Minimal Libraries and Synthetic Augmentation of CRISPR-Cas9 Screens for Drug Target Discovery

CRISPR Genome Engineering for Cellular Modelling and Screening

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'Undruggable' cancer targets...

~3,000 gene-products are part of the "druggable genome"

~20,000 human protein-coding genes

Drugging the 'undruggable' cancer targets

Chi V. Dang ☑, E. Premkumar Reddy ☑, Kevan M. Shokat ☑ & Laura Soucek ☑

Nature Reviews Cancer 17, 502-508 (2017) | Cite this article

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Abstract

The term 'undruggable' was coined to describe proteins that could not be targeted pharmacologically. However, progress is being made to 'drug' many of these targets, and therefore more appropriate terms might be 'difficult to drug' or 'yet to be drugged'. Many desirable targets in cancer fall into this category, including the RAS and MYC oncogenes, and pharmacologically targeting these intractable proteins is now a key challenge in cancer research that requires innovation and the development of new technologies. In this Viewpoint article, we asked four scientists working in this field for their opinions on the most crucial advances, as well as the challenges and what the future holds for this important area of research.

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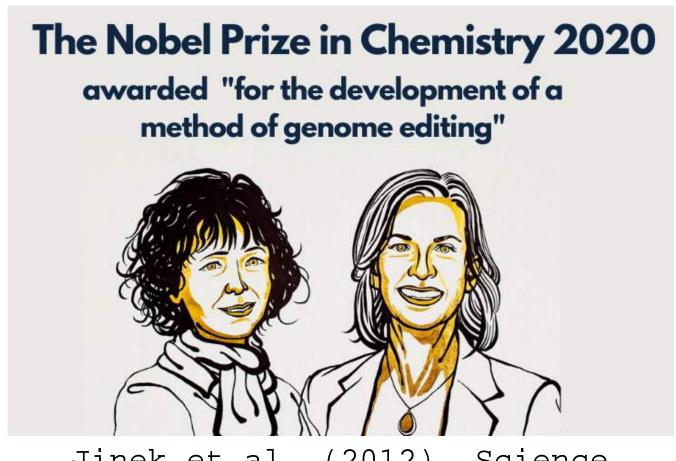
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Abstract

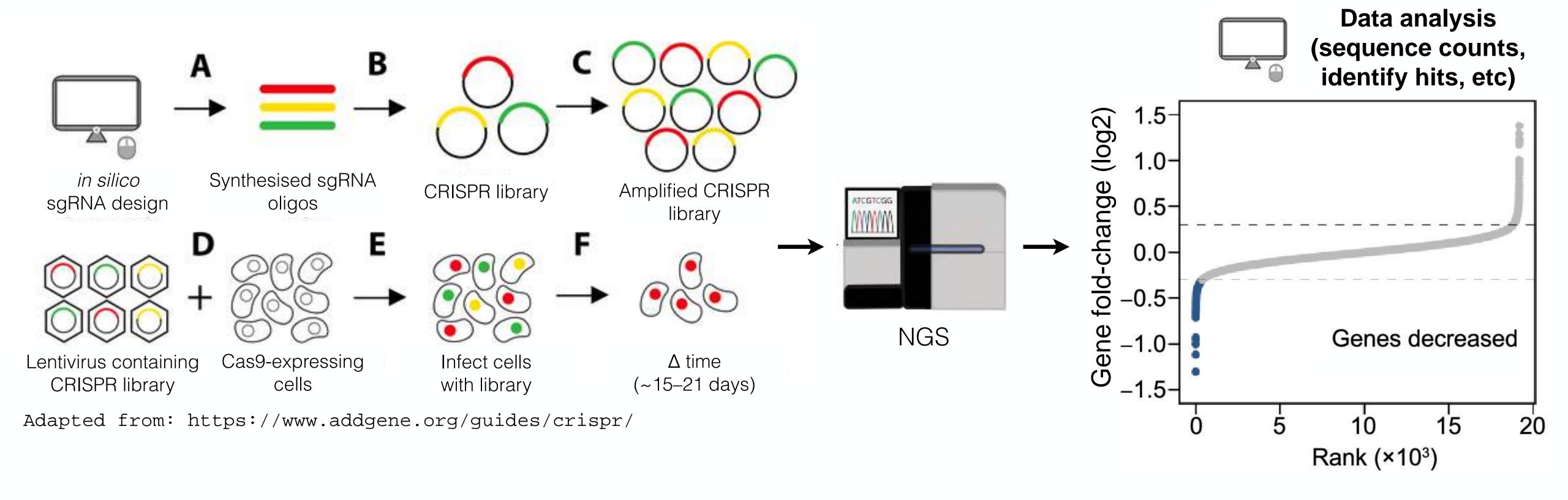
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Functional genomic screens

- Zinc finger nucleases (ZFNs)
- Transcription activator-like effector nucleases (TALEN)
- RNA interference using small interfering RNAs (siRNAs) or short hairpin RNAs (shRNAs)
- Clustered Regularly Interspaced Short Palindromic Repeats and associated endonuclease (CRISPR-Cas9)



CRISPR-Cas9 screen general pipeline



Key steps in CRISPR-Cas9 screening (gRNA design and data analysis) involves computational analyses

Using sequencing, you count the number of sgRNAs at the start and at the end. sgRNA whose cut lead to cell death are lost

Pre-clinical Discovery of Cancer Synthetic Lethal Interactions using CRISPR-Cas9 screens

y = f(x) Effect size; P-value; FDR; ...

Finding genetic biomarkers of essential genes in cancer

Continuous

(log2 fold-change)

Gene Essentiality Genetic Alterations (CRISPR-Cas9) (e.g. mutations) y = f(x) Effect size; P-value; FDR; ... Cancer cell line Cancer cell line y = f(x) Effect size; P-value; FDR; ... Cancer cell line 2 Cancer cell line = f(x) Effect size; P-value; FDR; ... f(X) Cancer cell line 3 y = f(x) Effect size; P-value; FDR; ... y = f(x) Effect size; P-value; FDR; ... Cancer cell line 4

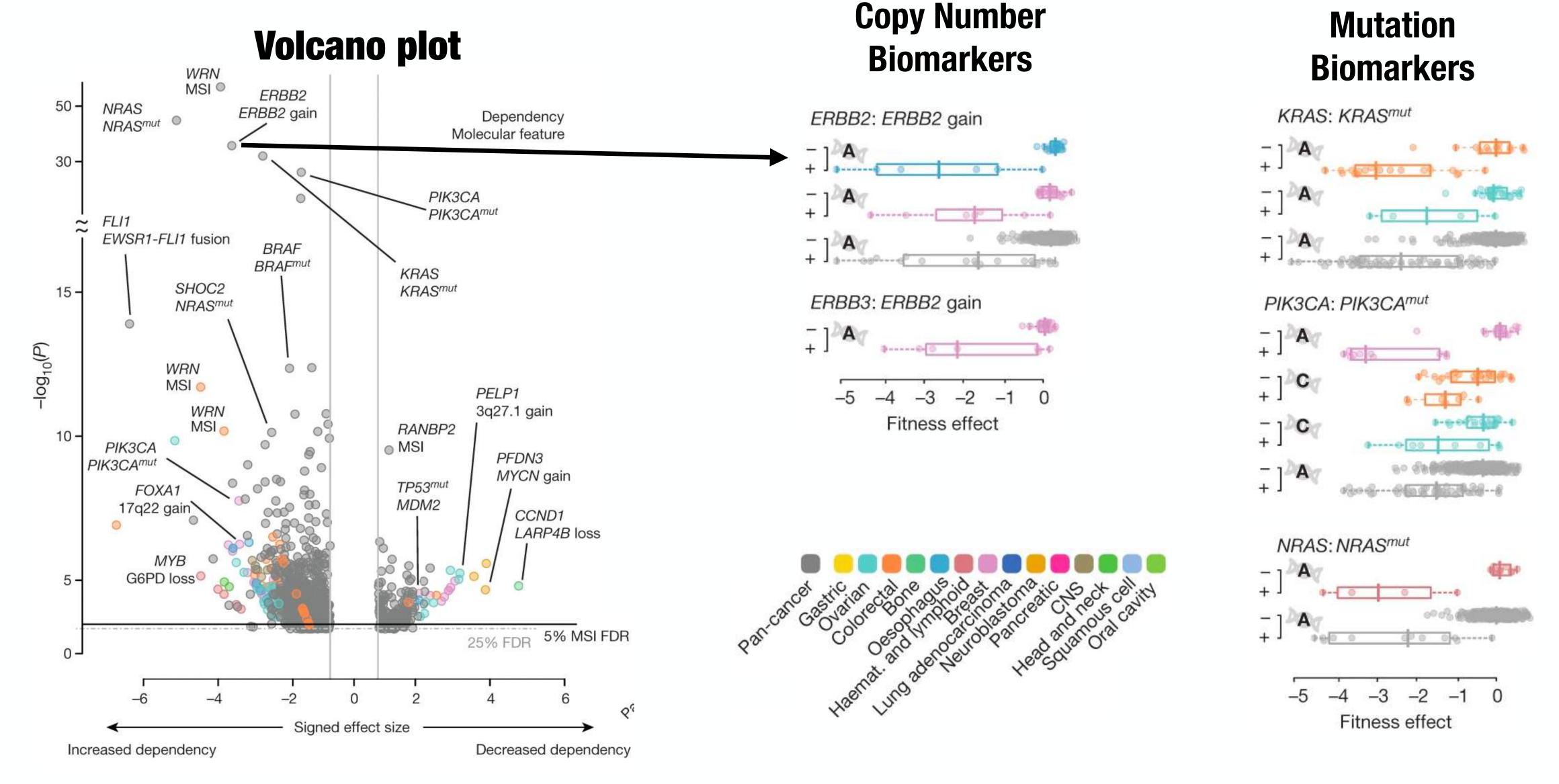
Systematic association between CRISPR-Cas9 gene essentiality and genetic alterations, e.g. such as mutations and copy-number alterations

Binary

(1=present; 0=absent)

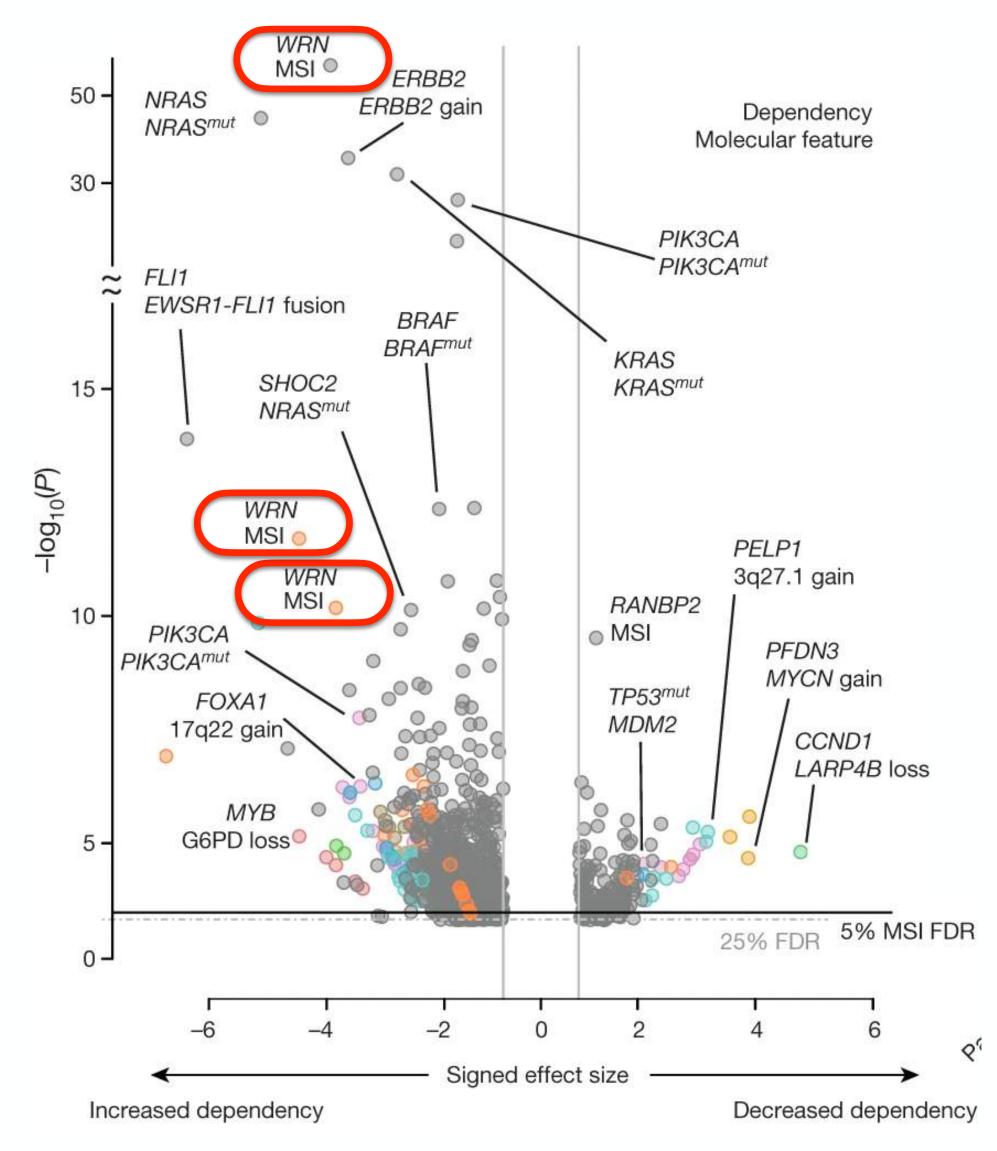
Behan et al. (2019) Nature 6

One-way ANOVAs for systematic identification of cancer biomarkers



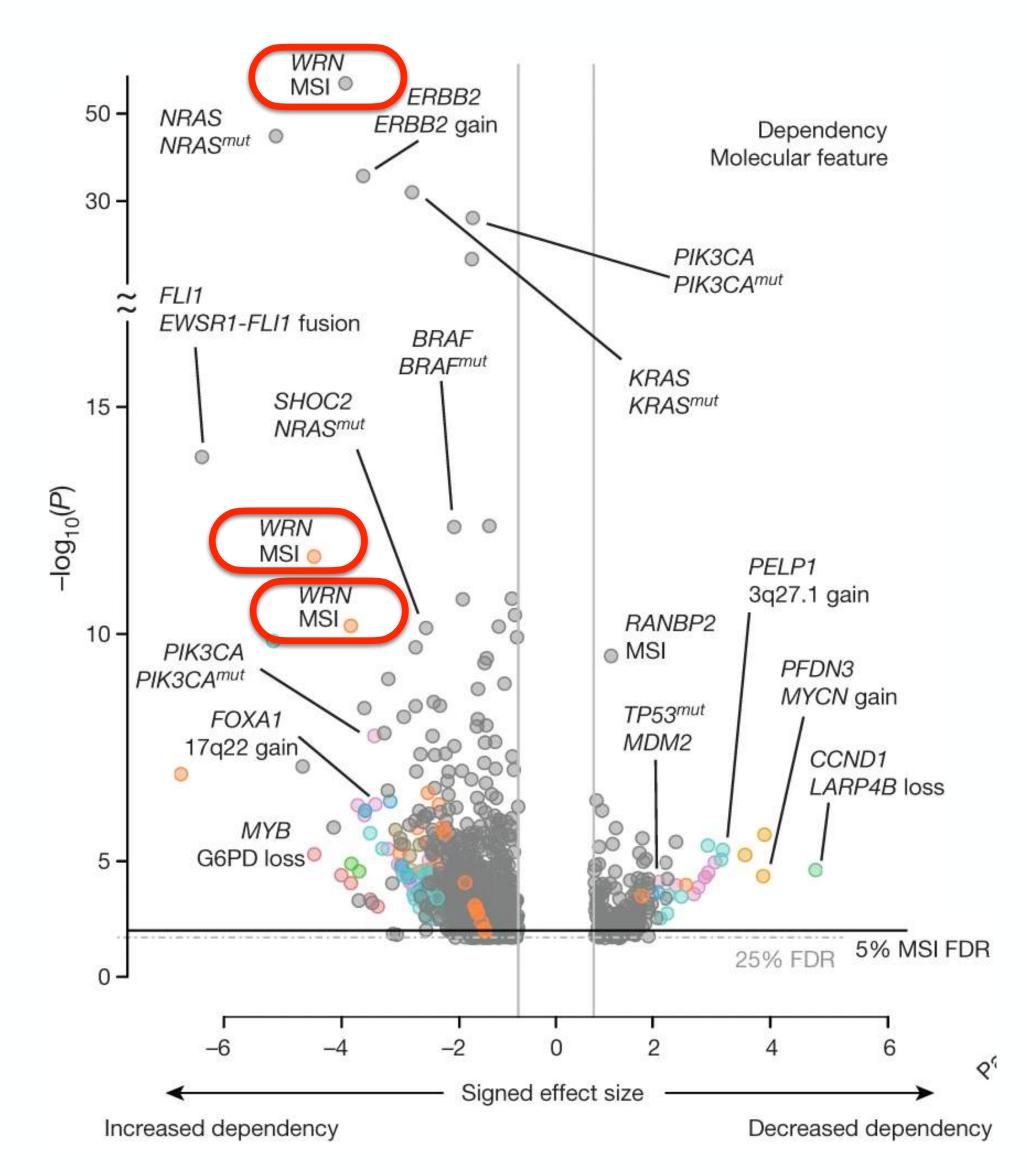
Behan et al. (2019) Nature

Synthetic lethal interaction between WRN and microsatellite instability



Behan et al. (2019) Nature 8

Werner Helicase and Werner syndrome



Several cancers with microsatellite instability (MSI) are sensitive Werner Syndrome RecQ Like Helicase (WRN) knockout

WRN is involved in DNA repair and maintenance

Werner Syndrome - premature ageing and increased risk of developing cancer

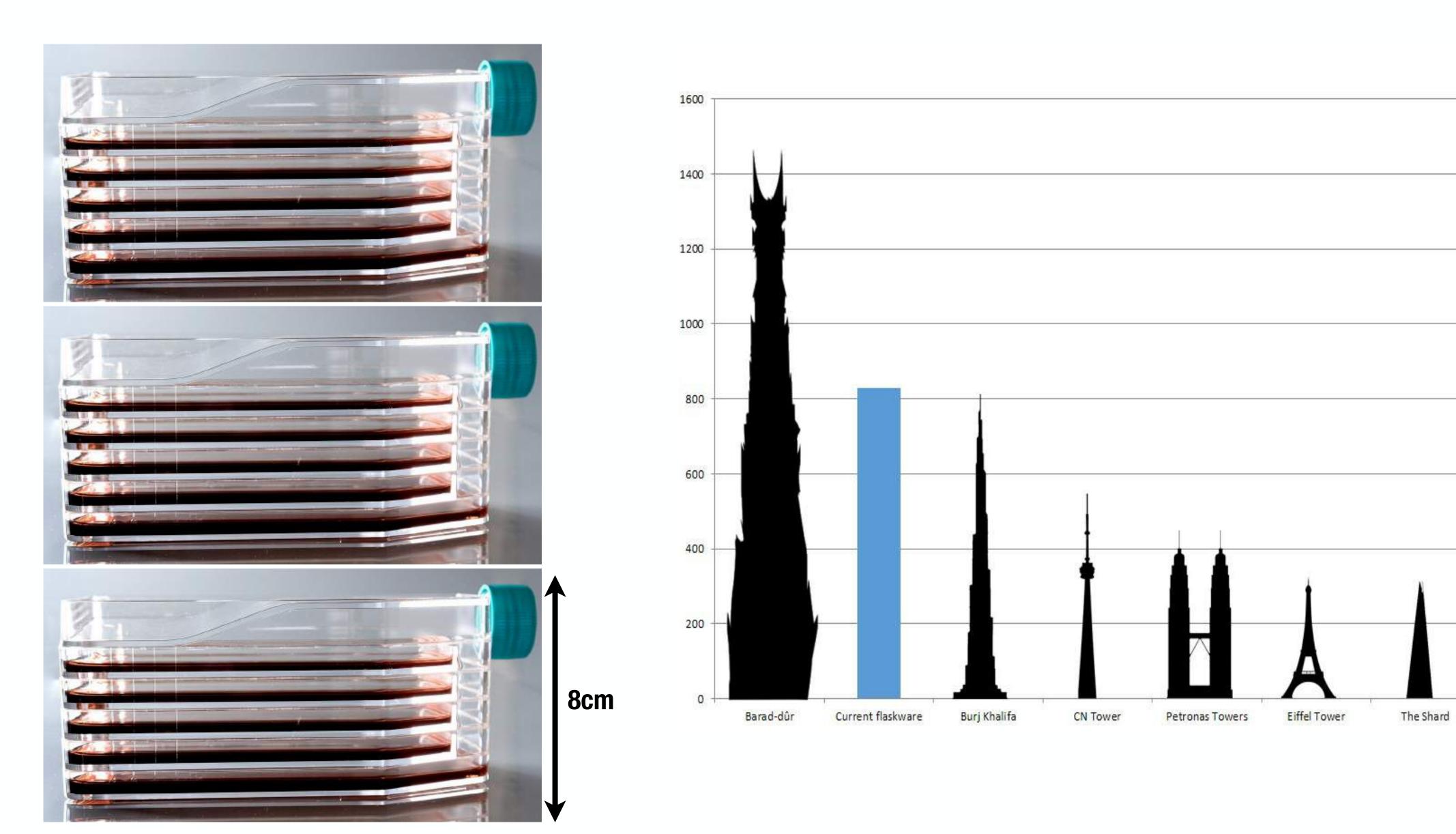


Werner Helicase and Werner syndrome

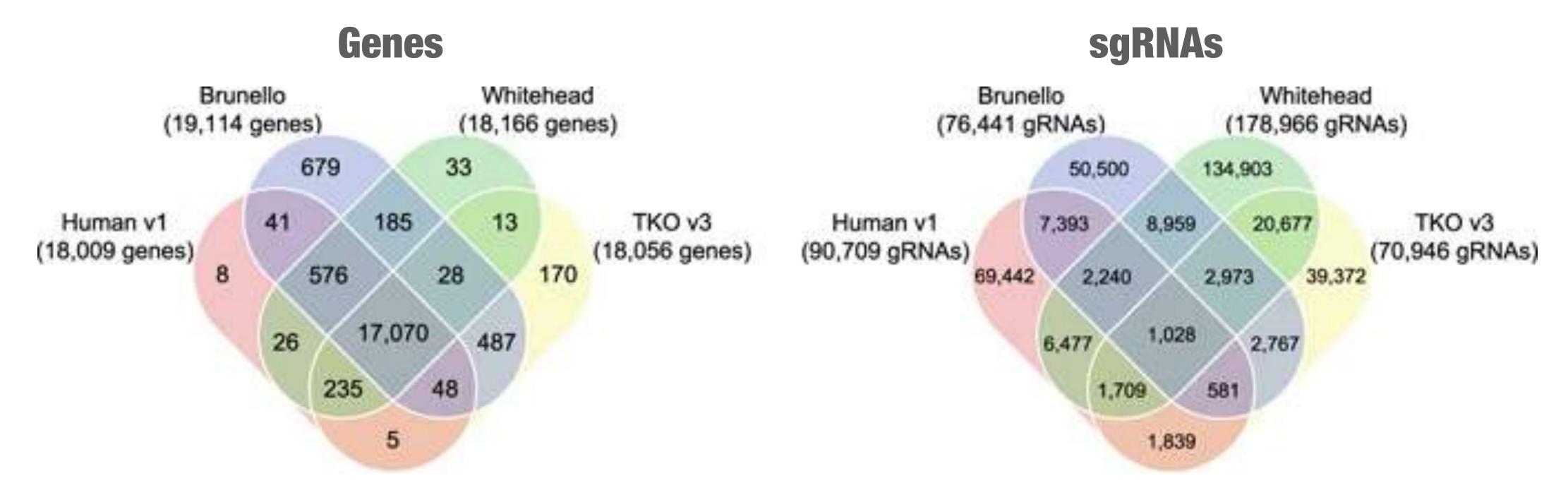
Why wasn't this found with drug screens and only with functional genetic screens (CRISPR-Cas9)? Syndrome RecQ Like No effective drug is available for WRN inhibition VRN is involved in DNA repair and maintenance **IDEAYA** Announces MSI o Presentations at AACR Annual emature ageing and Meeting 2023 for Potential oping cancer First-in-Class Synthetic Lethality Programs IDE397 (MAT2A), IDE161 (PARG) and Werner Helicase f () in (a) (3) (7) IDEAYA Biosciences, Inc. → 14 Mar, 2023, 16:31 ET Signed effect size 56

Minimal genome-wide CRISPR-Cas9 screens

Gargantuan effort of CRISPR-Cas9 screening at scale



Multiple in silico CRISPR-Cas9 sgRNA library design



Ong SH, Li Y, Koike-Yusa H, Yusa K (2017) Optimised metrics for CRISPR-KO screens with second-generation gRNA libraries. Sci Rep 7: 7384

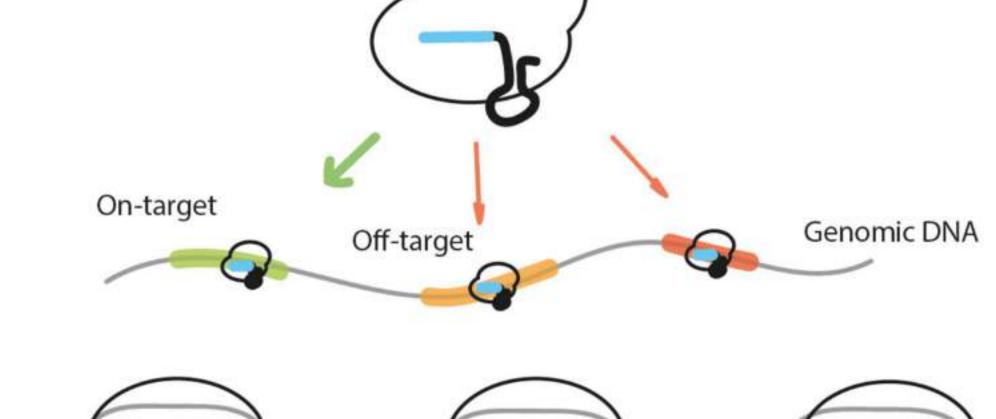
Although the number of genes targeted are largely the same the sgRNA used to target them is largely different across commonly used libraries

The field has converged, although this is still an active area of research, particularly to reduce the size of the sgRNA libraries.

Off-targets and on-target efficacy of sgRNAs

On-Target Efficiency

Precision and effectiveness of a sgRNA to direct the gene-editing enzyme to modify only the intended genomic location. High on-target efficiency ensures desired and accurate genetic alterations.



Cas9:sgRNA

Off-Targets

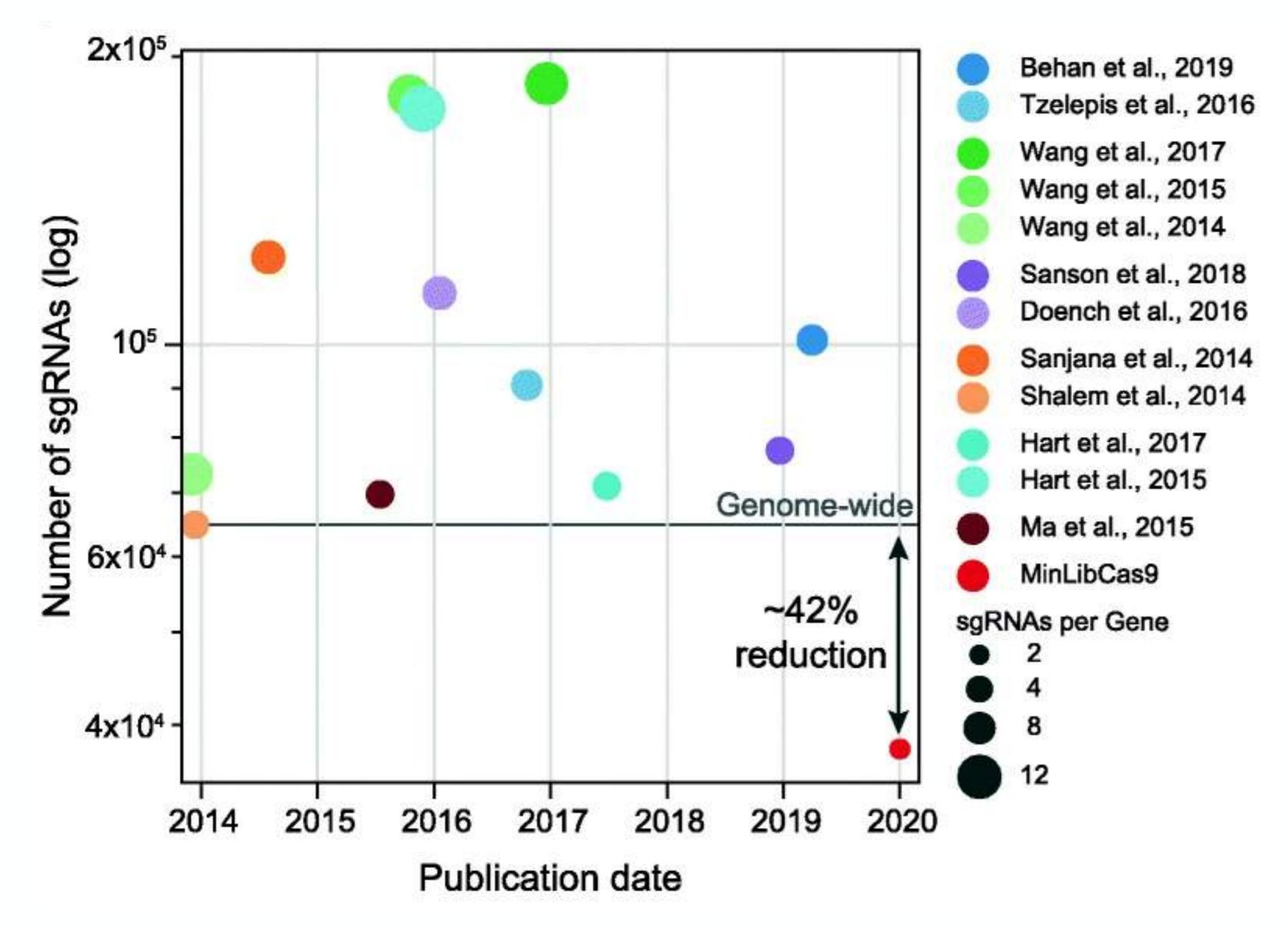
sgRNAs can bind to and cleave unintended genomic sites, potentially causing unwanted mutations and genomic instability.



Solution, <u>multiple sgRNAs per target gene</u> increases the robustness of CRISPR libraries

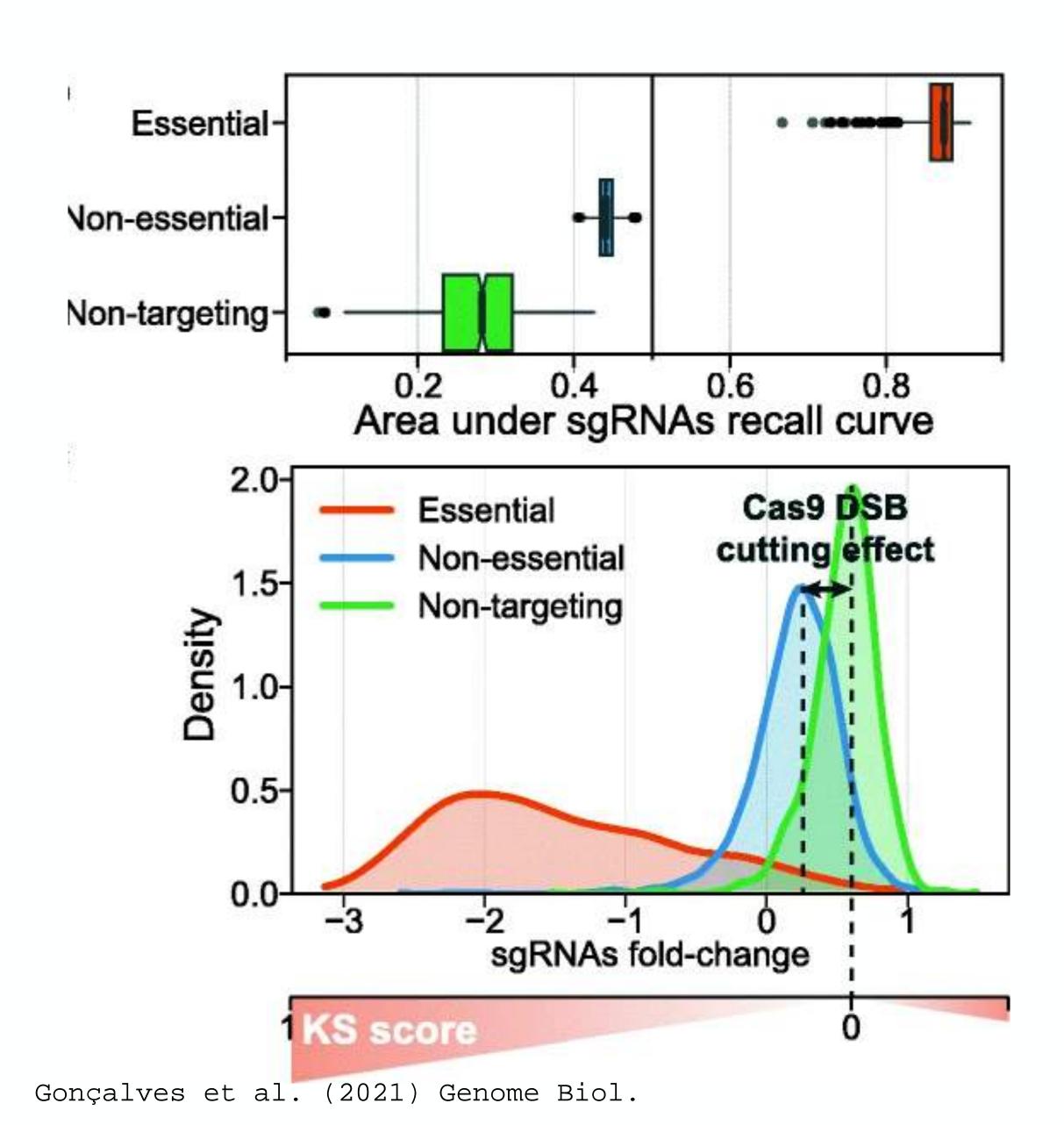
Vicente MM, et al. Front Cell Dev Biol. 2021;9: 718466. doi:10.3389/fcell.2021.718466

Minimal Genome-wide CRISPR-Cas9 library



15

Prioritisation of guides with stronger "on-target" effects



Compiling multiple genome-wide CRISPR-Cas9 sgRNA libraries

Project Score - Kosuke Yusa V1.1; Avana; Brunello; TKOv3

Standardised annotation for 300,167 unique sgRNAs with a median of 19 sgRNA per gene

KS-score

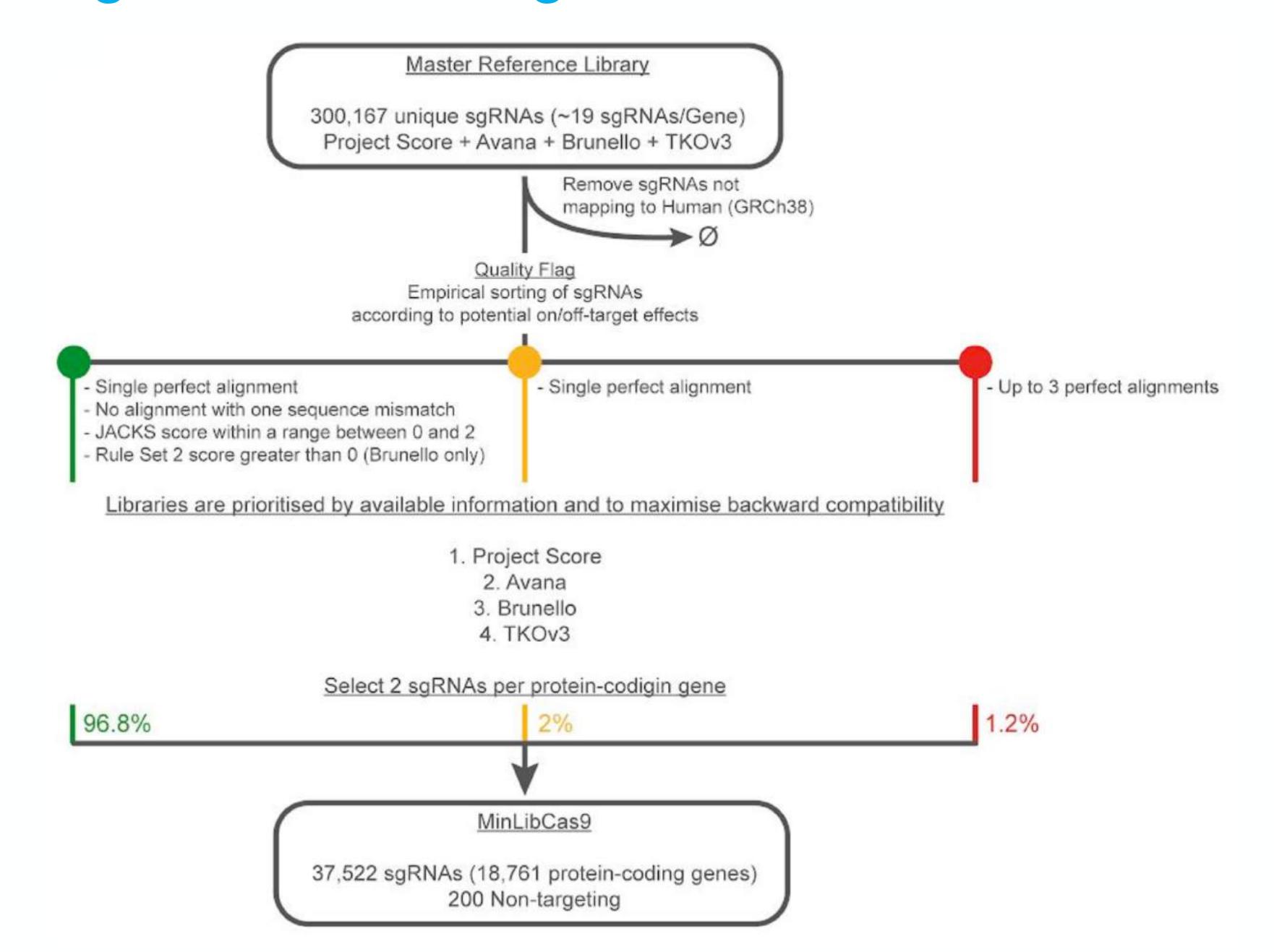
Updated mapping to GRCh38

Off-target summaries using WGE

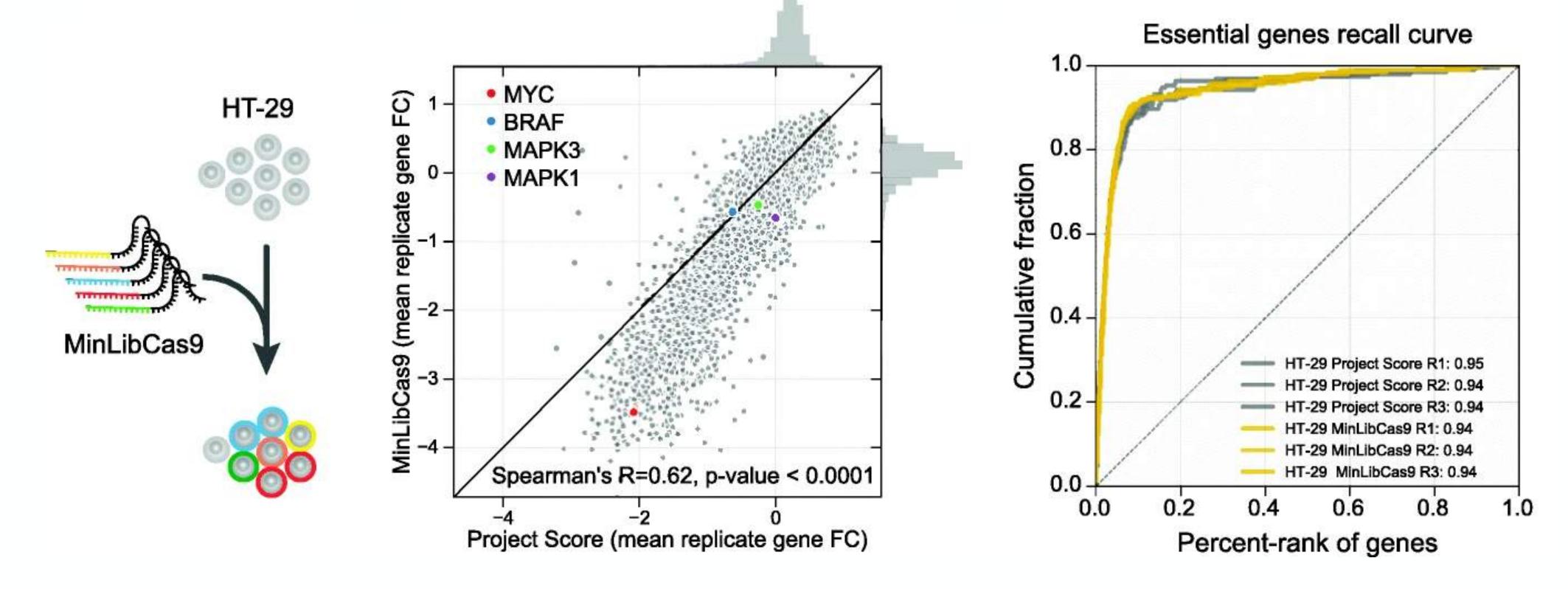
Multiple guide efficacy metrics (JACKS, Rule Set 2, FORECasT)

CRISPOR scores, e.g. MIT specificity and CrisprScan

Data-driven design of a minimal genome-wide CRISPR-Cas9 lib.



MinLibCas9 recapitulates large genome-wide libraries and increases gene fold-change range

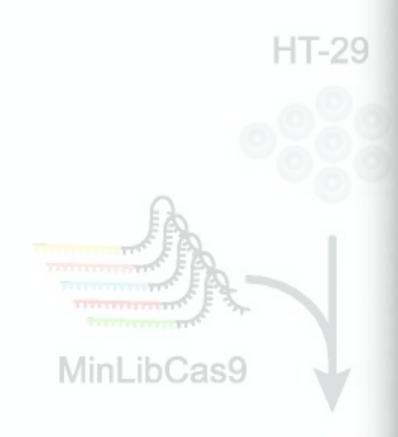


Synthesised and cloned the final MinLibCas9 library and re-screened the HT-29 colorectal cancer cell line

MinLibCas9 showed an higher fold-change range, improving the identification of cancer dependencies

Gonçalves et al. (2021) Genome Biol.

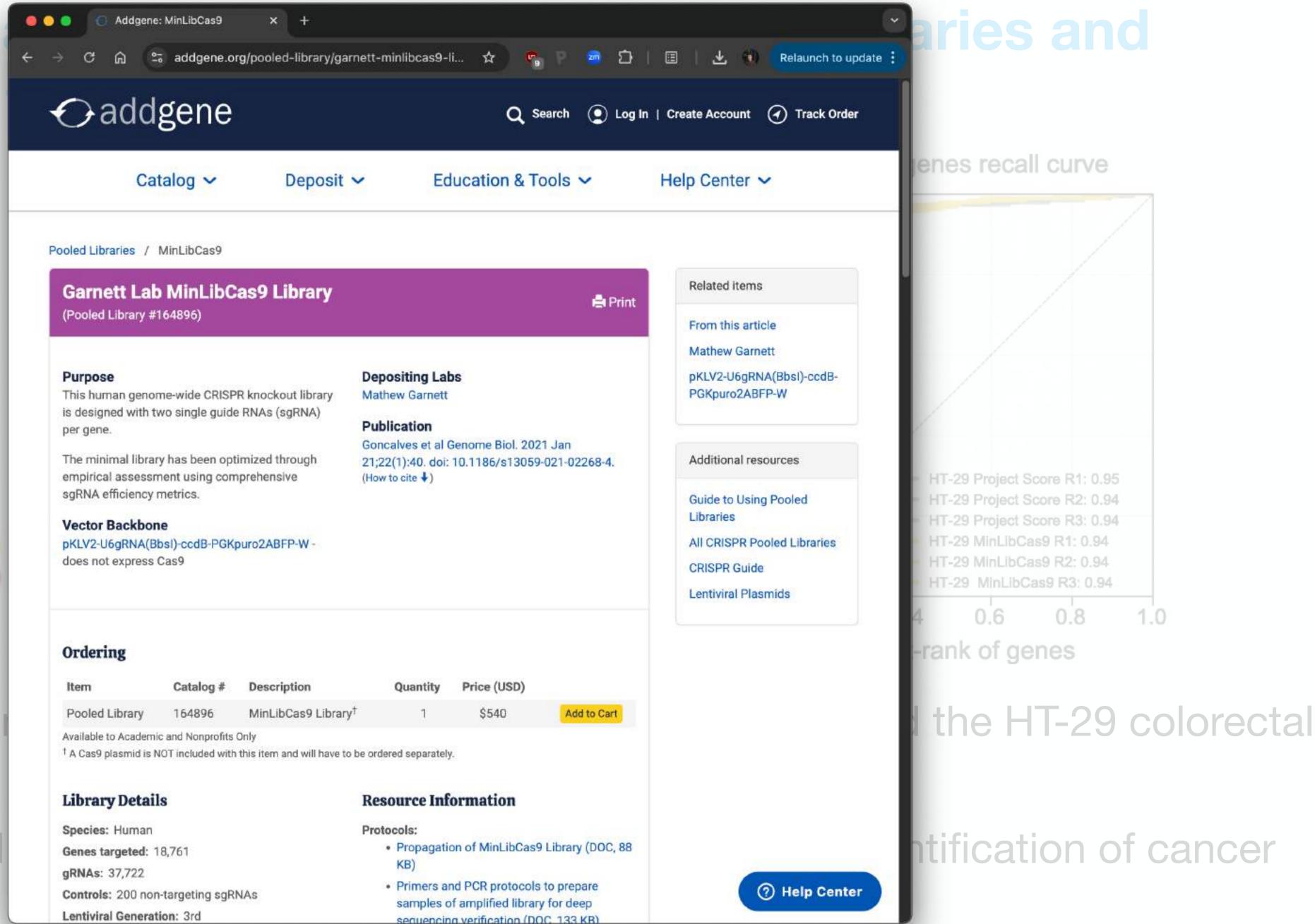
MinLibCas9 recipients increases gene





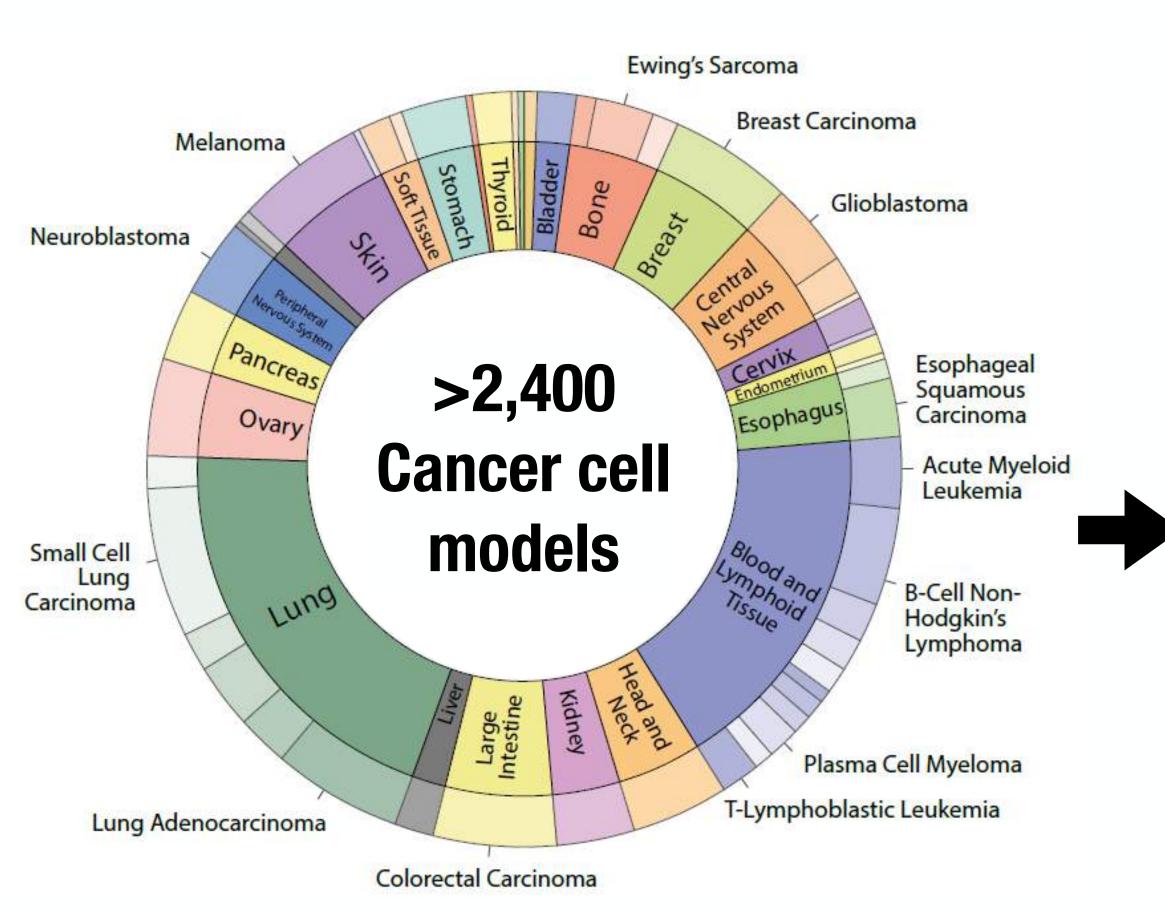
Synthesised and clor cancer cell line

MinLibCas9 showed dependencies



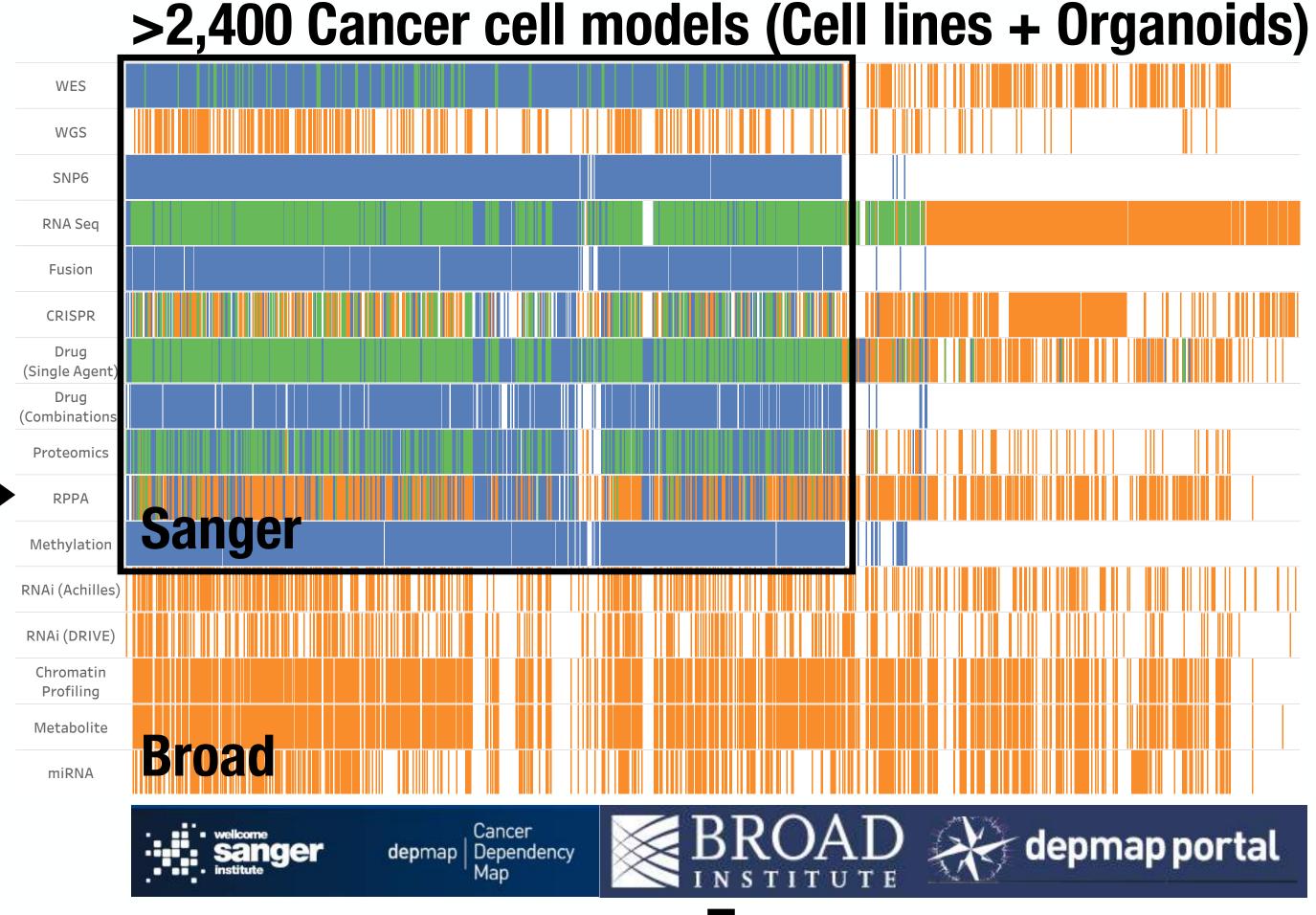
Multi-omics synthetic augmentation of CRISPR-Cas9 screens

Cancer Translation: Multi-omics



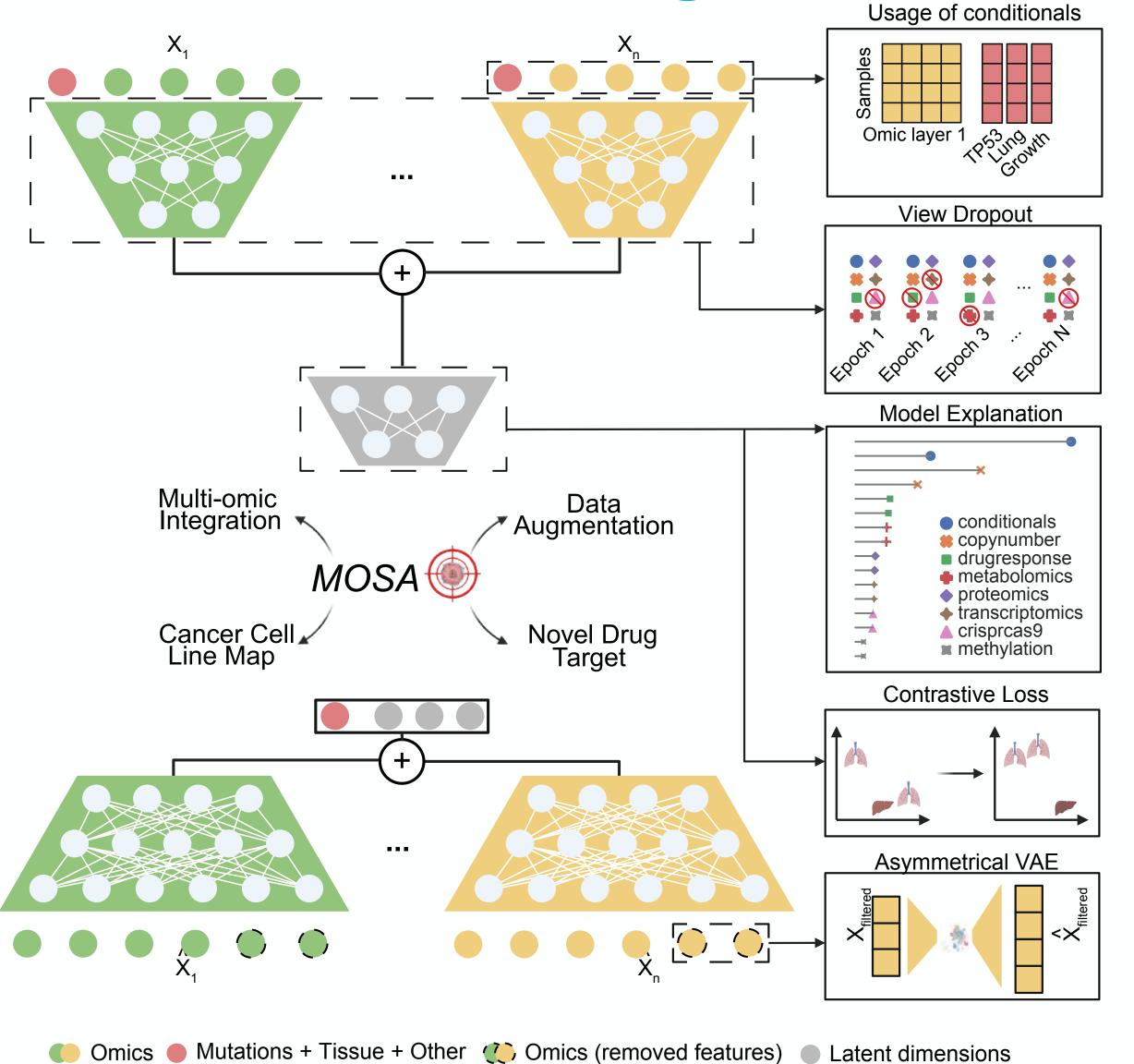
cellmodelpassports.sanger.ac.uk

Garnett et al. 2012 Nature
Iorio et al. 2016 Cell
Behan et al. 2019 Nature
van der Meer et al., 2019, Nucleic Acids Res
Gonçalves*, Poulos*, Cai* et al., 2022, Cancer Cell



Cancer gene, therapeutic biomarker and target discovery

Multi-Omic Synthetic Augmentation (MOSA)



Cai Z*, Apolinário S*, et al. Synthetic augmentation of cancer cell line multi-omic datasets using unsupervised deep learning. bioRxiv. 2024. doi:10.1101/2024.06.26.600742

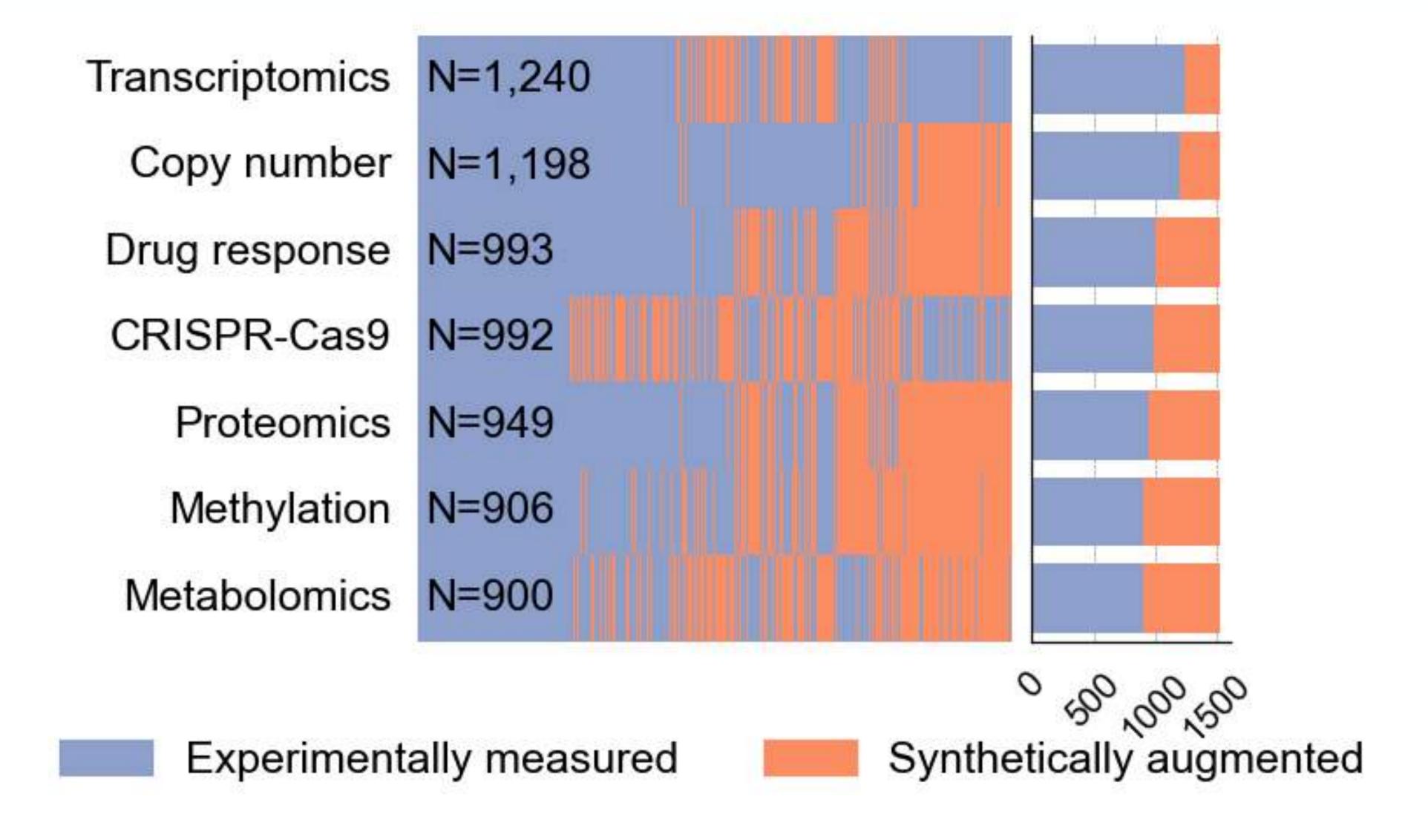
Unsupervised deep learning approach, i.e. variational autoencoder

Cancer cell line generative model with the capacity of augmenting current datasets

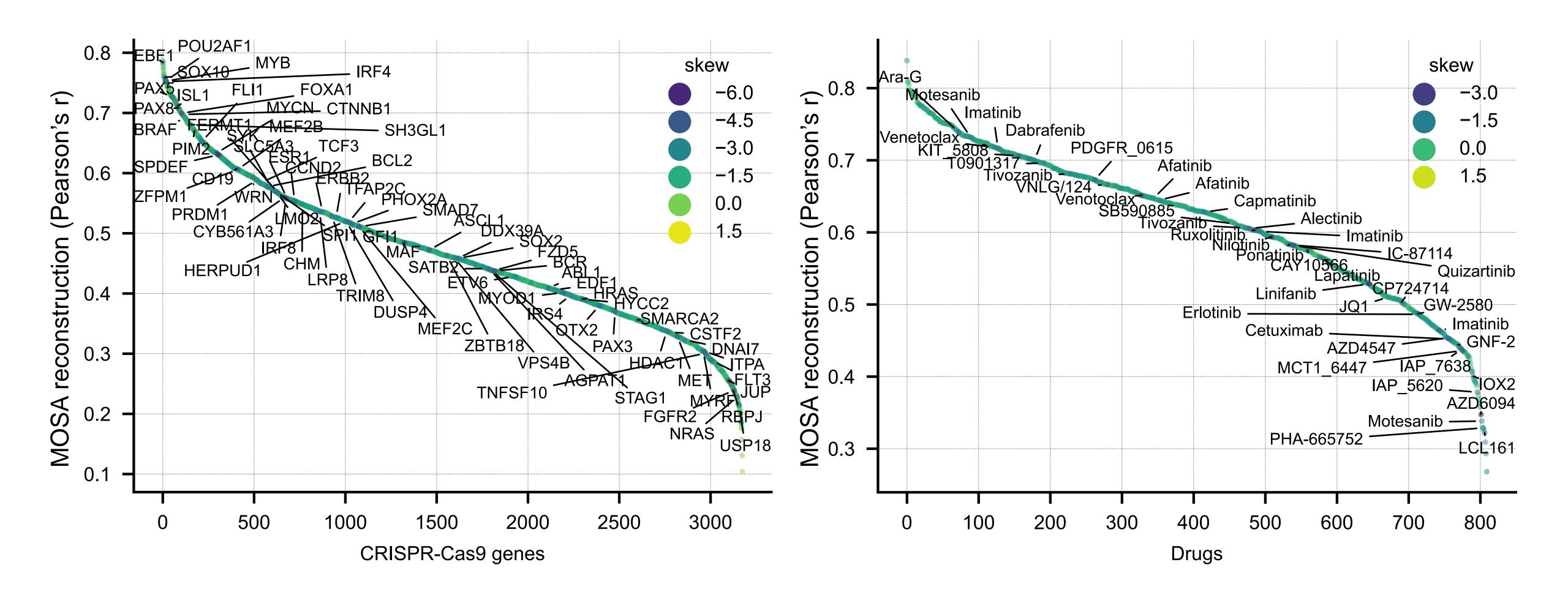




Synthetically augmented cancer cell lines multi-omics map



Overall reconstruction of drug response and CRISPR-Cas9

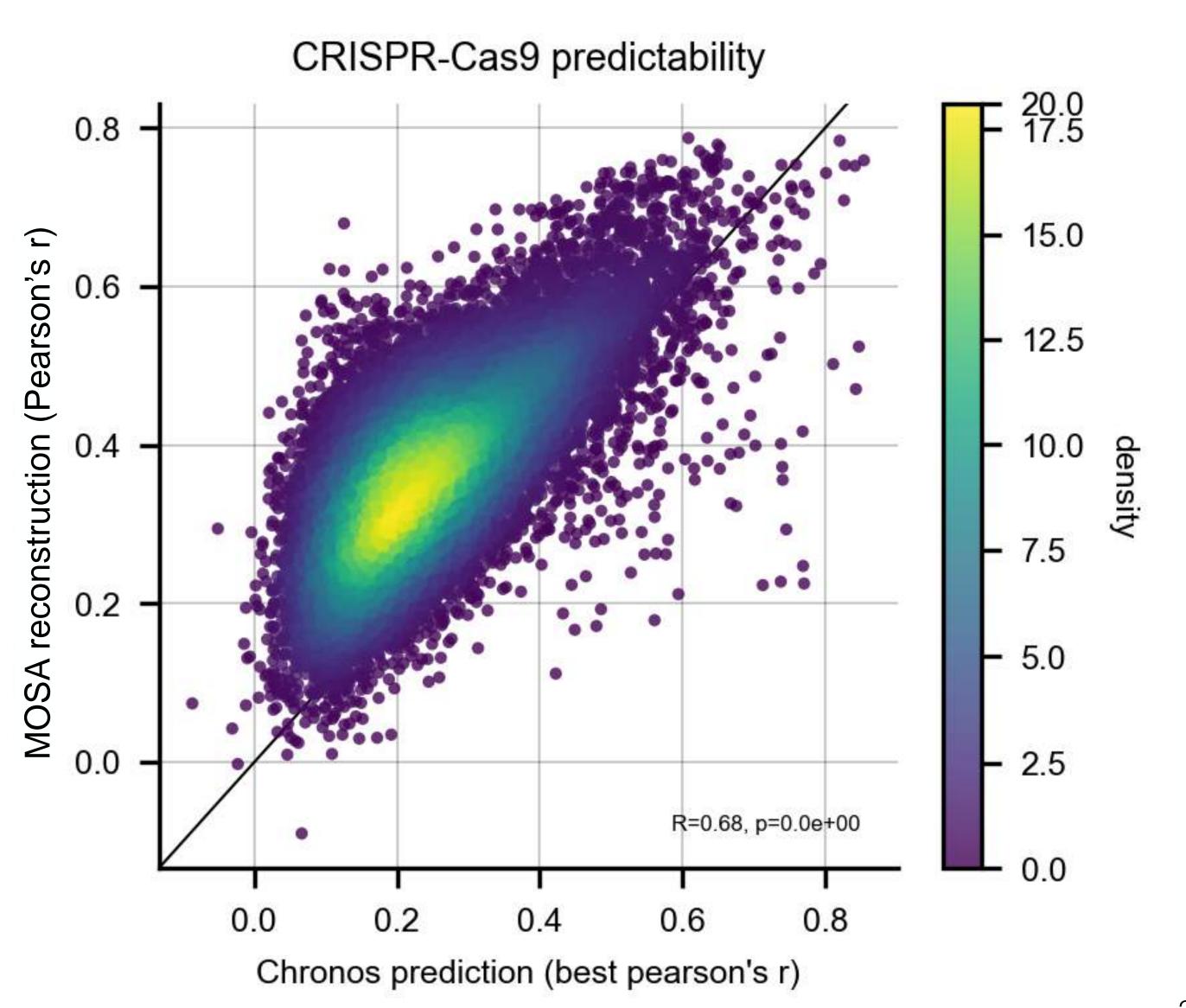


10-fold cross-validated dataset reconstruction

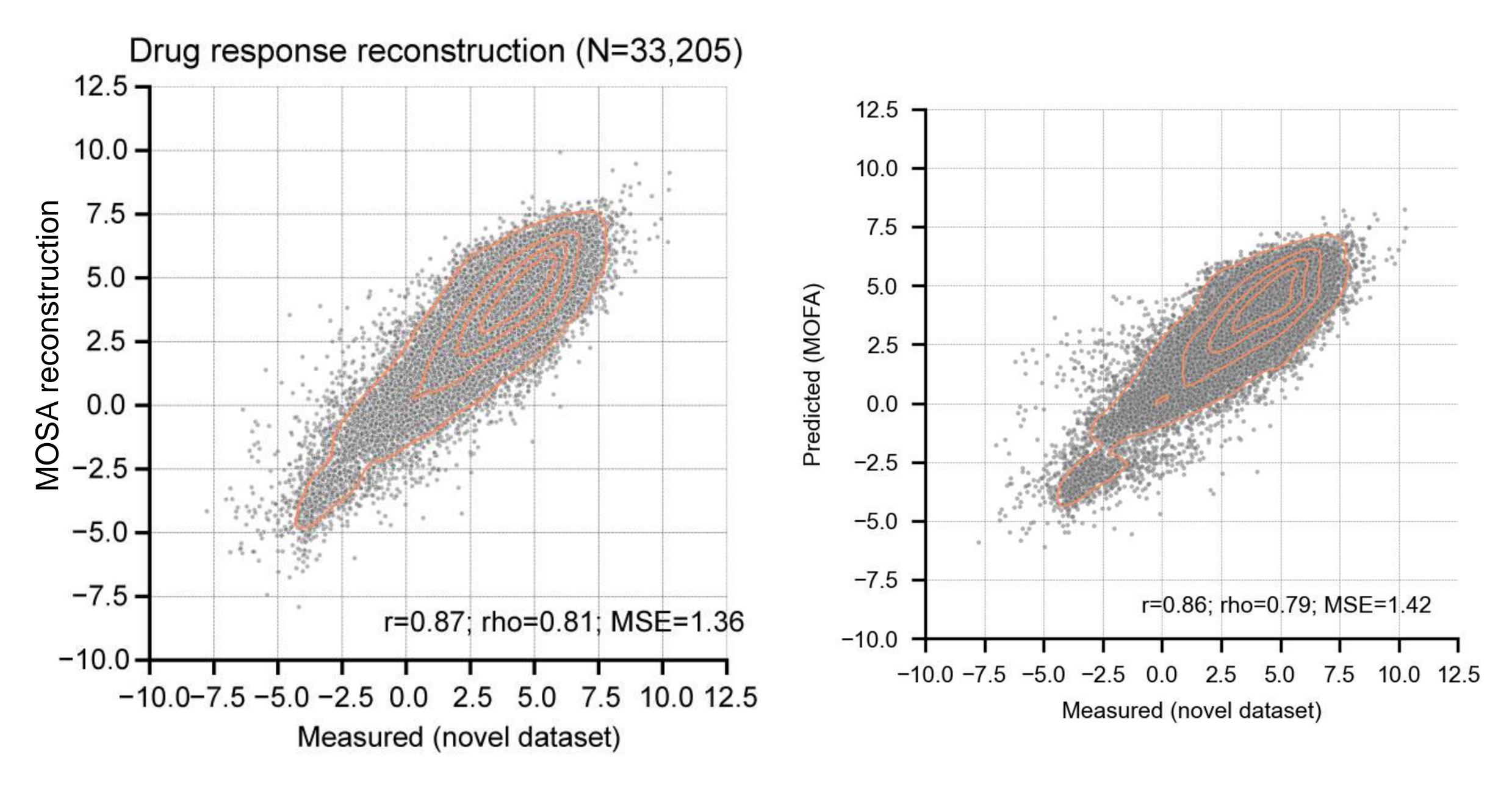
Comparison with predictive performance from Chronos - DepMap Portal

Deep-learning integration of all the multi-omics provides enhanced reconstruction of gene essentiality

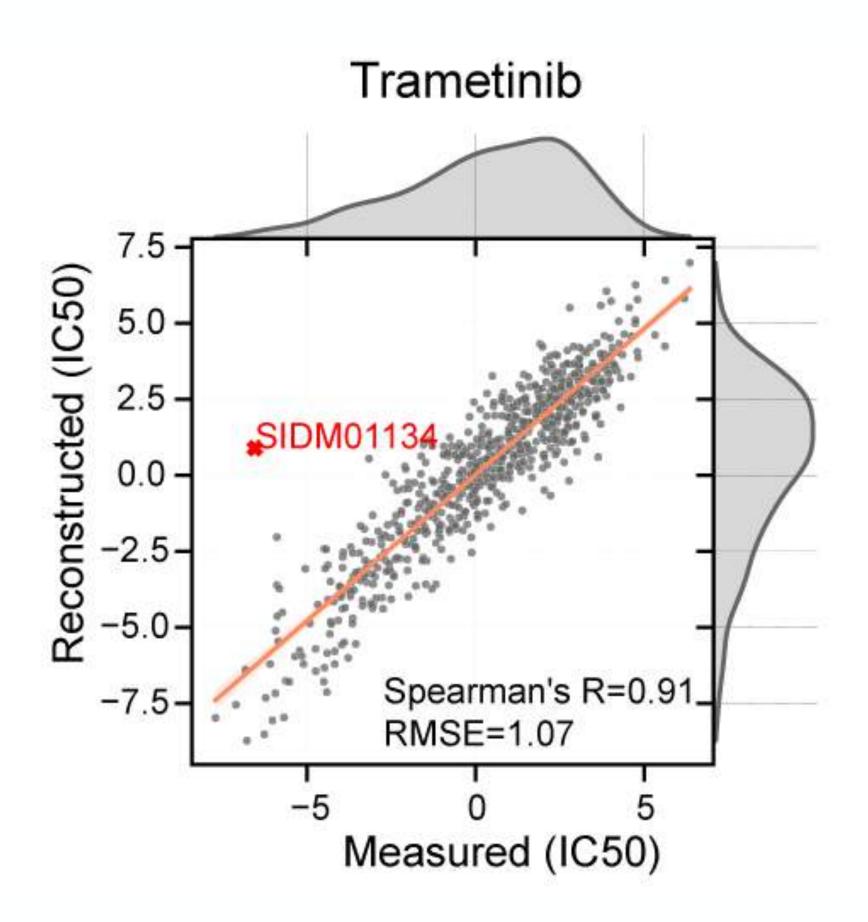
Not a completely fair comparison as we use more biological data, including CRISPR-Cas9 screens



Successful reconstruction of new drug response screens

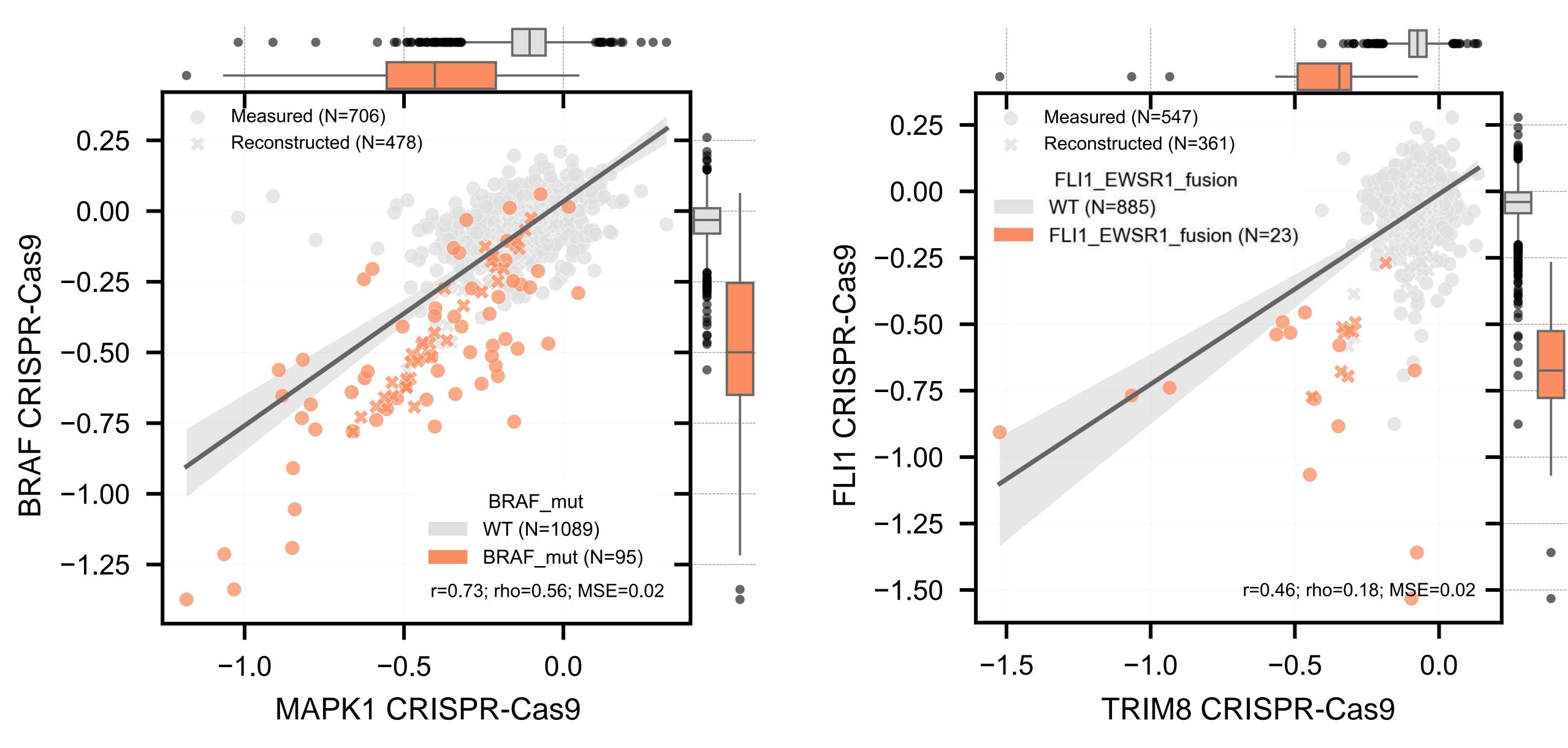


Inconsistencies between synthetic and original measurements



Inconsistencies revealed i) likely incorrect experimental measurements and ii) drugs (e.g. venetoclax) or classes of drugs (e.g. antiapoptotic inhibitors) without effective molecular biomarkers

MOSA synthetic generation of CRISPR-Cas9 screens

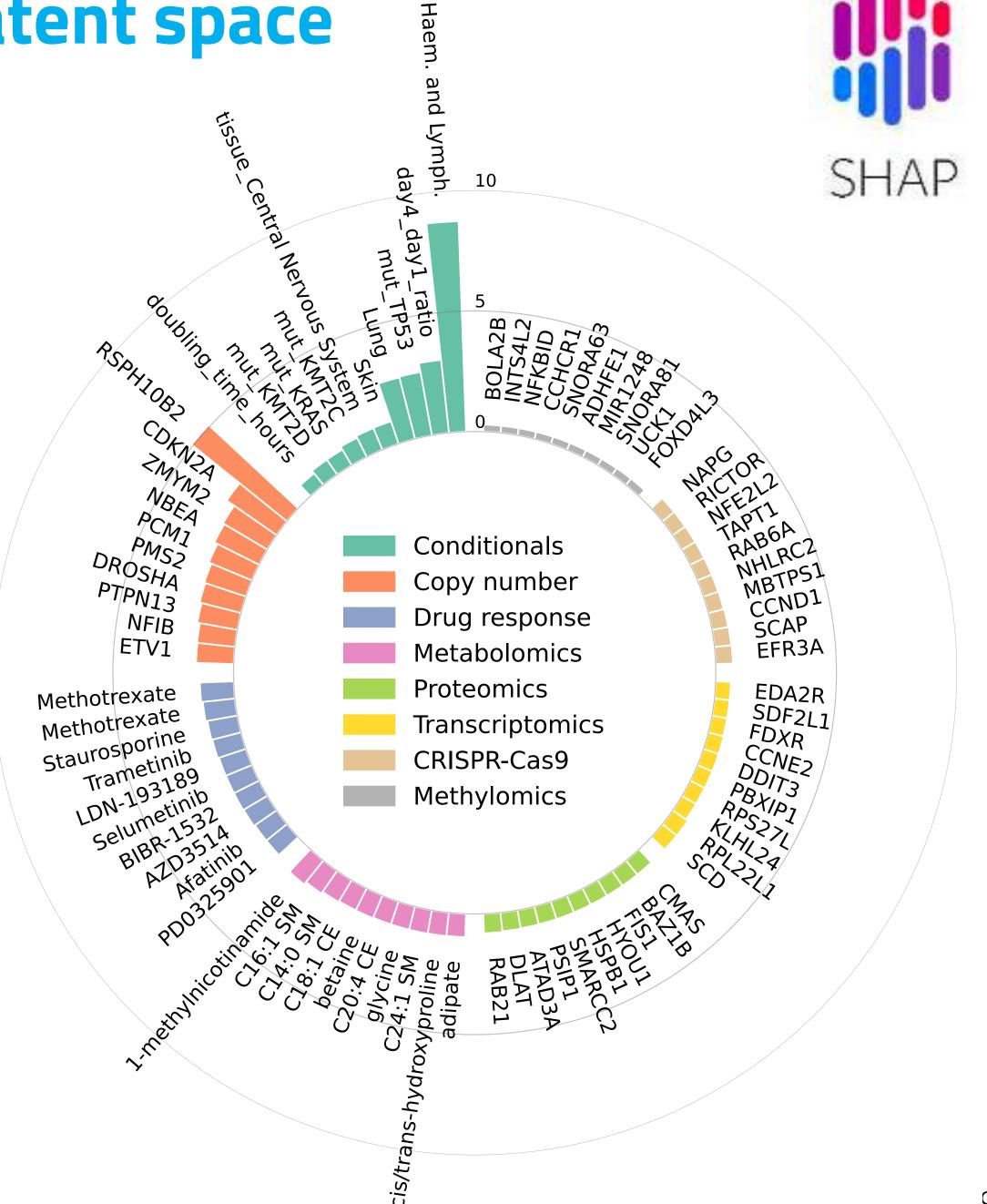


Features important for the multi-omic latent space

From the inputed features of each omic, rank those that are contributing the most to the variability of the cancer cell lines (latent space)

Clear dominance of previously expected features (e.g. Haem. and Lympho., growth rate, TP53 mutations)

Less expected and potentially novel feature associations (e.g. 1-methylnicotinamide)



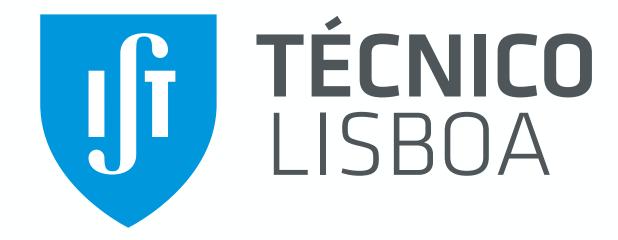
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