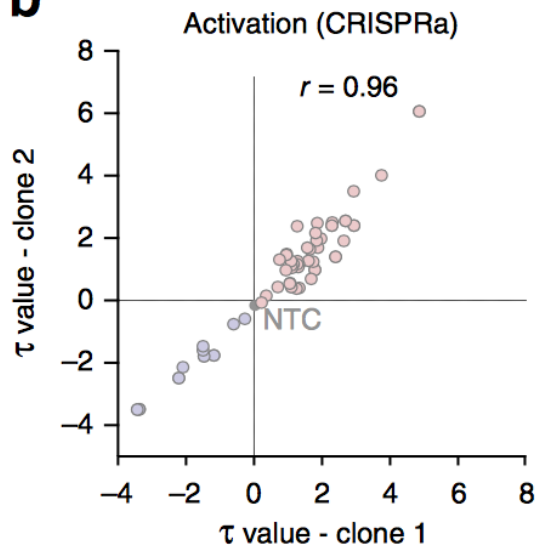
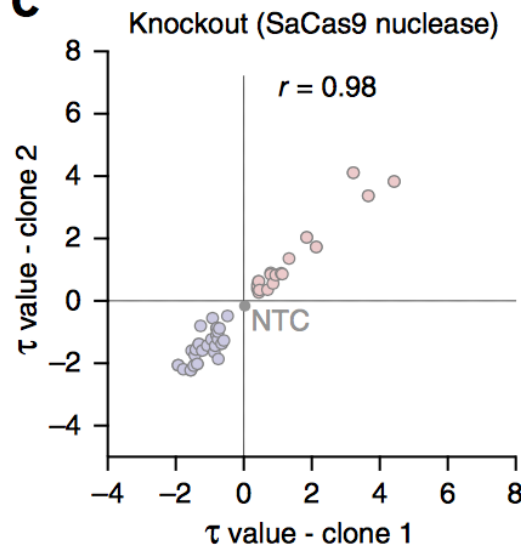
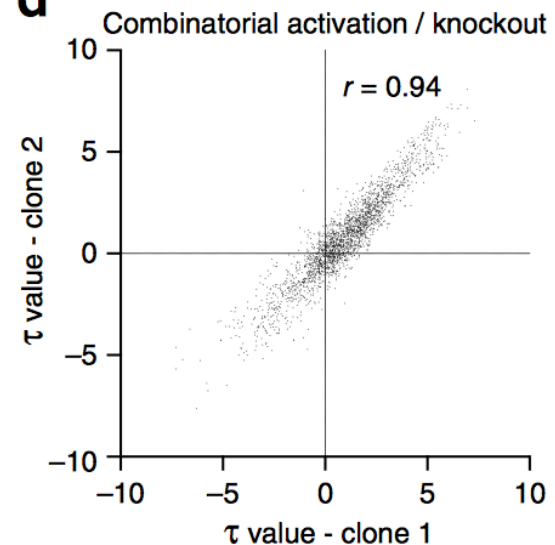




Simultaneous activation and KO of genes in the same cell by expressing two appropriate sgRNAs

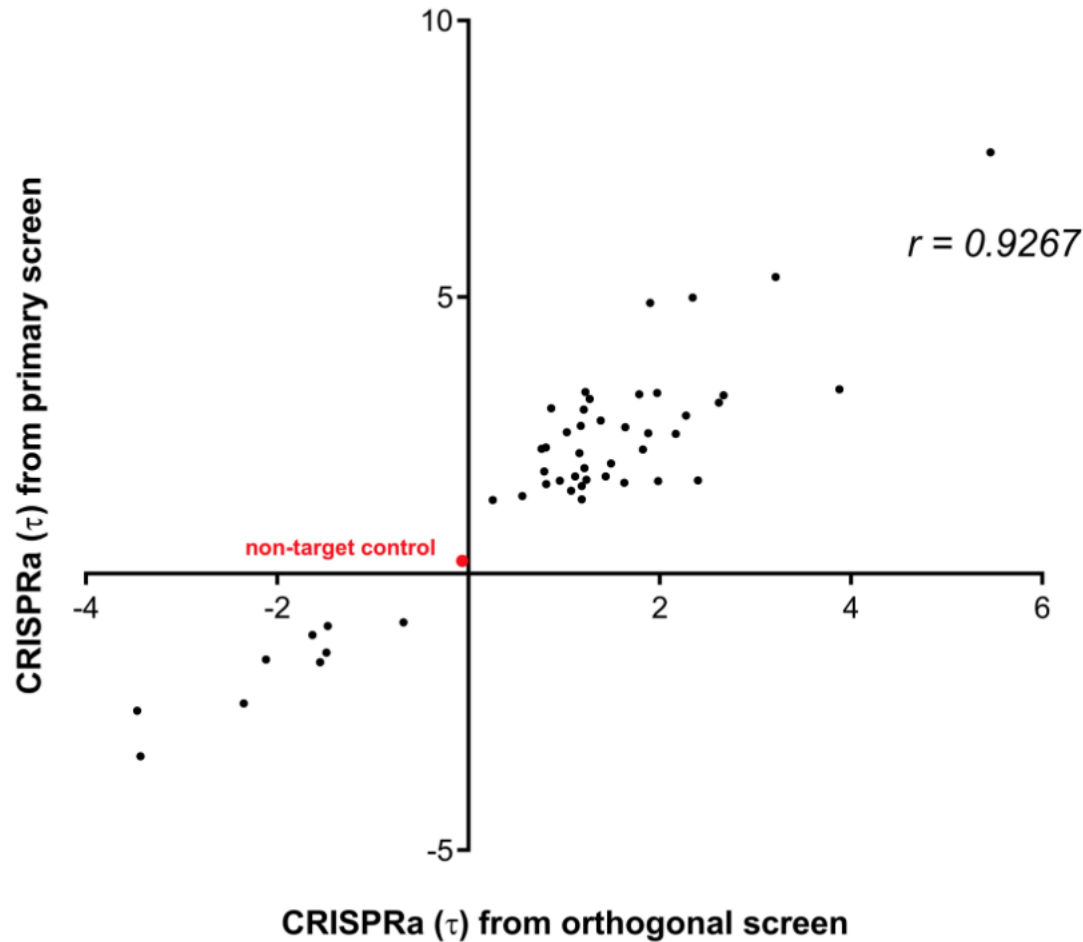


Concept of the application of the orthogonal system for DGI

a**b****c****d**

Correlation of τ values from two clonal cell line replicates – replicate performance

Screen reproducibility



Candidate genes from primary CRISPRa screen reproduce in orthogonal screen

e

		Knockout	
		NTC	Gene B
Activation	NTC		τ_{ko}
	Gene A	τ_{act}	τ_{act+ko}

Blue: depleted

Red: enriched

NTC: non-target control sgRNA

f

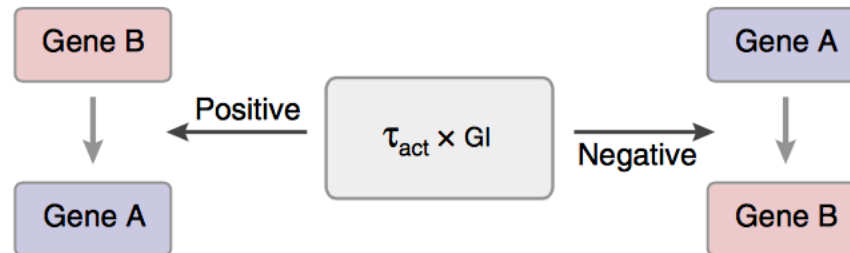
Directionality score

$$\Psi = \tau_{act} \times \tau_{ko} \times GI^2$$

GI: genetic interaction score

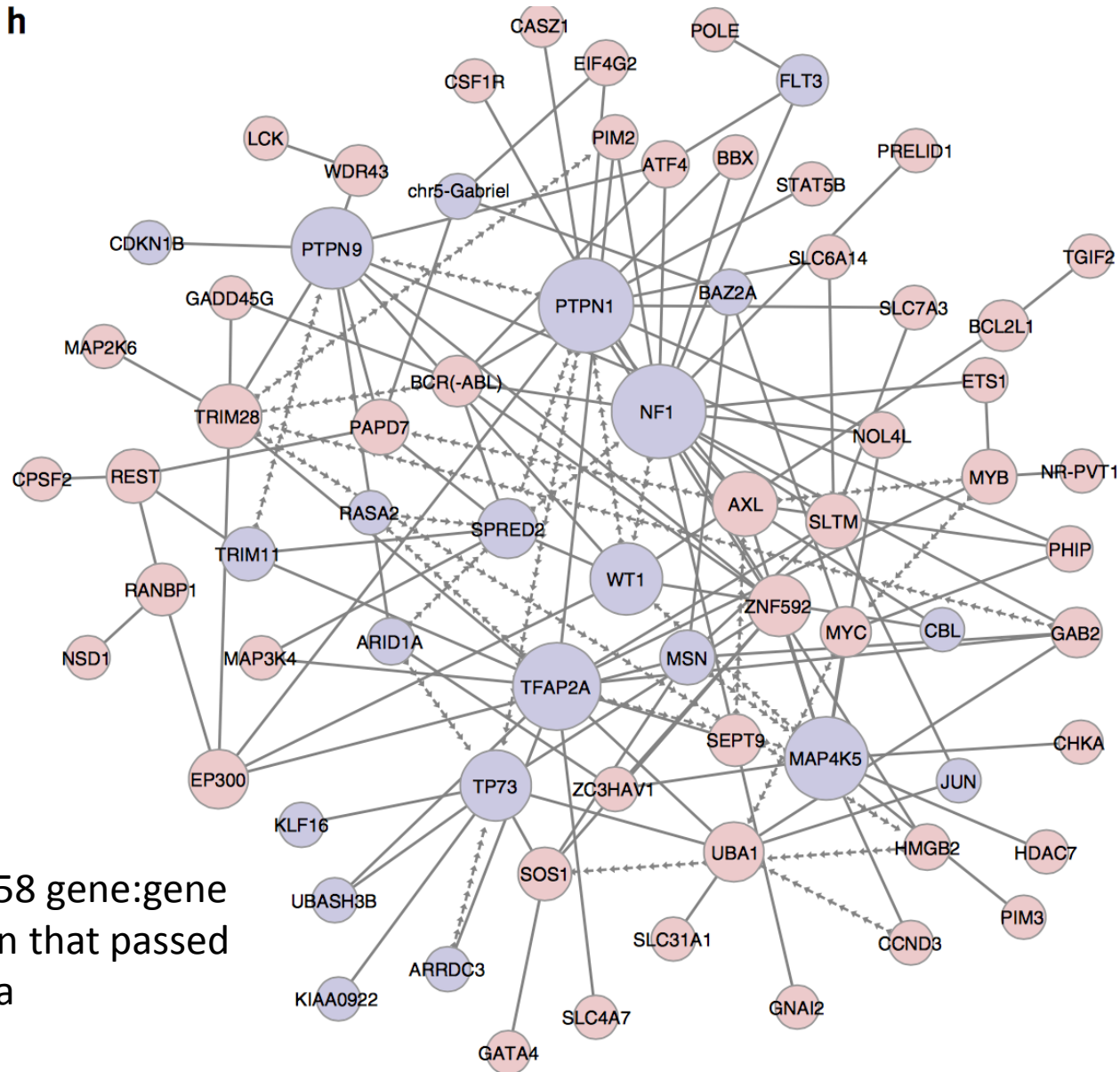
g

Activated gene functions
downstream of
the deleted
gene



Activated gene functions
upstream of
the deleted
gene

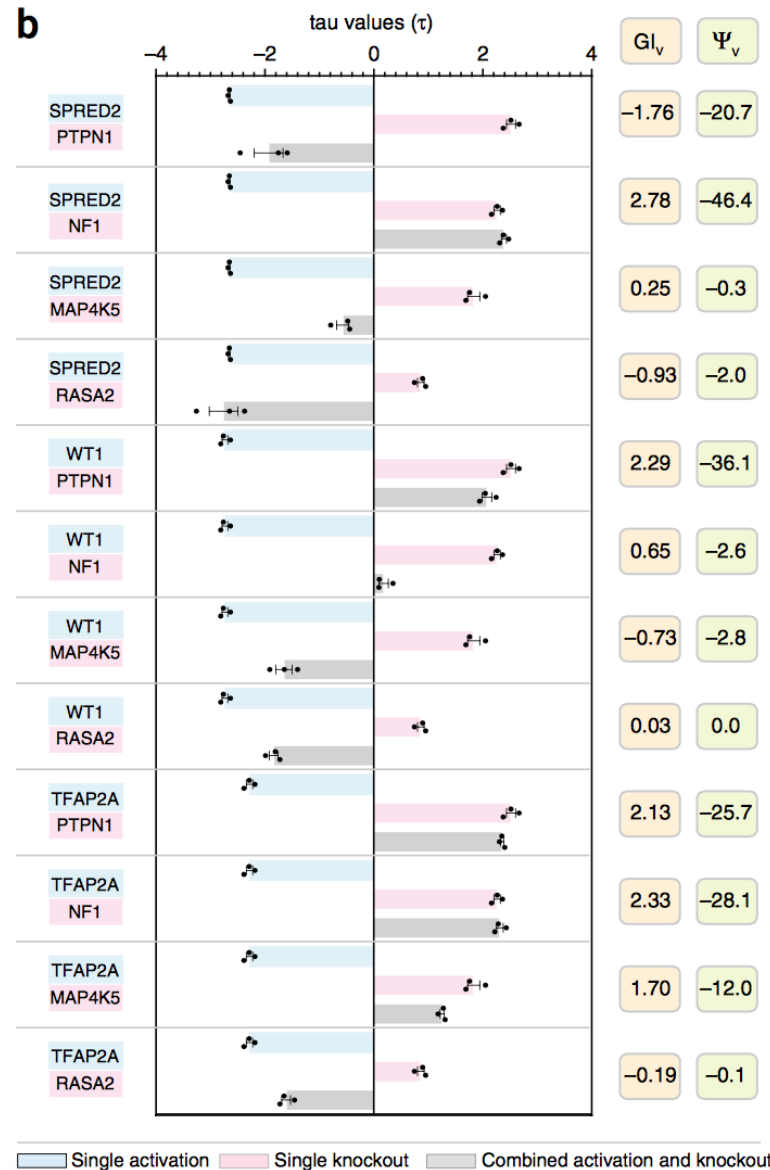
h



Red: positive
Blue: negative
regulators

Total of 2,258 gene:gene
combination that passed
filter criteria

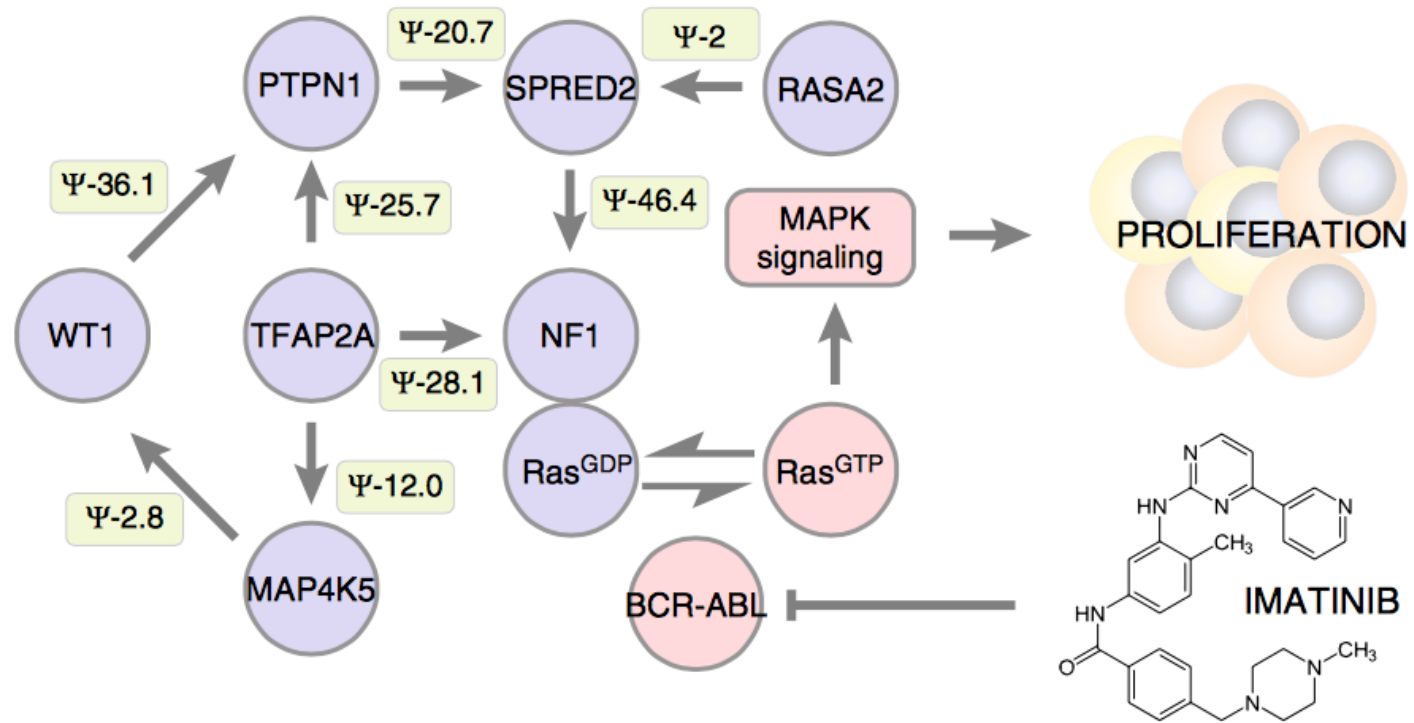
12 activation/KO
combinations
retested



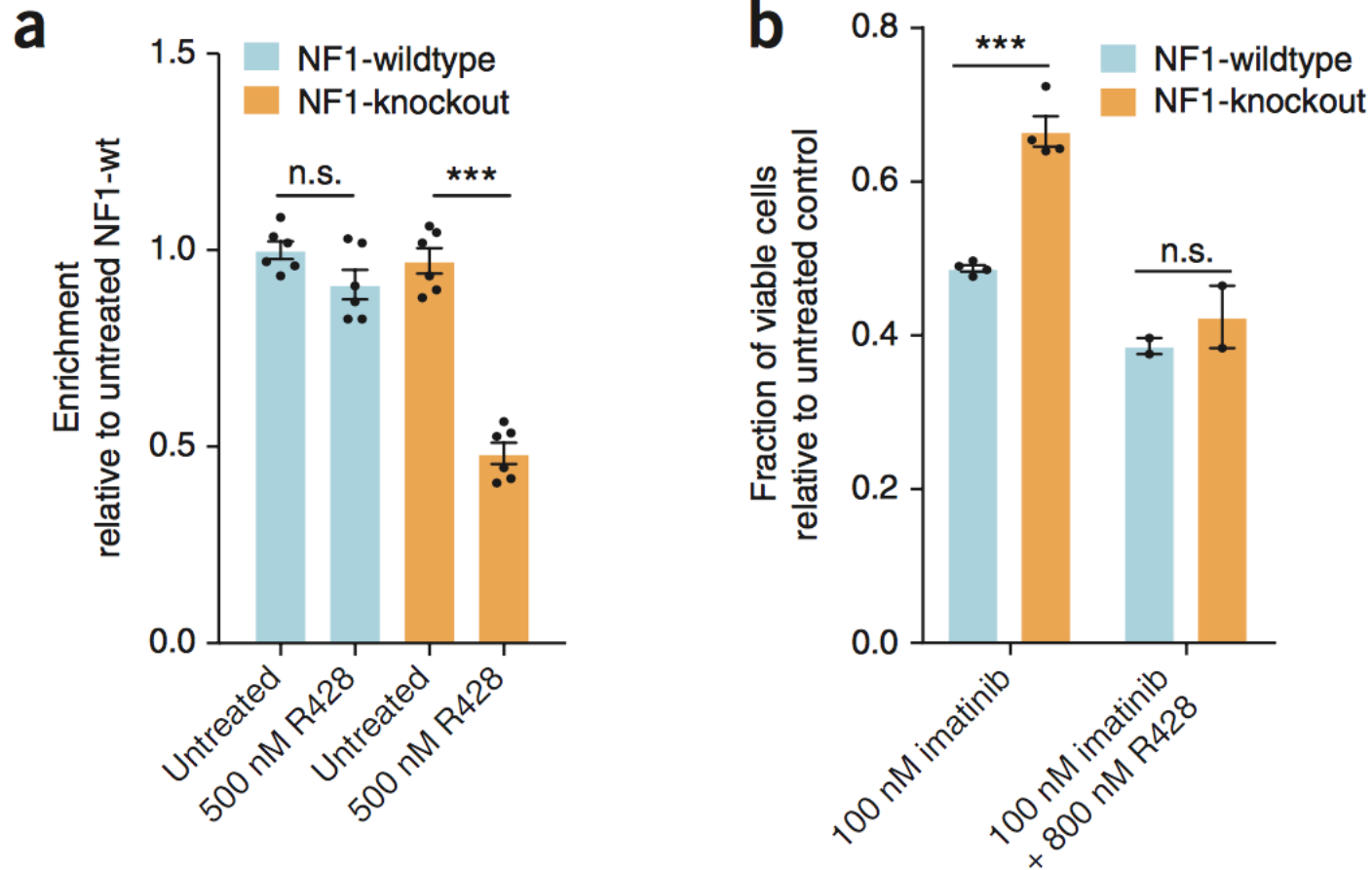
Activation of *SPRED2*, *WT1*,
TFAP2A – sensitizing effect
to imatinib

Deletion of *PTPN1*, *NF1*,
MAP4K5, *RASA2* – enriched
cells in the culture over time

C

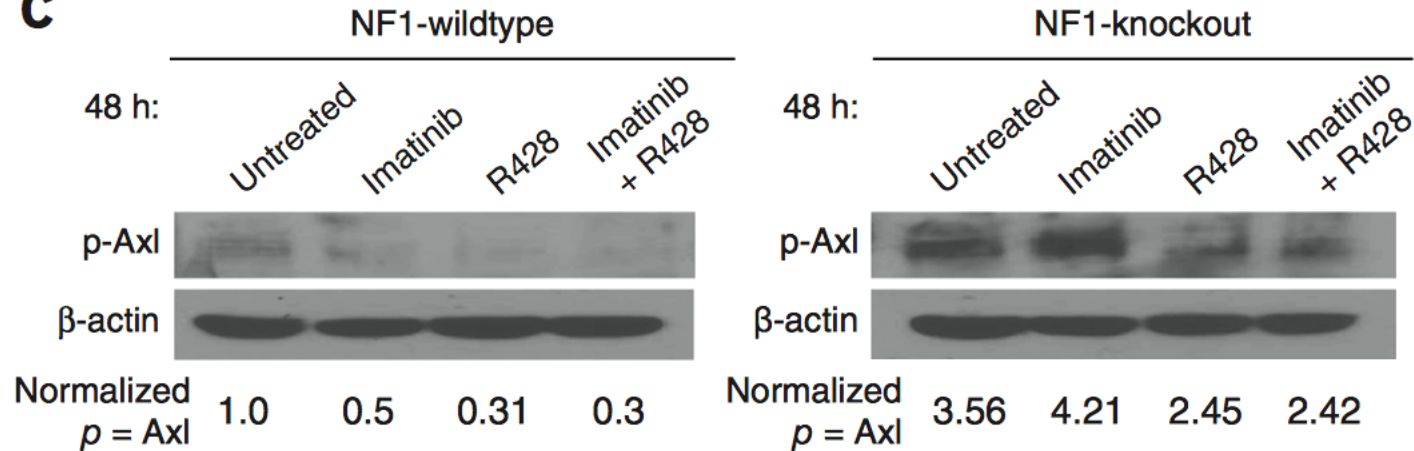
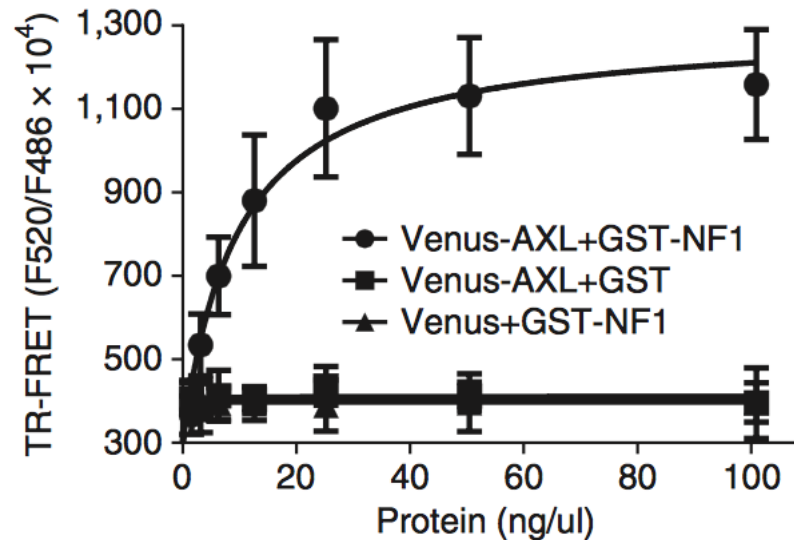
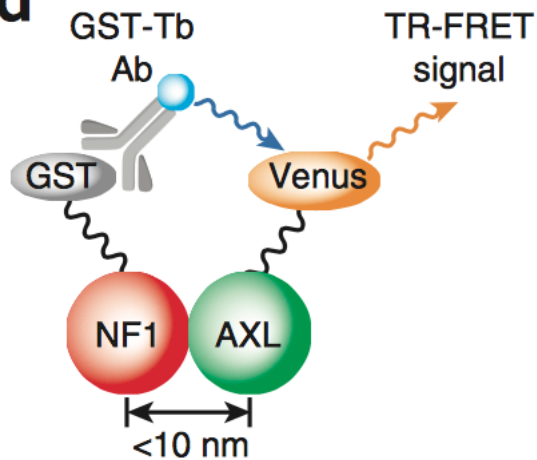


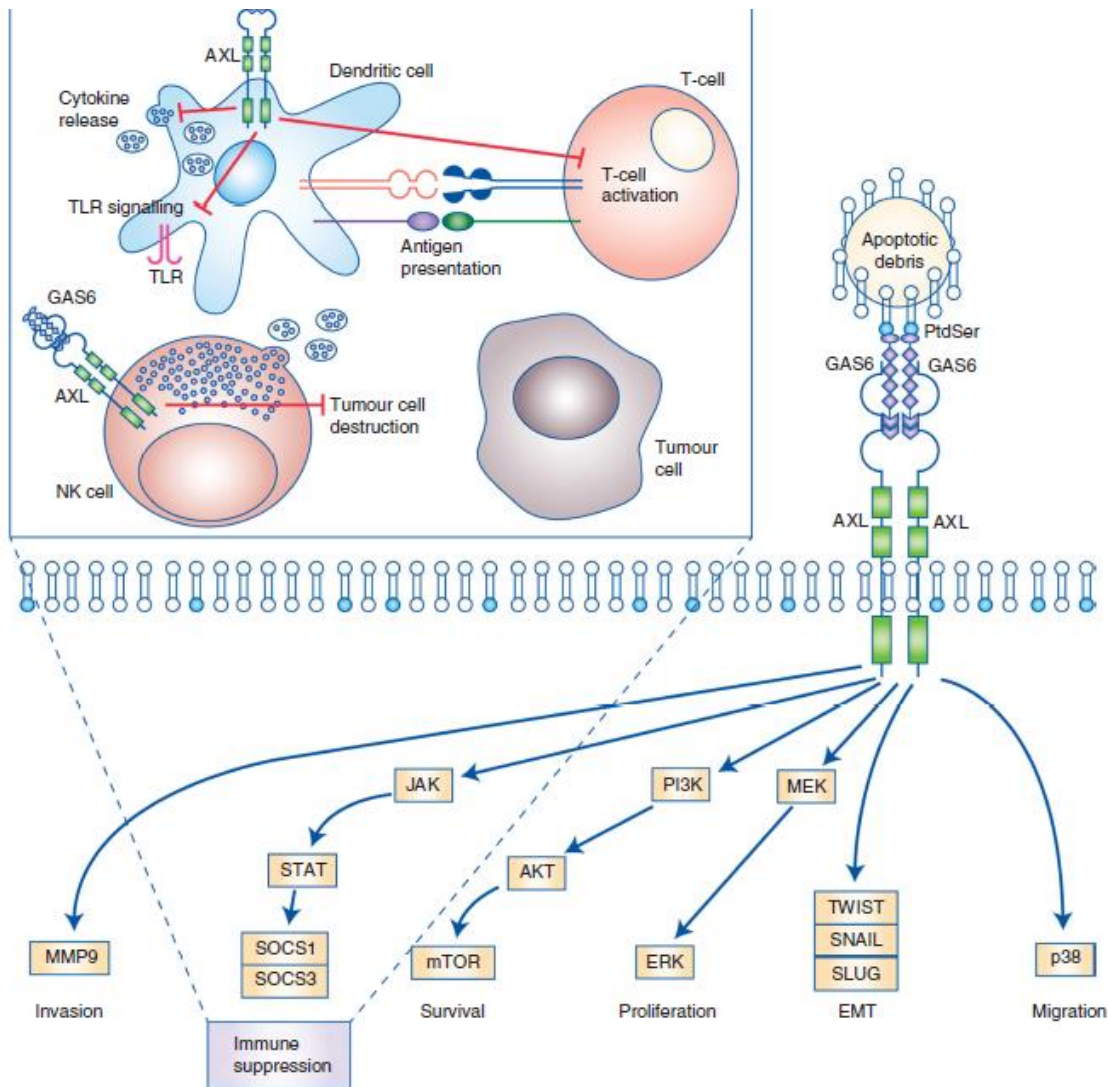
Arrows: direction of functional dependencies



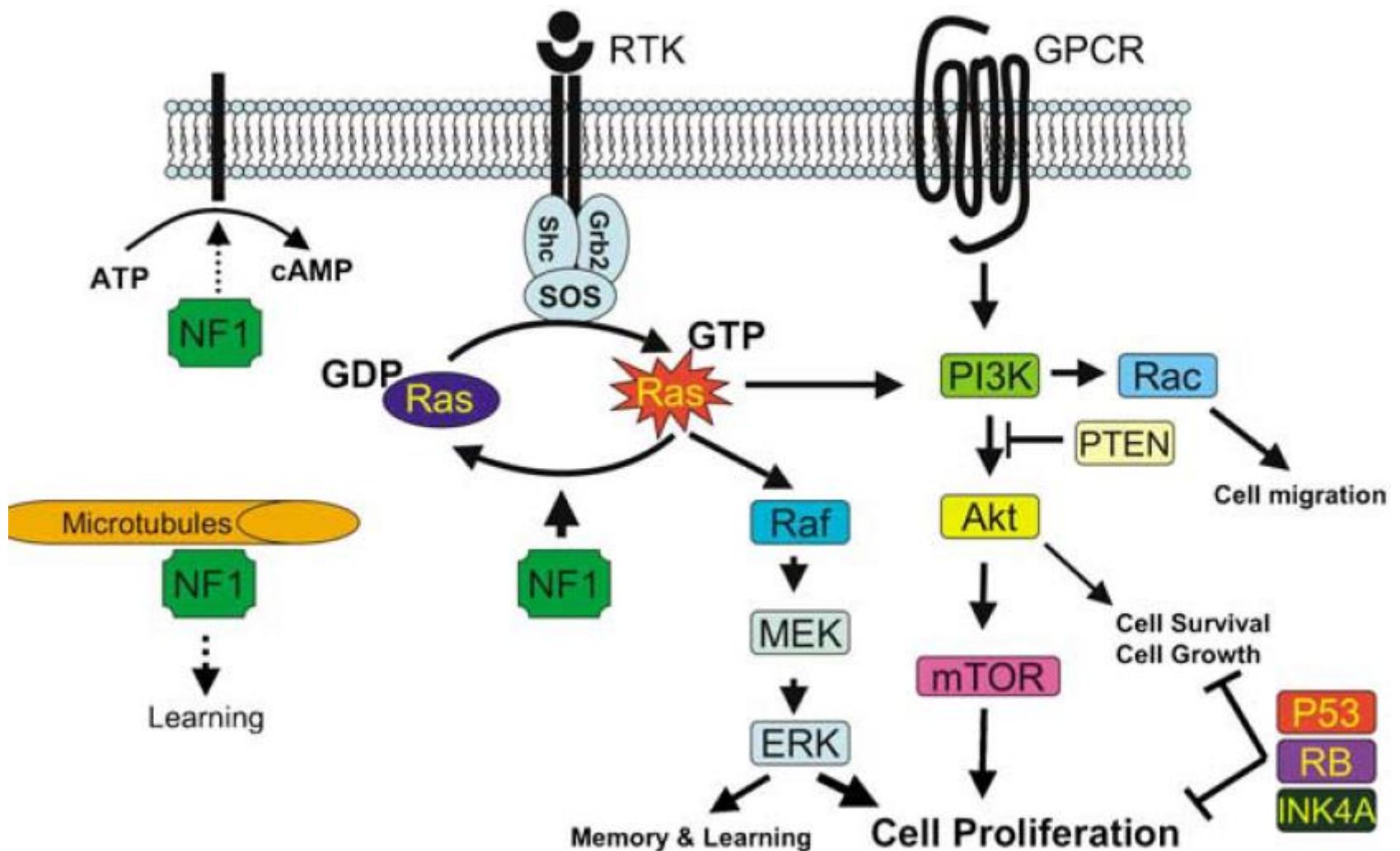
R428: AXL inhibitor

AXL – promising target for cancer therapeutics

c**d**







Cellular processes regulated by AXL activity



NF1 interactions with the Ras and PI3K pathways

- The ability for both Cas9 systems to work in parallel to produce activation and knockout phenotypes in the same cell
- ✓ Suitability of NGS analysis pipeline to accurately quantify phenotypes from combinatorial gene perturbations
- ✓ Conduct highly parallel directional CRISPR screens in human cancer cells
- ✓ Inference of directionality strategy is readily applicable to numerous other dual activation/inhibition expression embodiments
- ✓ High-confidence network of genetic interactions to further understand why some patients respond well to tyrosine kinase inhibitors like imatinib
- ✓ Directional dependencies need to be considered when designing a treatment plan for patients harboring multiple genetic lesions

CRISPR-Cas9 screens in human cells and primary neurons identify modifiers of *C9ORF72* dipeptide-repeat-protein toxicity

Nicholas J. Kramer ^{1,2,6}, Michael S. Haney ^{1,6}, David W. Morgens¹, Ana Jovičić^{1,5}, Julien Couthouis ¹, Amy Li¹, James Ousey ¹, Rosanna Ma ¹, Gregor Bieri ^{1,2}, C. Kimberly Tsui¹, Yingxiao Shi³, Nicholas T. Hertz⁴, Marc Tessier-Lavigne⁴, Justin K. Ichida³, Michael C. Bassik^{1*} and Aaron D. Gitler ^{1*}

¹Department of Genetics, Stanford University School of Medicine, Stanford, CA, USA. ²Neurosciences Graduate Program, Stanford University School of Medicine, Stanford, CA, USA. ³Department of Stem Cell Biology and Regenerative Medicine, Eli and Edythe Broad Center for Regenerative Medicine and Stem Cell Research, University of Southern California, Los Angeles, CA, USA. ⁴Department of Biology, Stanford University, Stanford, CA, USA.

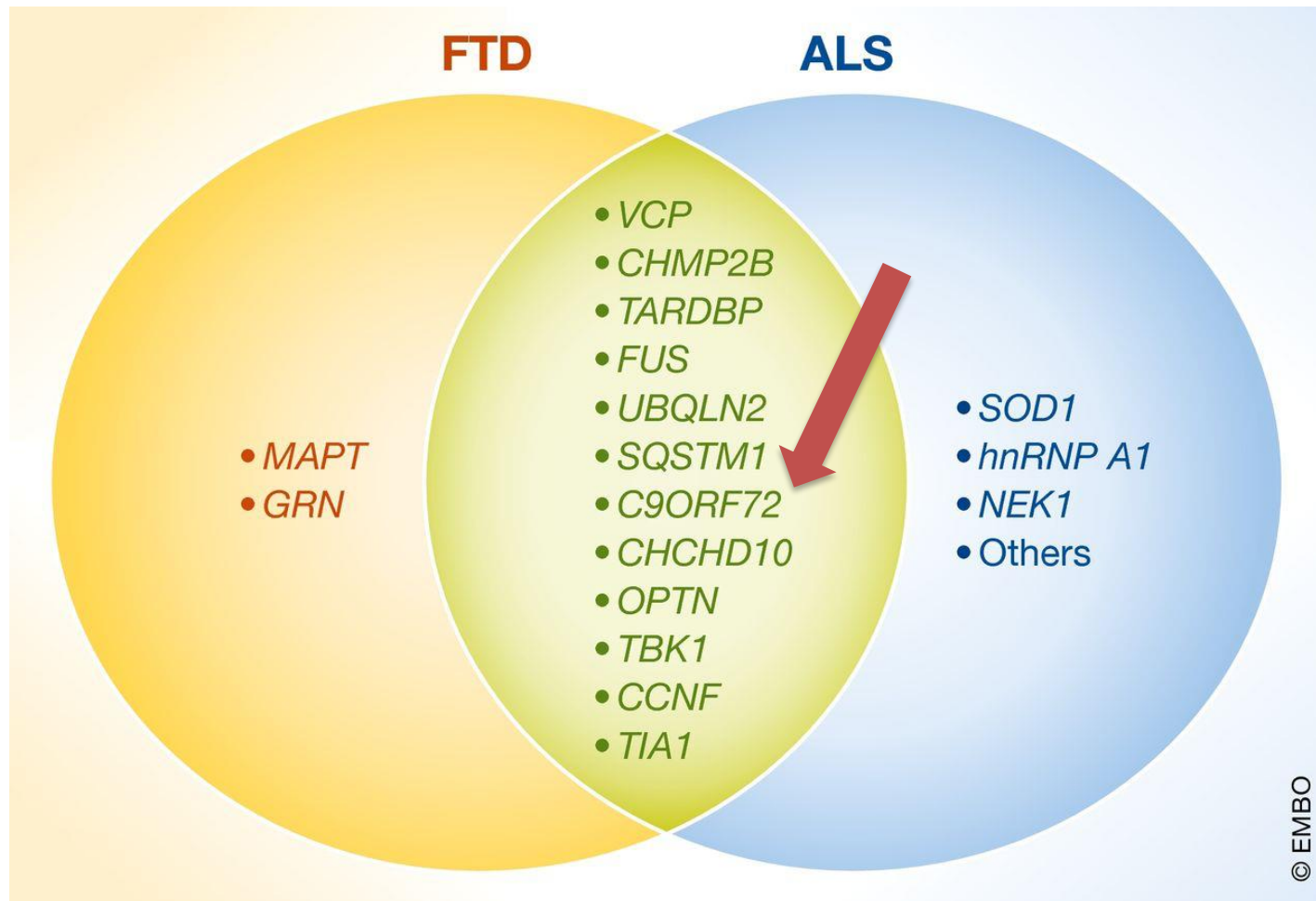
⁵Present address: Department of Molecular Biology, Genentech, South San Francisco, CA, USA. ⁶These authors contributed equally: Nicholas J. Kramer and Michael S. Haney. *e-mail: bassik@stanford.edu; agitler@stanford.edu

Study Rationale

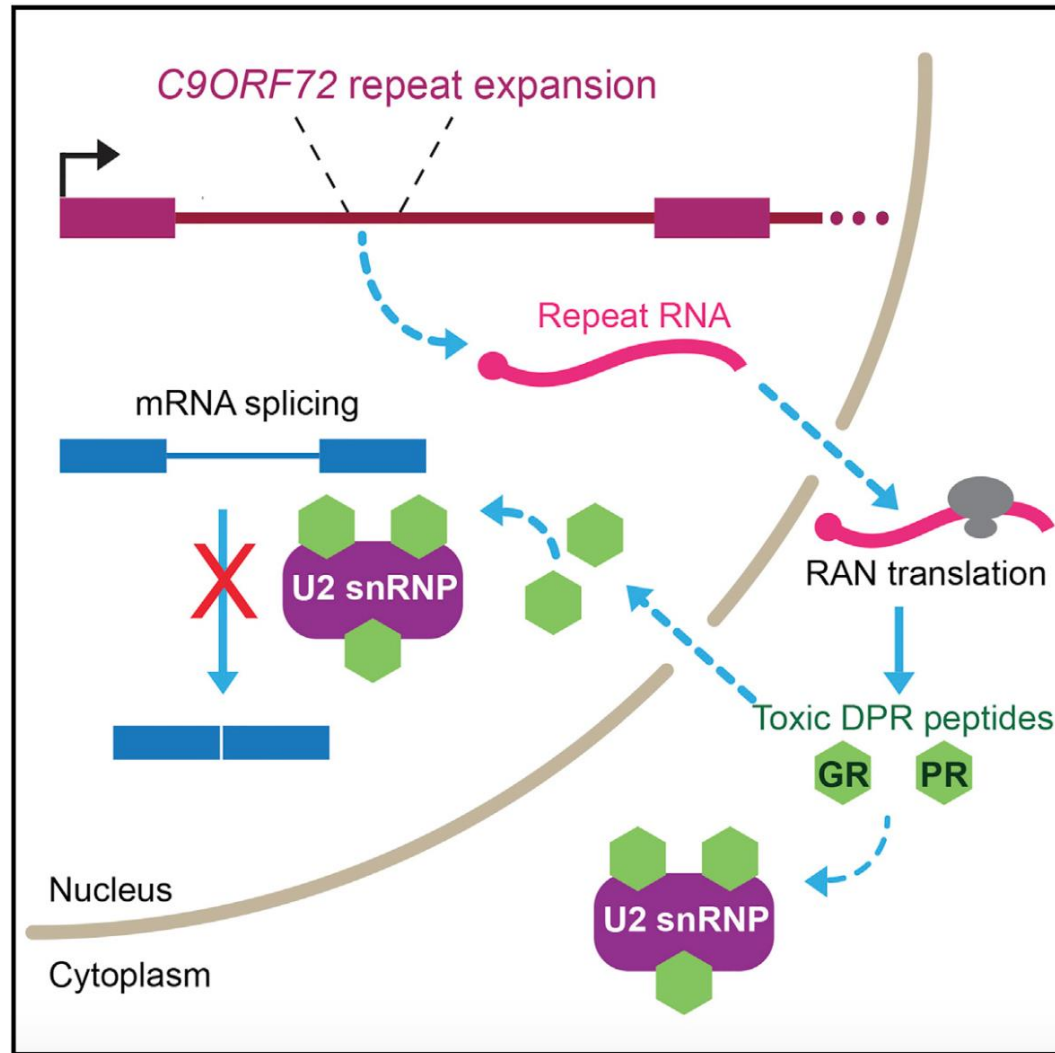
→ CRISPR–Cas9 system to perform comprehensive genome-wide KO screens in human cells and targeted screens in mouse primary neurons to identify genetic modifiers of *C9ORF72* DPR toxicity.



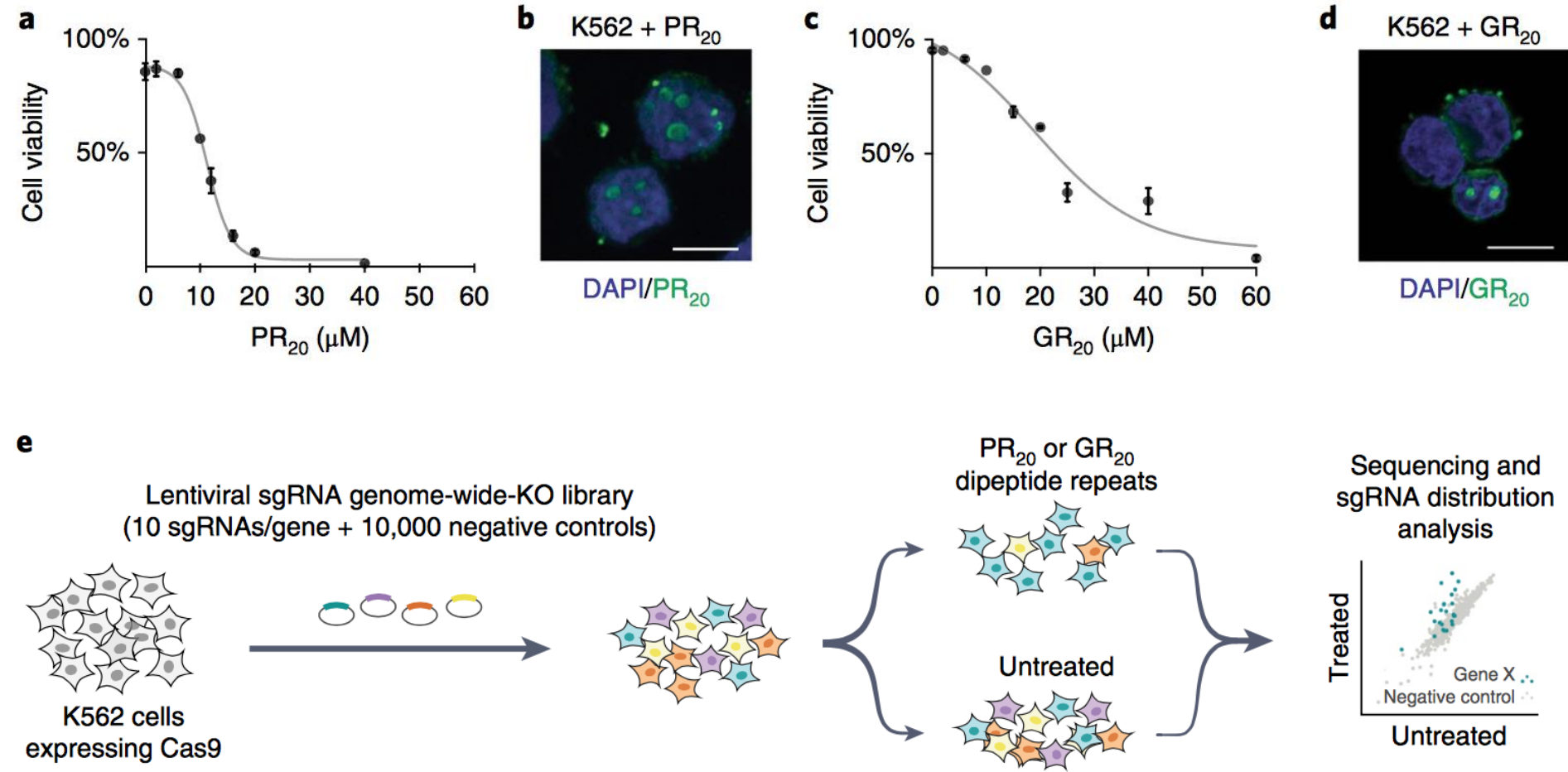
- ✓ Orthogonal screening approach can quantify loss- and gain-of-function phenotypes from the same cell
- ✓ To systematically identify genetic interactions between cancer-relevant genes



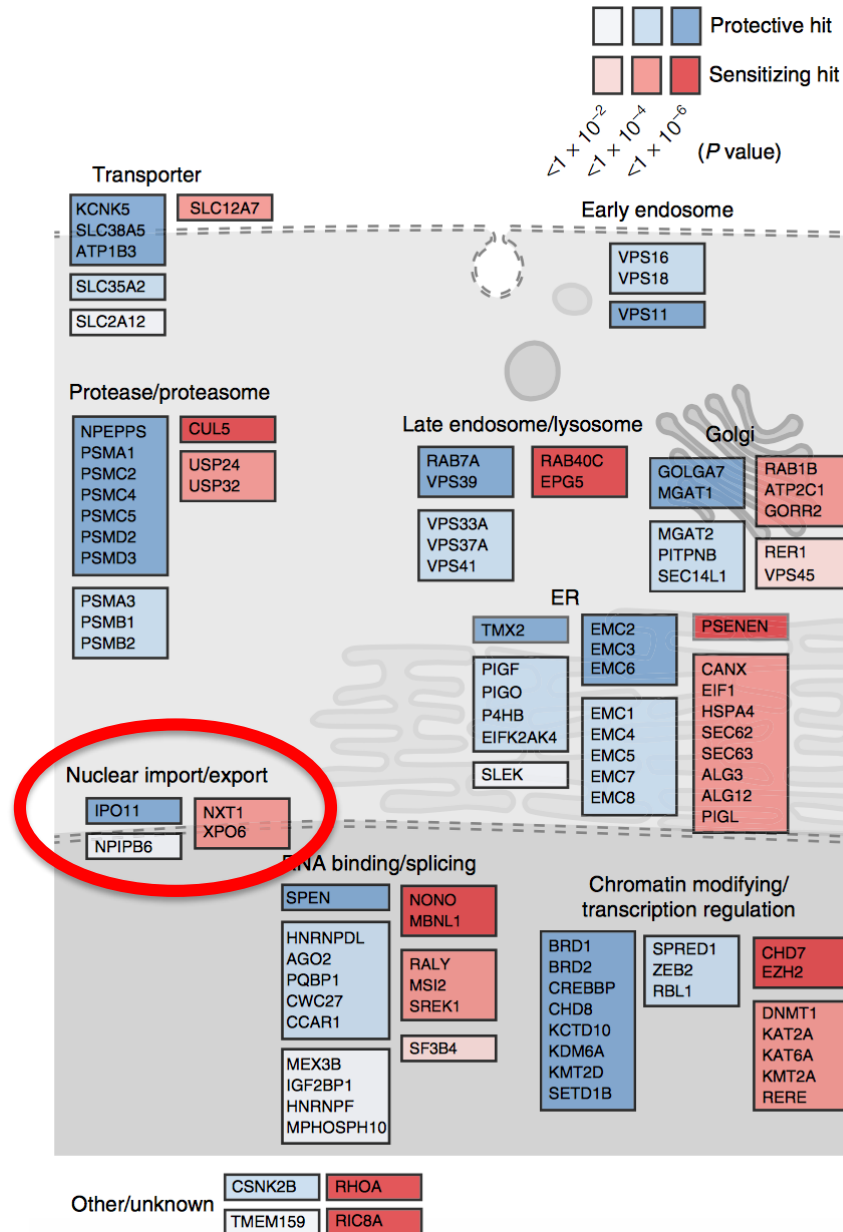
ALS and FTD are related and represent two ends of a spectrum disorder as supported by a large body of recent pathological and genetic evidence

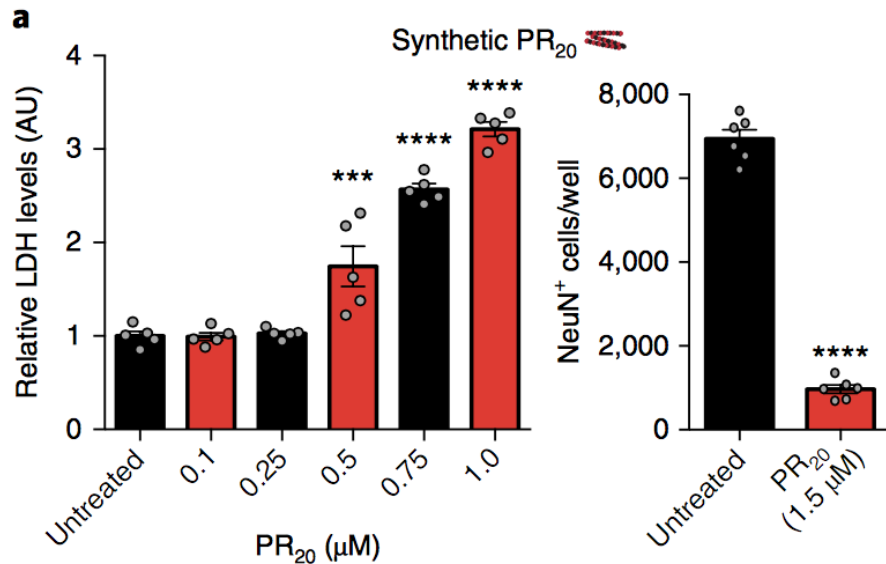


Hexanucleotide repeat expansion in C9ORF72 gene results in production of DPR proteins that may disrupt pre-mRNA splicing in ALS and FTD patients

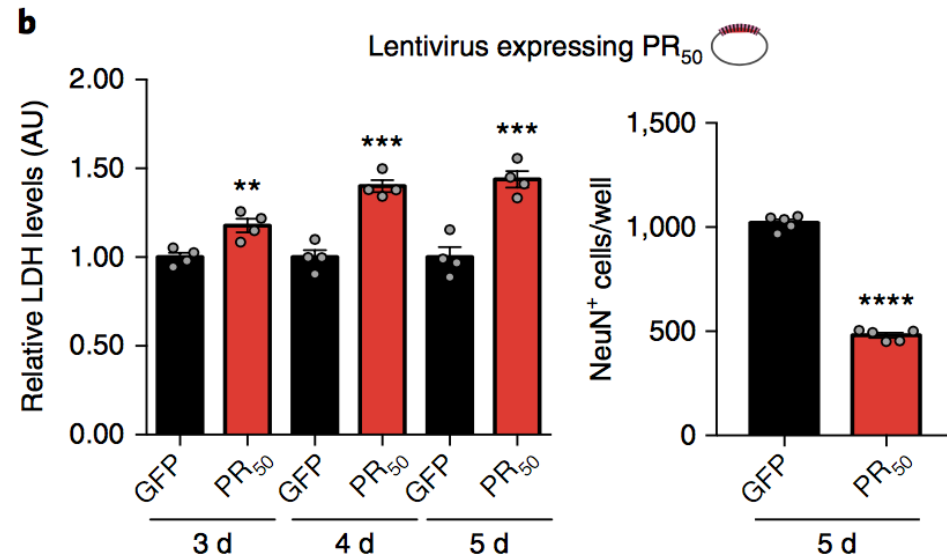


Schematic of proteins encoded by selected hits from both PR20 and GR20 screens



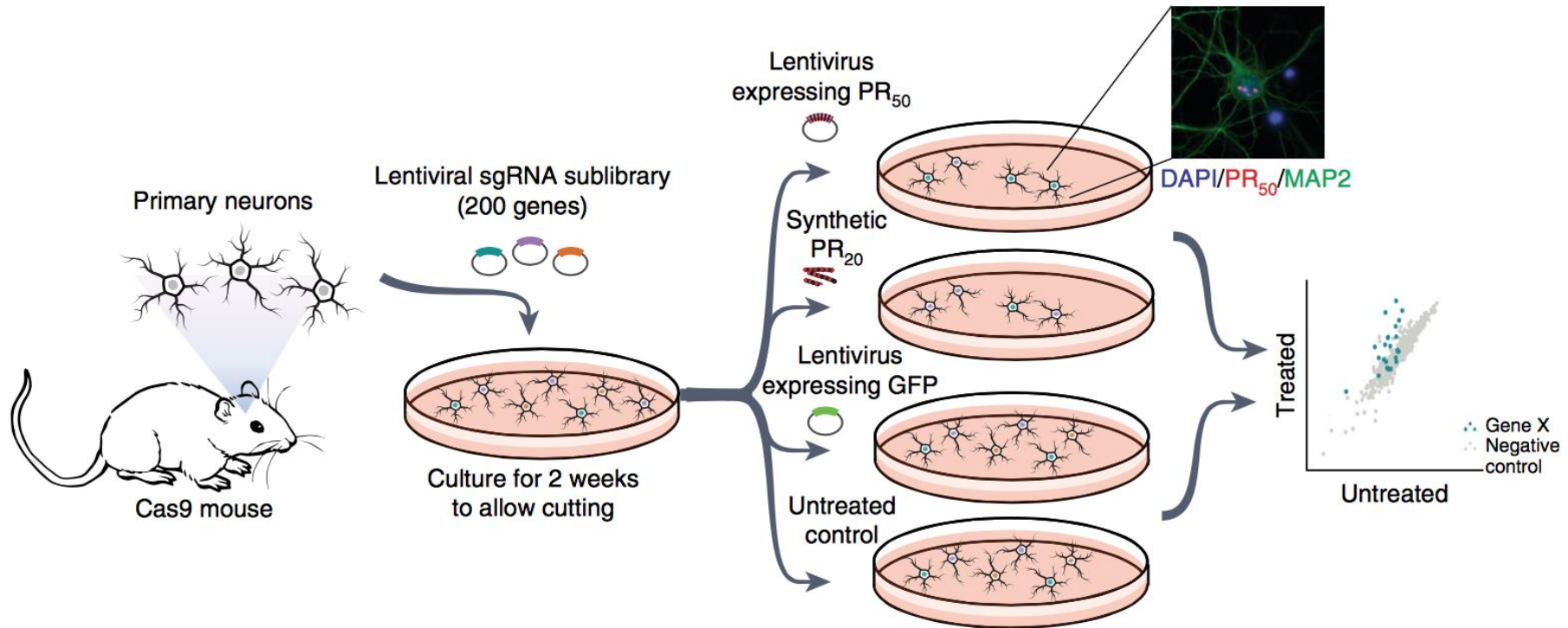


Dose-dependent cytotoxicity



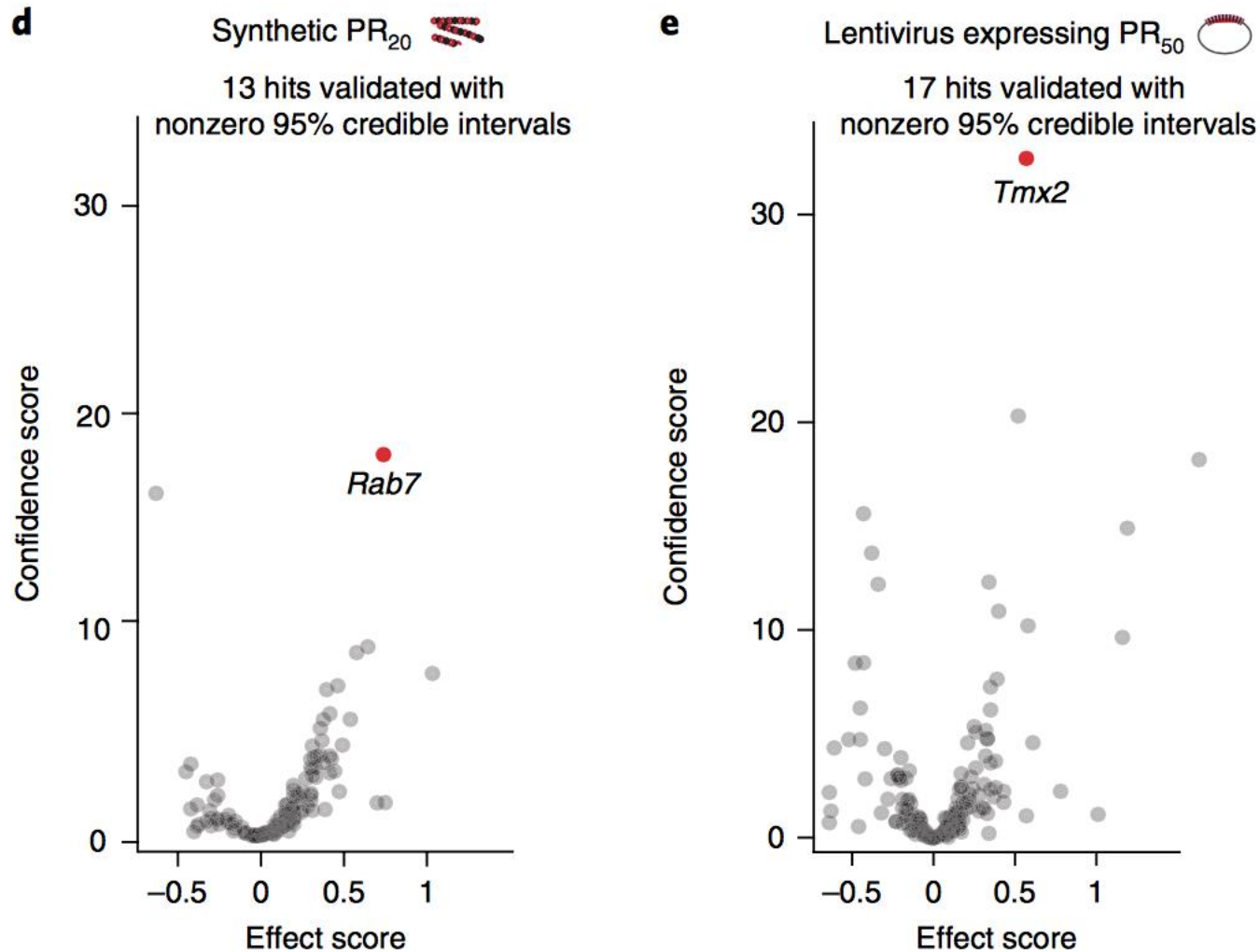
Time-dependent cytotoxicity

c



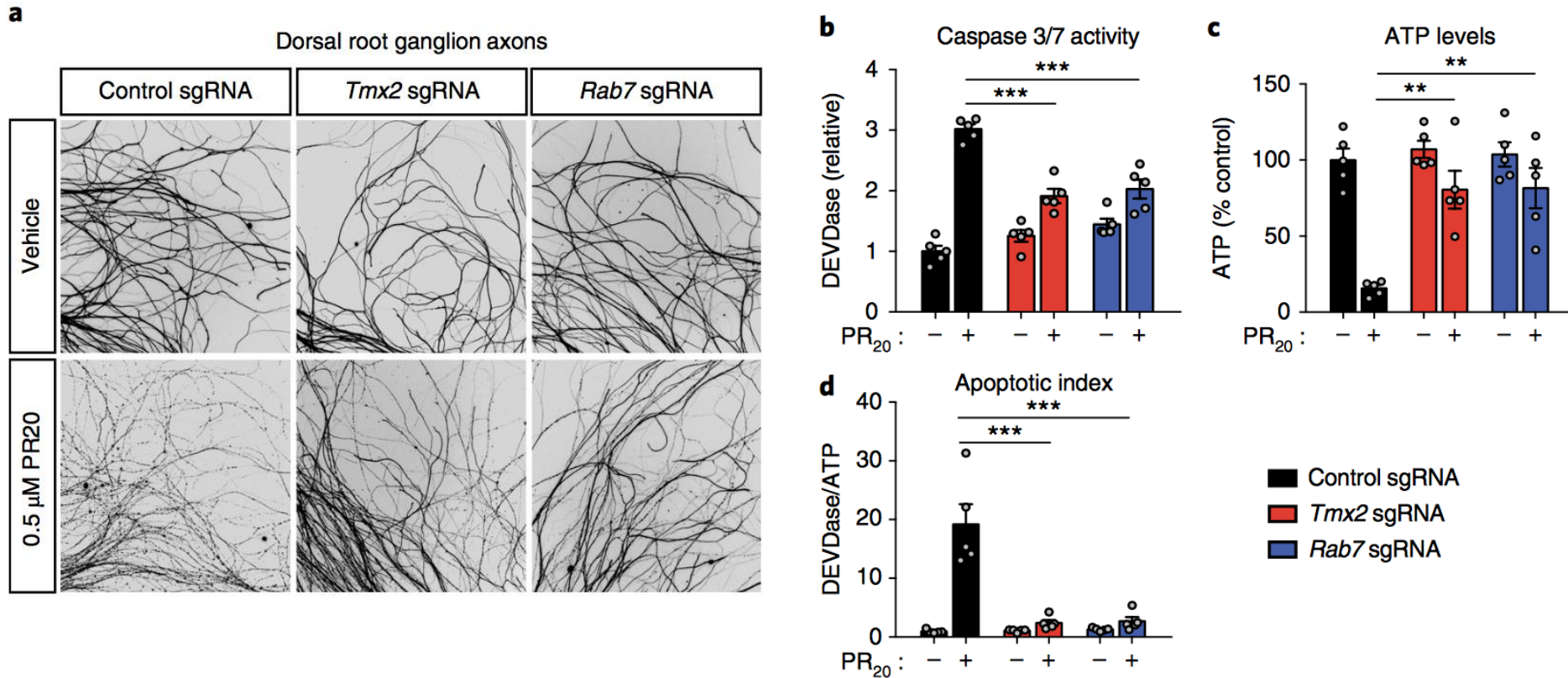
The abundance of sgRNAs in surviving cells – measured by sgRNA deep sequencing

PR₅₀ localized to the nuclei in cultured neurons



Effect score: gene-level summary of how protective or sensitizing the KO is

Confidence score: log-likelihood ratio describing the significance of the effect



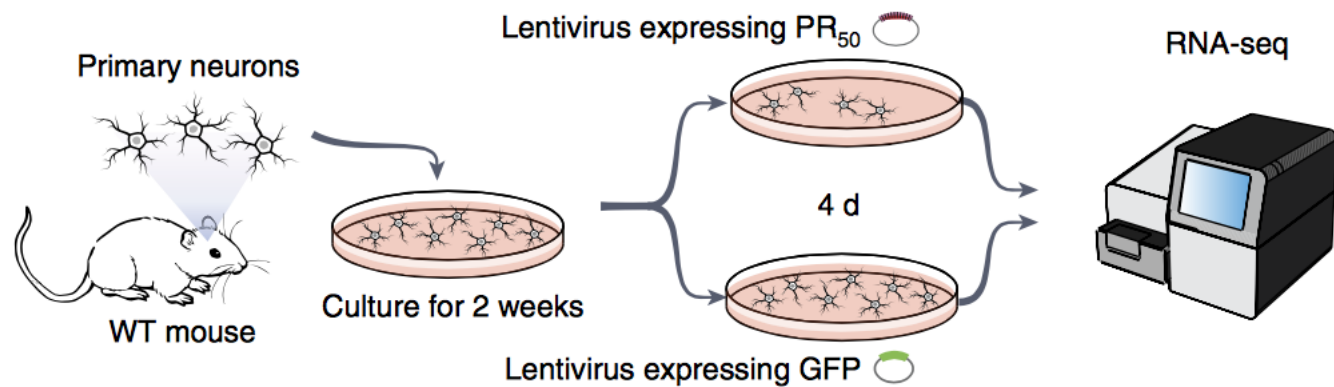
The strongest genetic modifiers: genes encoding proteins localized to the **nucleus and ER**

- Top protective KO: ER-resident transmembrane thioredoxin protein **Tmx2**
- Top hit modifier of synthetic PR20-induced toxicity: the endolysosomal trafficking gene **RAB7**

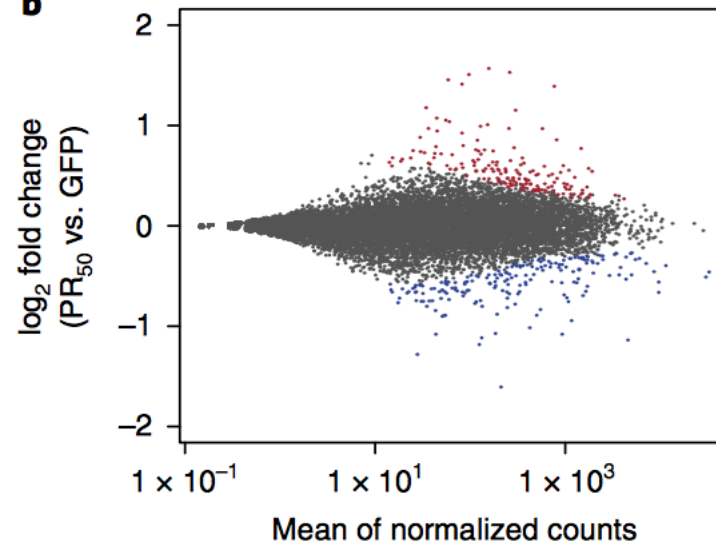
KO of either *Rab7* or *Tmx2* protected against PR toxicity in primary neurons

Hypothesis: DPR accumulation might induce an ER-stress response

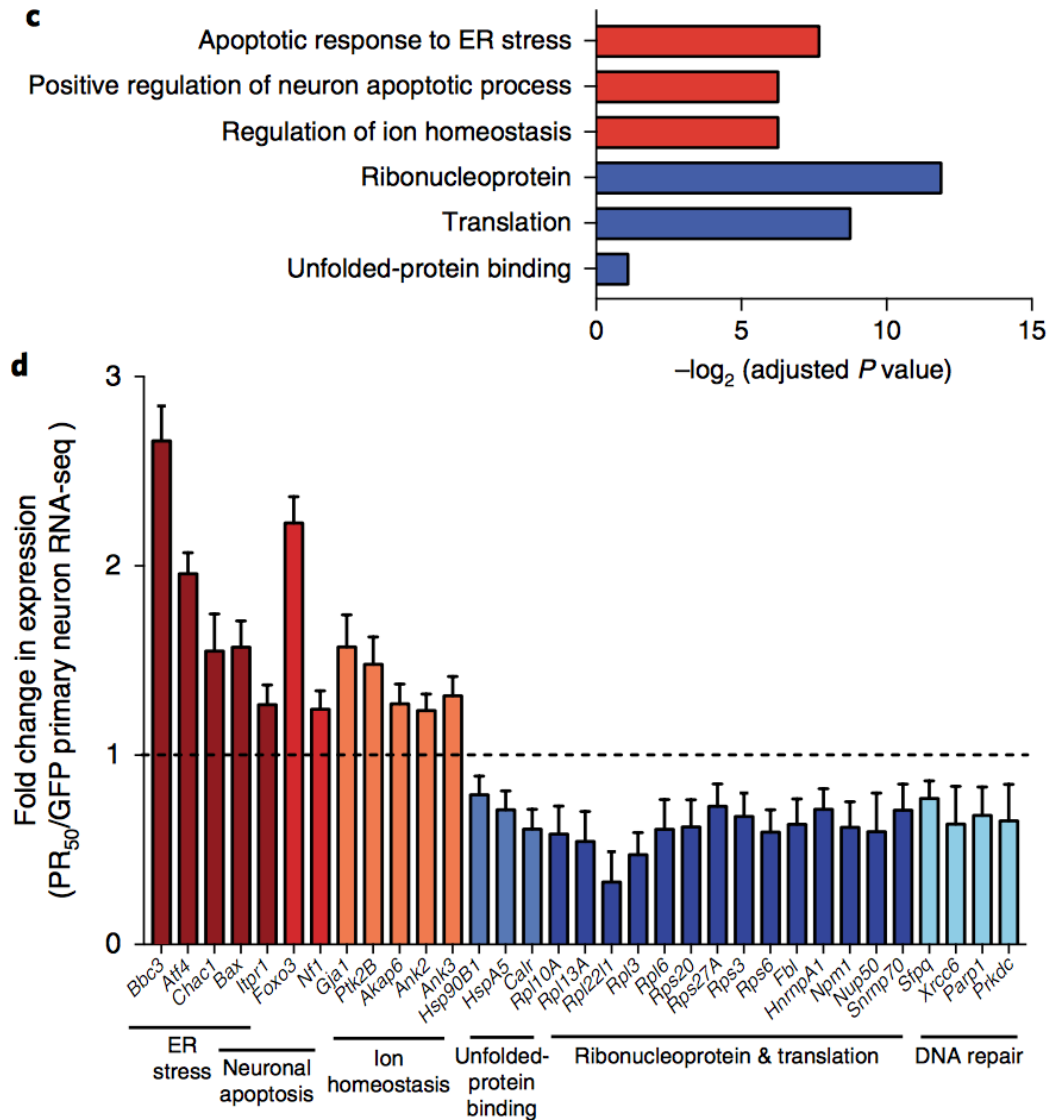
a



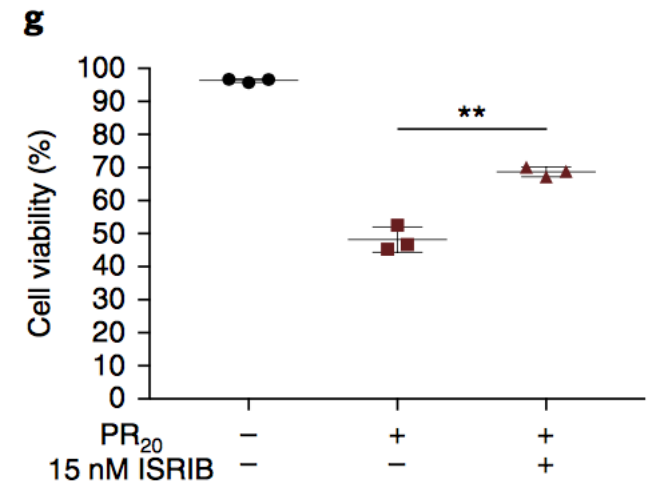
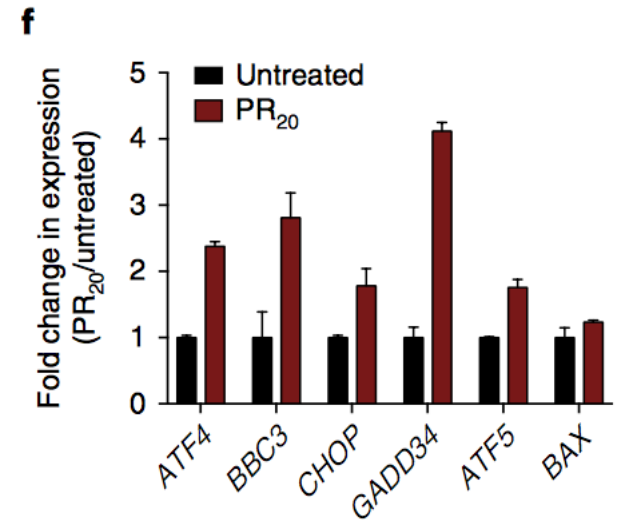
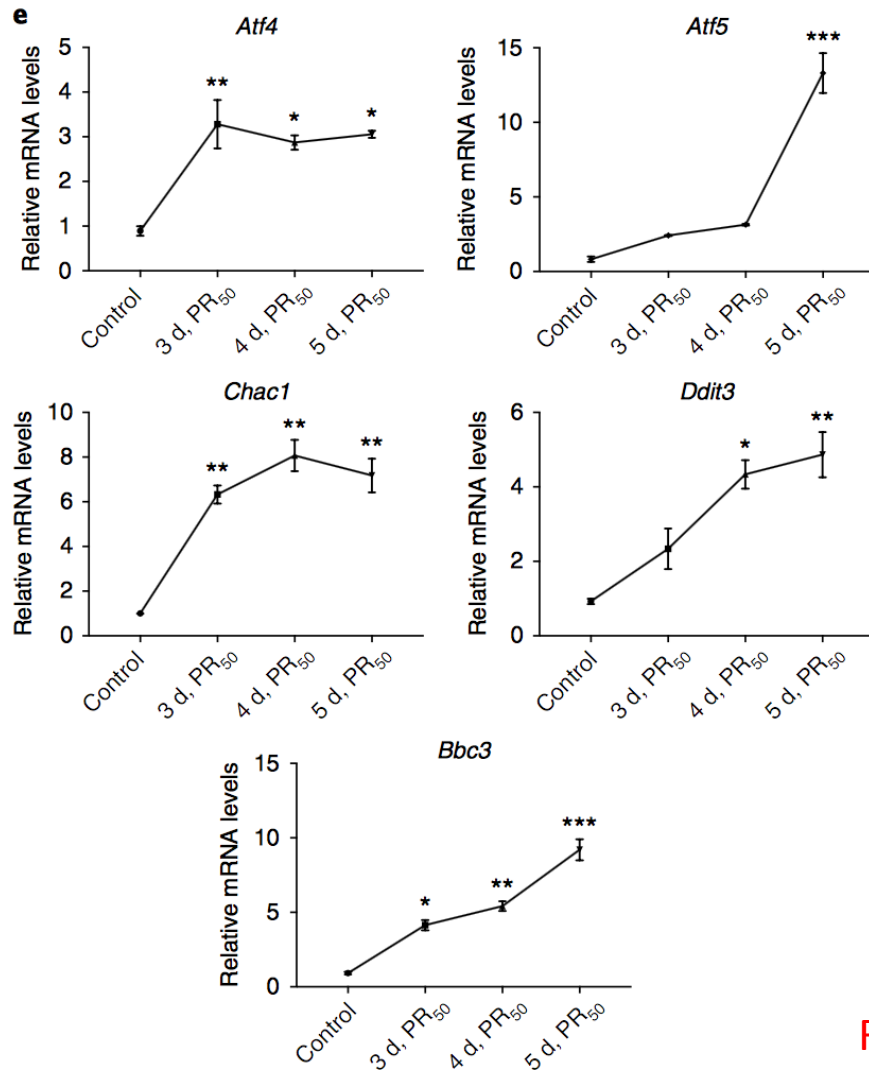
b



Red: upregulated genes (126)
Blue: downregulated genes (133)



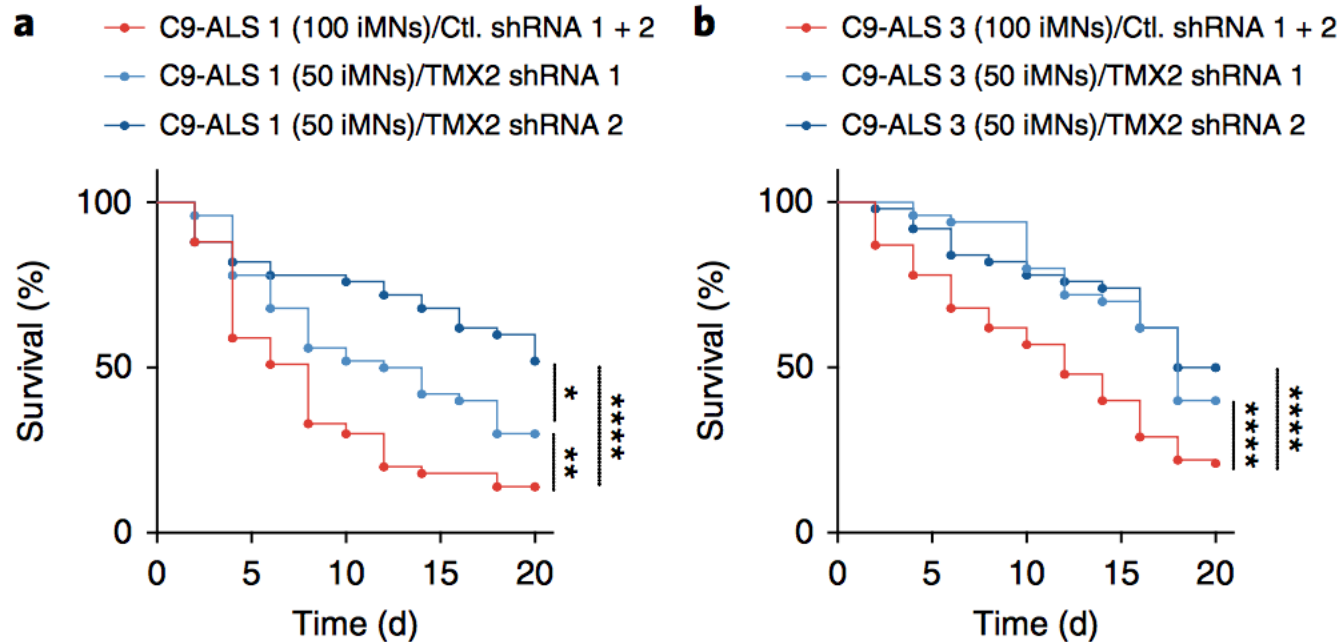
Time-dependent induction of ER-stress-related genes



ISRIB: inhibitor of the cellular response to ER stress

Role of ER stress in DPR-mediated toxicity

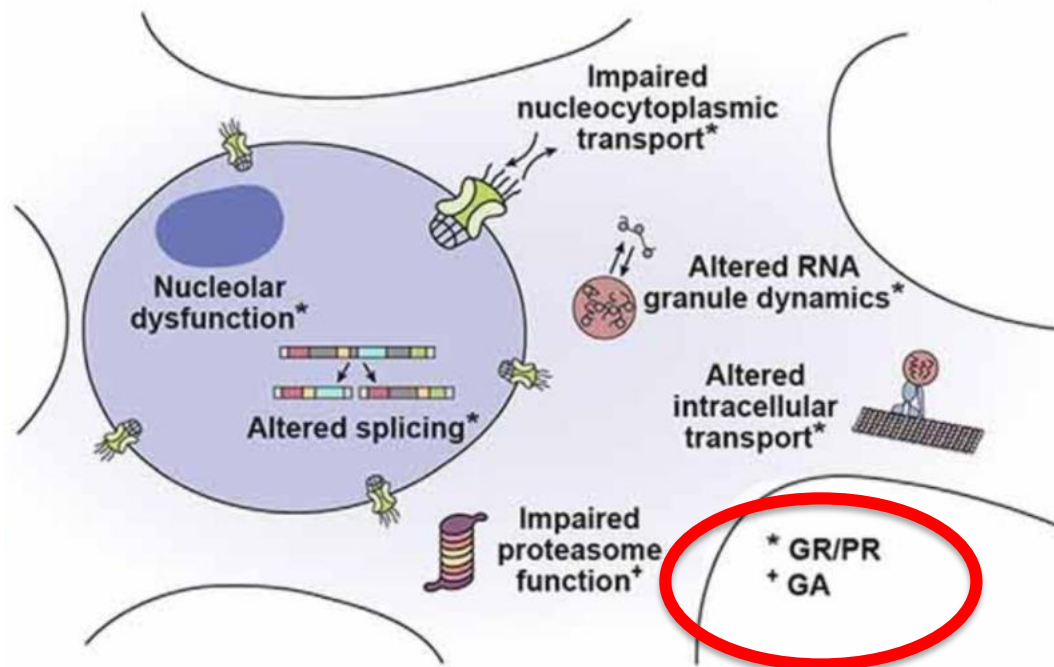
Decreased TMX2 improves survival of hiMNs



- Induced motor neurons (iMNs) from iPSCs from ALS patients
- 2 independent shRNAs targeting *TMX2* – increased proportion of surviving iMNs

TMX2 as potential therapeutic target

- Comprehensive CRISPR–Cas9 KO screens in human cells with further validation screens in primary neurons to discover modifiers of *C9ORF72* DPR toxicity
- ✓ Identified nucleocytoplasmic-transport machinery and new genes that suggest that ER function and ER stress are important in FTD/ALS pathogenesis
- ✓ Decreased *TMX2* expression conferred protection from PR toxicity also in primary rodent neurons
- ✓ *TMX2* may serve as future therapeutic target



DPRs may contribute to motor neuron toxicity in part by **increasing ER stress** and by **disrupting nucleocytoplasmic transport**

