

# *An Introduction to Chemical Biology – The art of identifying & profiling targets and molecules – an industrial perspective*



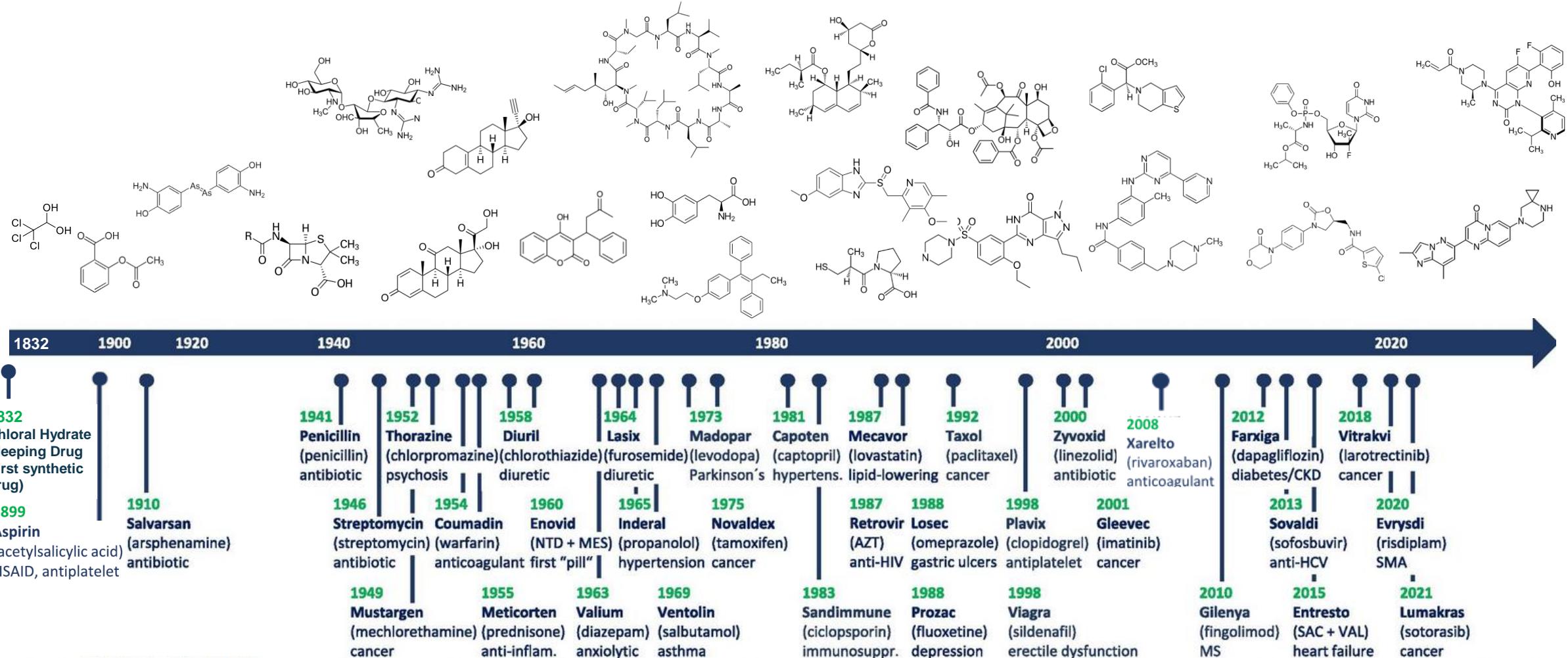
***Dr. Sebastian Essig***

***Chemical Biology, Omics, Imaging  
Drug Discovery Sciences***

***Bayer AG***



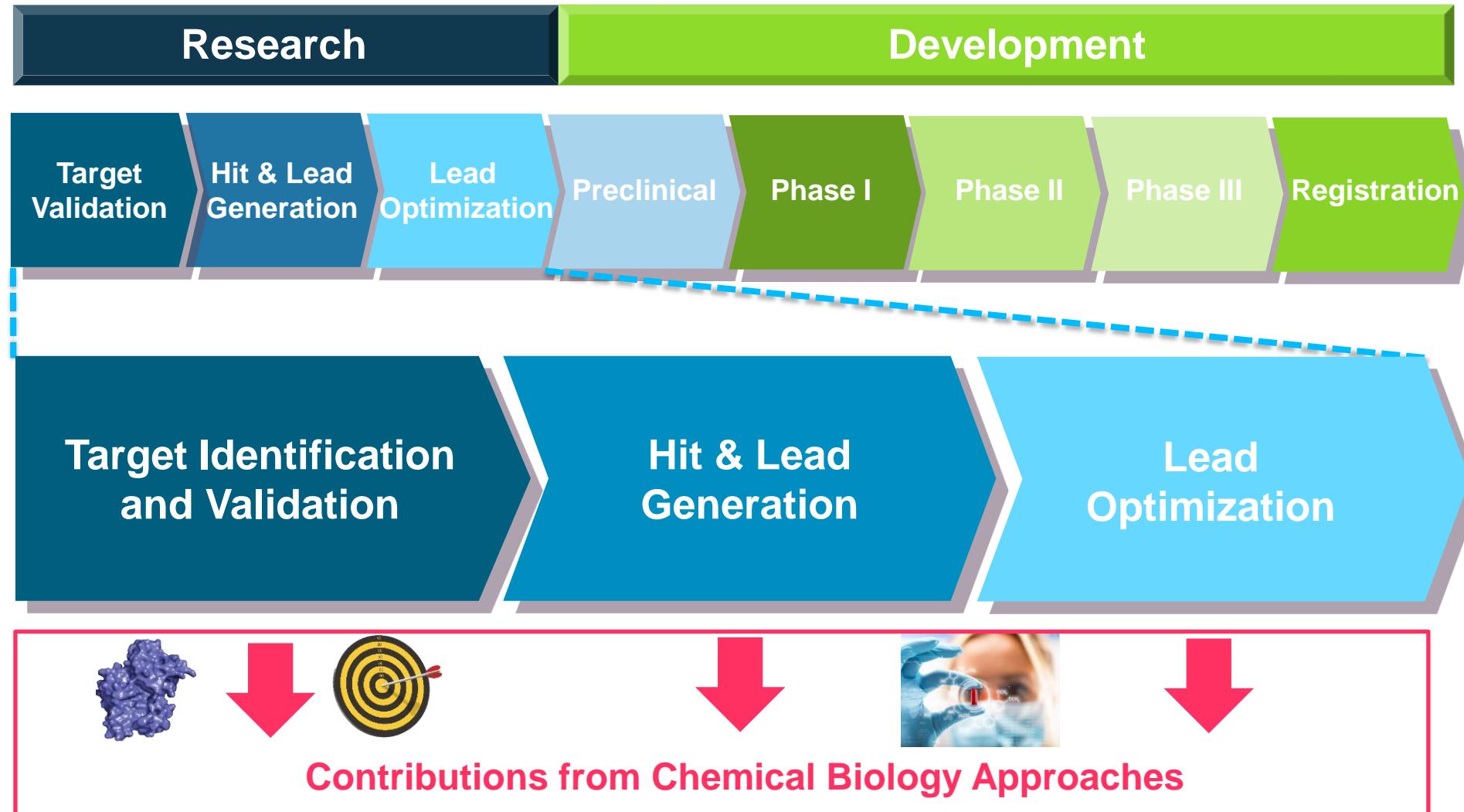
# Medicinal Chemistry has a very long and successfully history



# Medicinal Chemistry has a huge influence on society



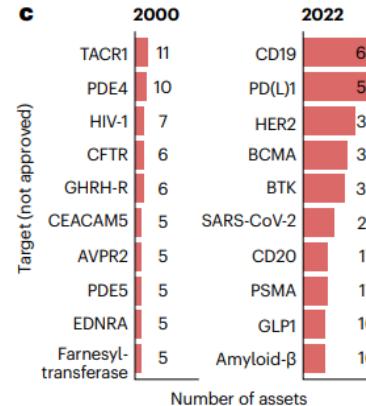
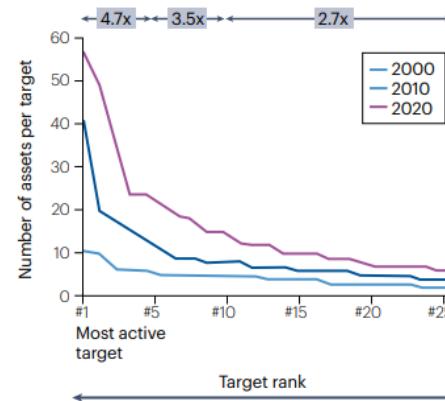
# The different Stages of a Drug Discovery & Development Program



# Current Challenges in Drug Discovery

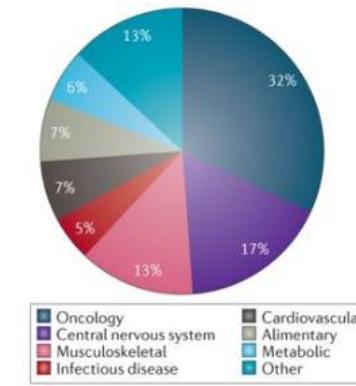
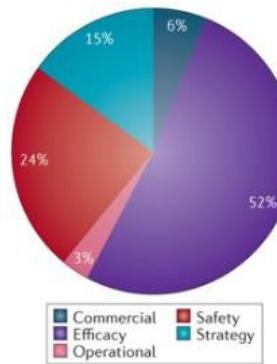
## Herding in the drug development pipeline

Nat. Rev. Drug Disc 2023



## Translational failure in clinical phases

R. K. Harrison, *Nat. Rev. Drug Discov.* 2016, 15, 817.



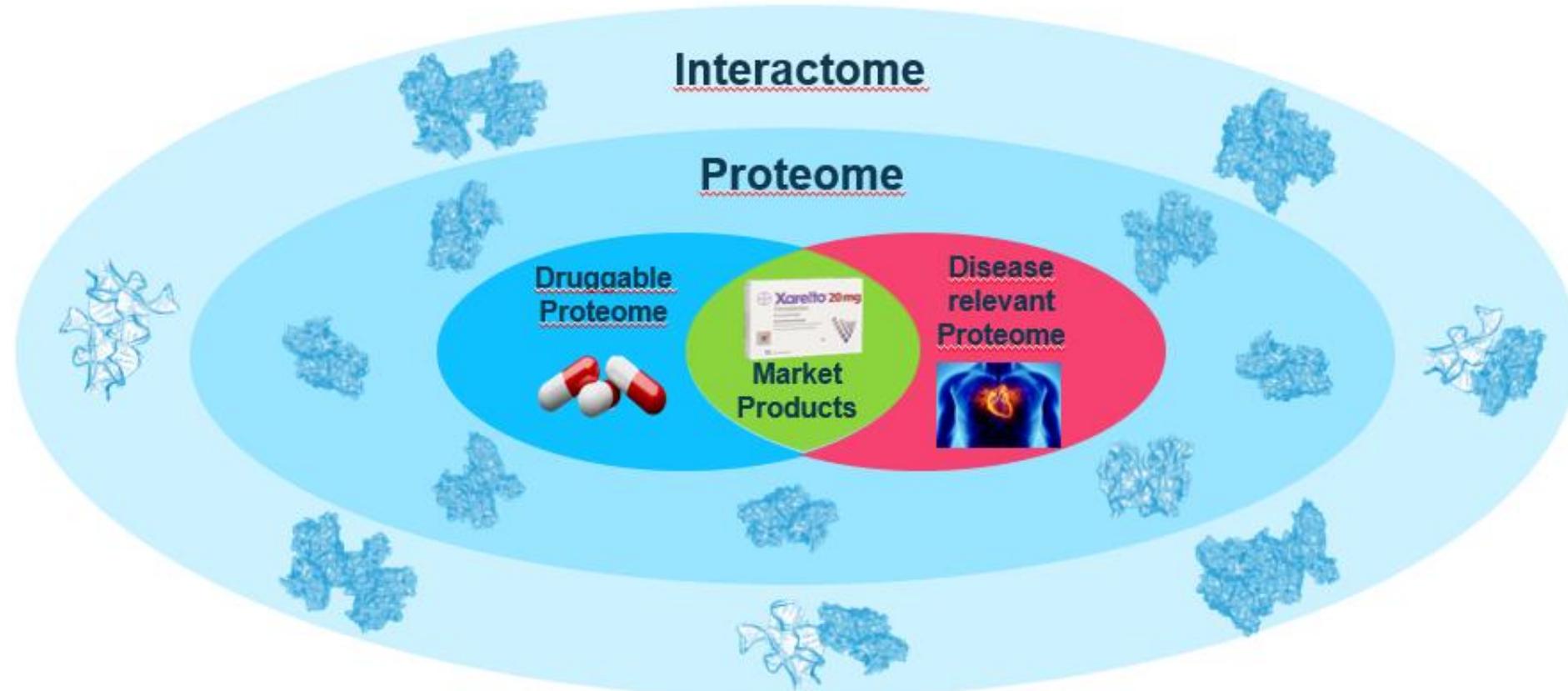
The number of targets has grown just 3.4% per year.

76% of clinical programs fail due to efficacy or safety.

**Current Bottlenecks to increase R&D productivity:  
Access to robust and cost effective tools towards...**

- // novel targets
- // clear understanding of target to disease link
- // choosing right targeting modalities
- // better understanding of on/off-target activity and mode of action

# There is a high need to expand the druggable space





## Intro Quiz Questions



**How many Genes are present in the human genome?**

- a) 140.000
- b) 20.435
- c) 49.131**
- d) still unclear

**2.) How many proteins are expressed in human cells?**

- a) 42.320
- b) 192.917**
- c) 1.000000
- d) 20.359**

**3.) How many proteins are currently druggable?**

- a) 4479**
- b) >667**
- c) 2282
- d) not enough**

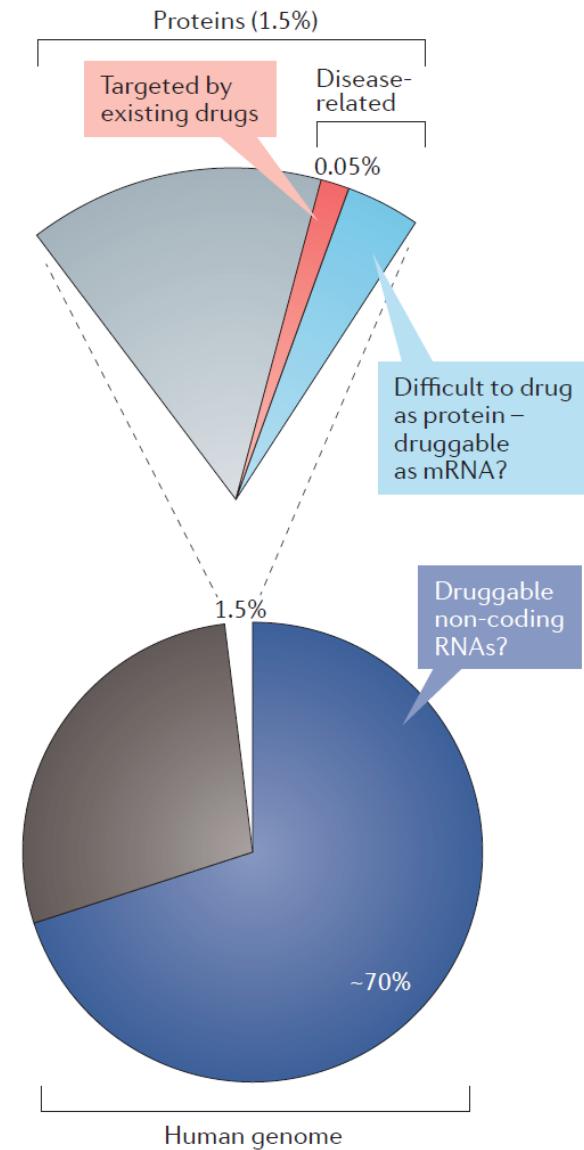
[TTD: Therapeutic Target Database \(idrblab.net\)](http://TTD Therapeutic Target Database (idrblab.net))

Aebersold, R., Agar, J., Amster, I. et al., *Nat Chem Biol* **14**, 206–214 (2018)

# The druggable space is currently limited

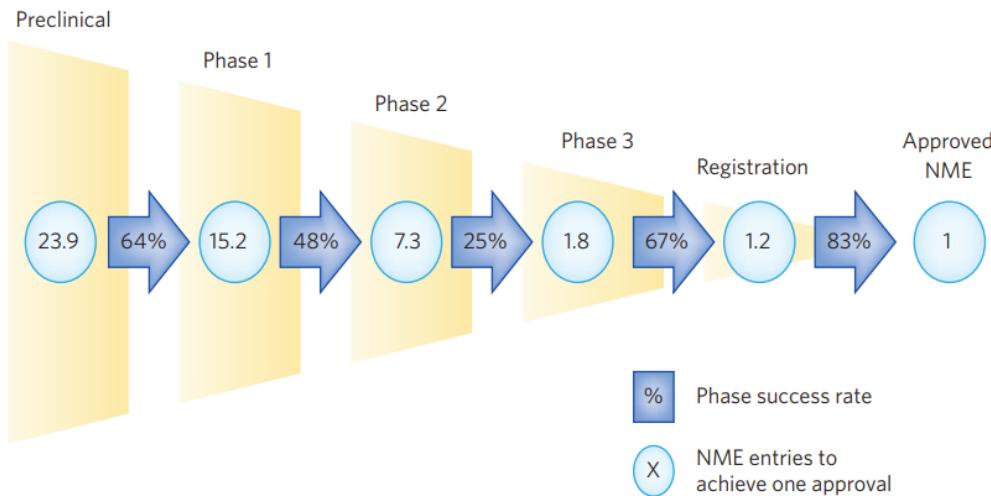
- // Number of drug targets of approved drugs: **>667**
- // Number of disease relevant proteins: **2000 - 3000**
- // Number of druggable proteins: **4479**
- // Size of the humane transcriptome: **> 200.000 transcribed RNAs**, covering about 70% of the human genome

Drug target class	Targets			Drugs		
	Total targets	Small-molecule drug targets	Biologic drug targets	Total drugs	Small molecules	Biologics
Human protein	667	549	146	1,194	999	195
Pathogen protein	189	184	7	220	215	5
Other human biomolecules	28	9	22	98	63	35
Other pathogen biomolecules	9	7	4	79	71	8



# The Big Pharma R&D Dilemma:

Pharmaceutical industry 2005–2009



**The 'big pharma' dilemma: develop new drugs or promote existing ones?**

Guest Column | October 3, 2016



## The High Price Of Failed Clinical Trials: Time To Rethink The Model

By Ralf Huss, MD, Chief Medical Officer,  
*Definiens*

Back in 2014, a [study](#) in *Nature Biotech* showed that only 32% of drugs have a probability of making it to Phase 3 trials, and only one in 10 drugs overall actually makes it to market. Things haven't improved since then.

BIO recently [put out](#) a study reporting that the average overall likelihood of approval (LOA) by FDA from Phase I was 9.6 percent – a 1 in 10 chance. The rate is even lower for major disease areas like oncology. Phase II clinical programs continue to experience low success rates as well, with only 30.7 percent of candidates advancing to Phase III, a slightly worse rate than it was a few years ago.

The cost of failed clinical trials is high, and the industry needs to focus on ways to reduce the



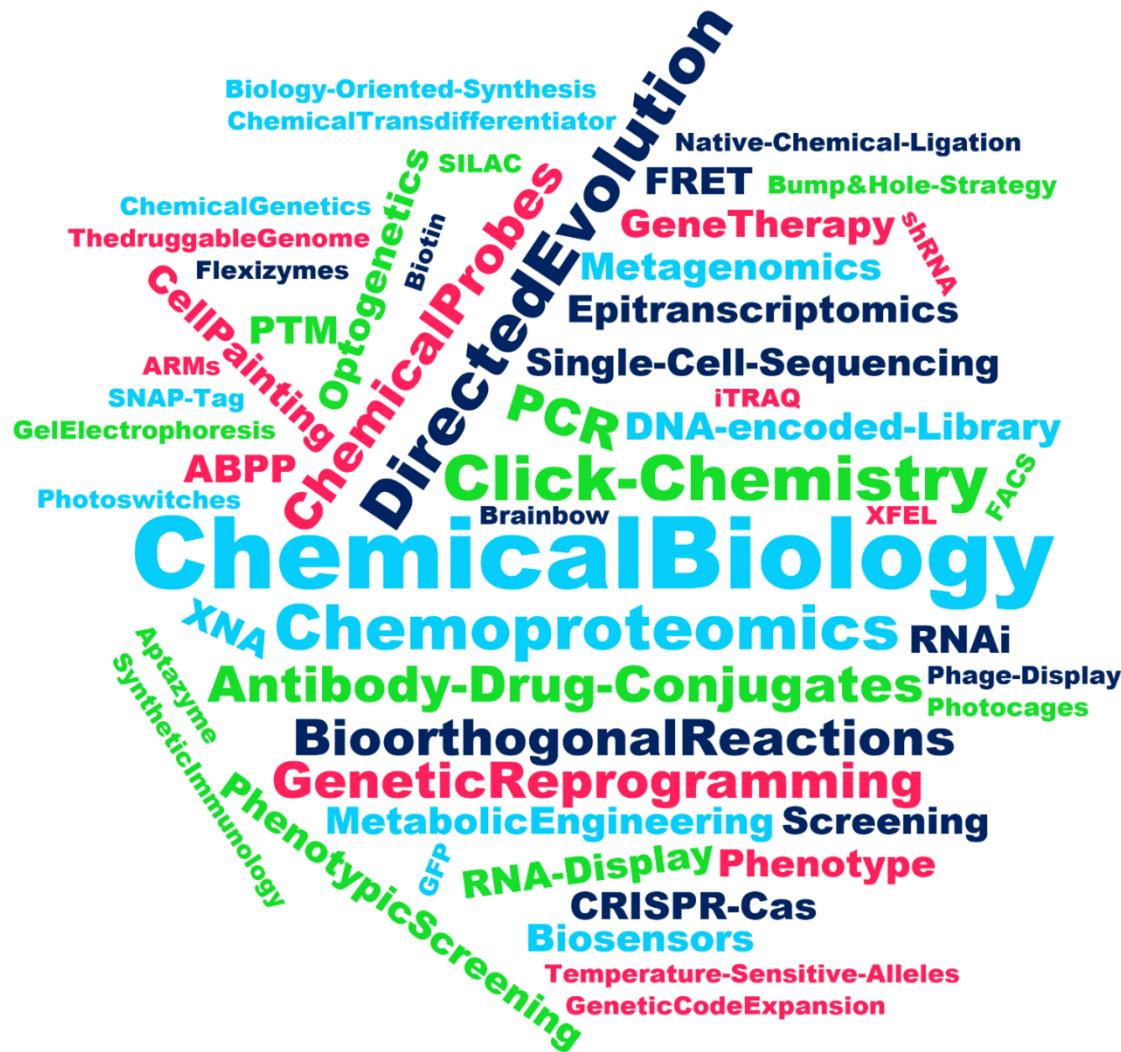
Weiss, D., Naik, P. & Weiss, R. *Nat Rev Drug Discov* **8**, 533–534 (2009)

Bunnage *et al.* *Nature Chemical Biology* **2011**, 7, 335



**Is there a new way to increase pharma  
R&D productivity?**

# Chemical Biology provides a modern and diverse toolbox



# Chemical Biology in Pharma Research – A new way to increase success rates

Know your target, know your molecule

Mark E Bunnage, Adam M Gilbert, Lyn H Jones & Erik C Hett

The pharmaceutical industry continues to experience significant attrition of drug candidates during phase 2 proof-of-concept clinical studies. We describe some questions about the characteristics of protein targets and small-molecule drugs that may be important to consider in drug-discovery projects and could improve prospects for future clinical success.

## IN THE PIPELINE

Derek Lowe's commentary on drug discovery and the pharma industry. An editorially independent blog from the publishers of *Science Translational Medicine*. All content is Derek's own, and he does not in any way speak for his employer.

### ANALYTICAL CHEMISTRY

## Chemical Biology – The Future?

By Derek Lowe | 23 September, 2010



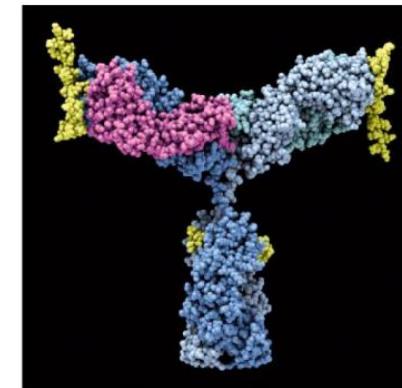
By Derek Lowe



RSC Drug Discovery

Edited by Mark E Bunnage

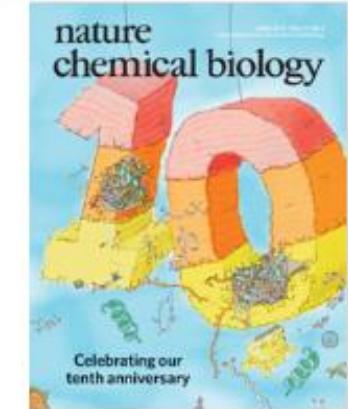
New Frontiers in  
Chemical Biology  
Enabling Drug Discovery



RSC Publishing

Frontiers in drug discovery  
*Integrating chemistry and biology in the search for the next generation of therapeutics.*

A decade of chemical biology  
*With insights from a panel of experts, the *Nature Chemical Biology* editors examine the evolution and current era of chemical biology.*



Celebrating our  
tenth anniversary

*nature  
chemical biology*  
An emerging role for chemical biology

EDITORIAL

# Chemical Biology is currently an important topic in the Pharmaceutical Industry

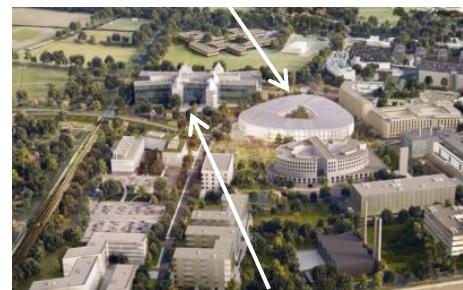


**CB Culture:** High-profile  
CB-Scientist as Boss

Former President of the Novartis  
Institutes for BioMedical Research  
(NIBR), Head of research @ Amgen  
**Chemical Biology at NIBR**

## Our Approach to Early Research and Discovery

We organize our early discovery efforts around a scientific discipline  
called chemical biology, which **combines biology, chemistry** and  
**computer science.**



MRC Laboratory of Molecular Biology

### Right target

- Strong link between target and disease
- Differentiated efficacy
- Available and predictive biomarkers

target as epicenter  
@ 5 R Strategy



**MERCK**

INVENTING FOR LIFE

Merck & Co. Opens Cambridge Exploratory Science  
Center, Plans to Hire 30 More Employees

### Education Minimum Requirement:

- PhD in Chemistry and a minimum of 7 years of experience in chemical biology /medicinal/synthetic chemistry

### Required Experience and Skills:

- Prior experience in chemical biology
- Chemical Biology and drug discovery knowledge and experience



Thursday - August 5, 2021

Bayer strengthens drug discovery  
platform through acquisition of  
Vividion Therapeutics





## How can Chemical Biology be defined?

# The Historical Roots of Chemical Biology

## THE BIRTH OF CHEMICAL BIOLOGY.

*The Harveian Oration delivered before the Royal College of Physicians of London on Oct. 18th, 1930,*

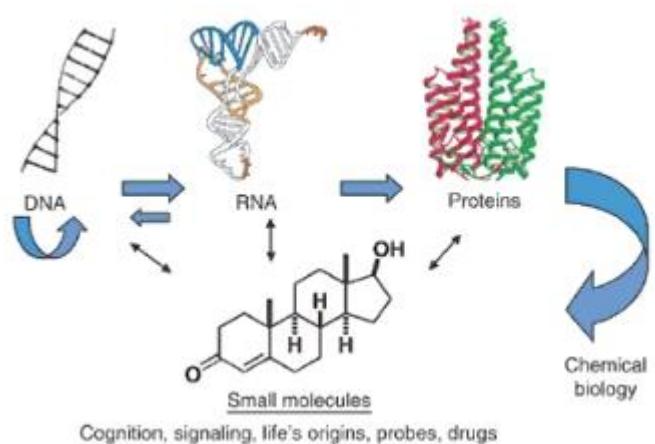
BY J. B. LEATHES, M.B. OXF., F.R.S.,

FELLOW OF THE COLLEGE; PROFESSOR OF PHYSIOLOGY IN THE UNIVERSITY OF SHEFFIELD.

at the birth of biological chemistry, a science to which chemistry owes as much as biology, and without which chemistry would have but three legs to stand on. If the ideas in his work did not all originate



J. B. Leathes, *The Lancet* 1930, 216, 889-895.



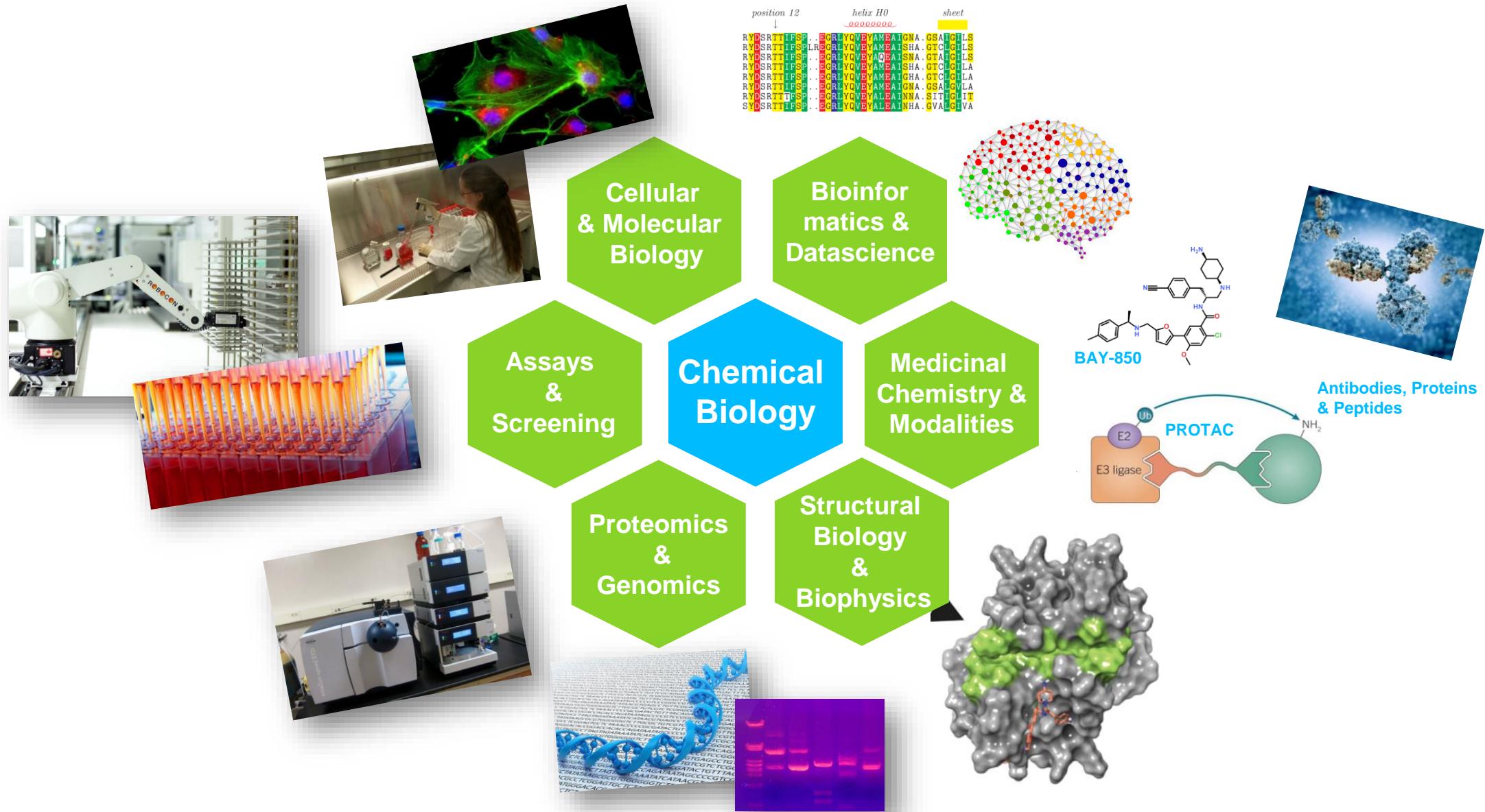
## Small molecules: the missing link in the central dogma

Schreiber, S. *Nat Chem Biol* 1, 64–66 (2005)

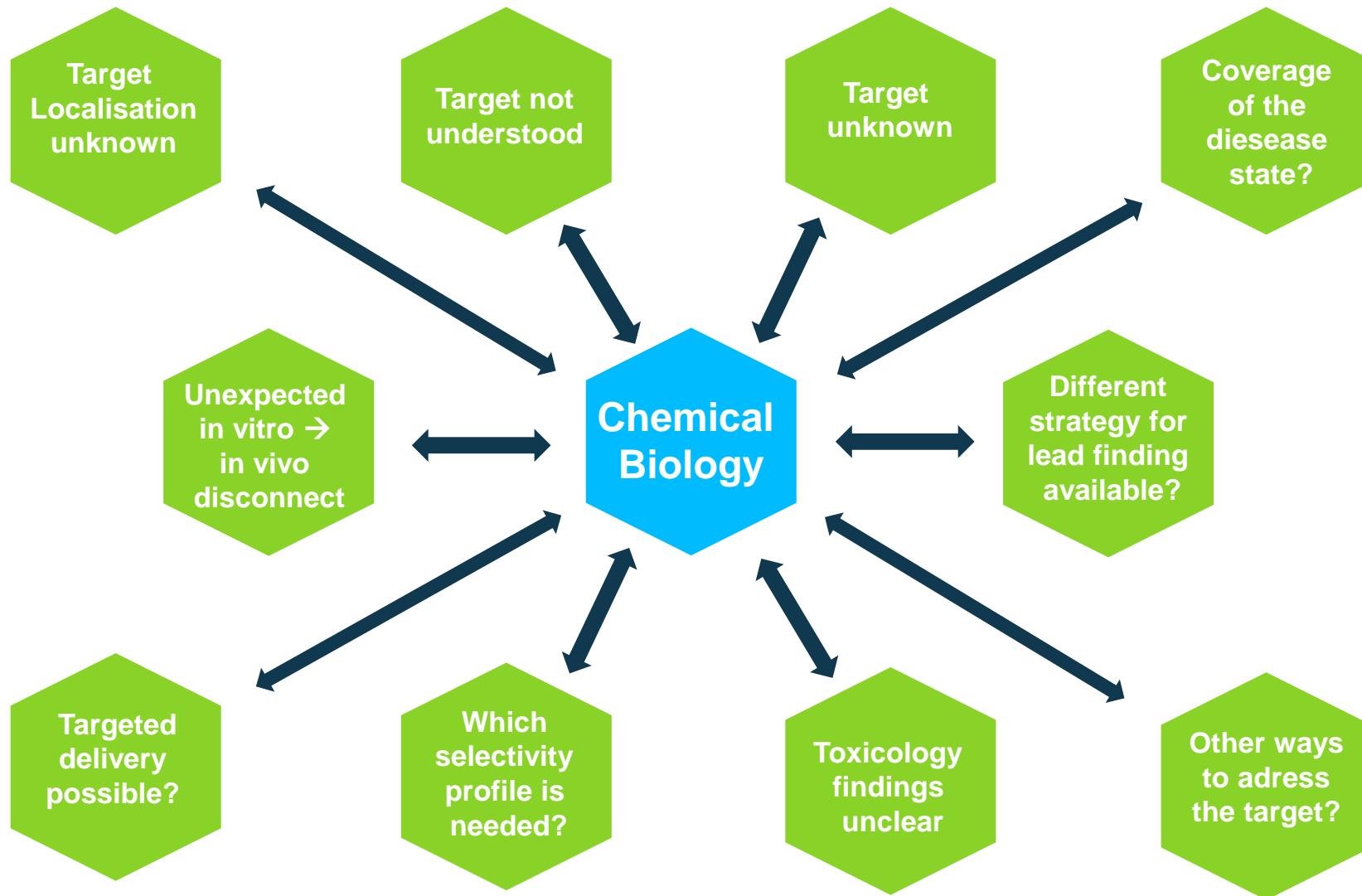


A Personal Definition:  
Design of Synthetic Probes &  
Technological Tools to Identify & Study  
Novel Druggable Mode of Actions

# Chemical Biology: An Interdisciplinary Research Approach



# Chemical Biology Questions – What can you do with the toolbox???

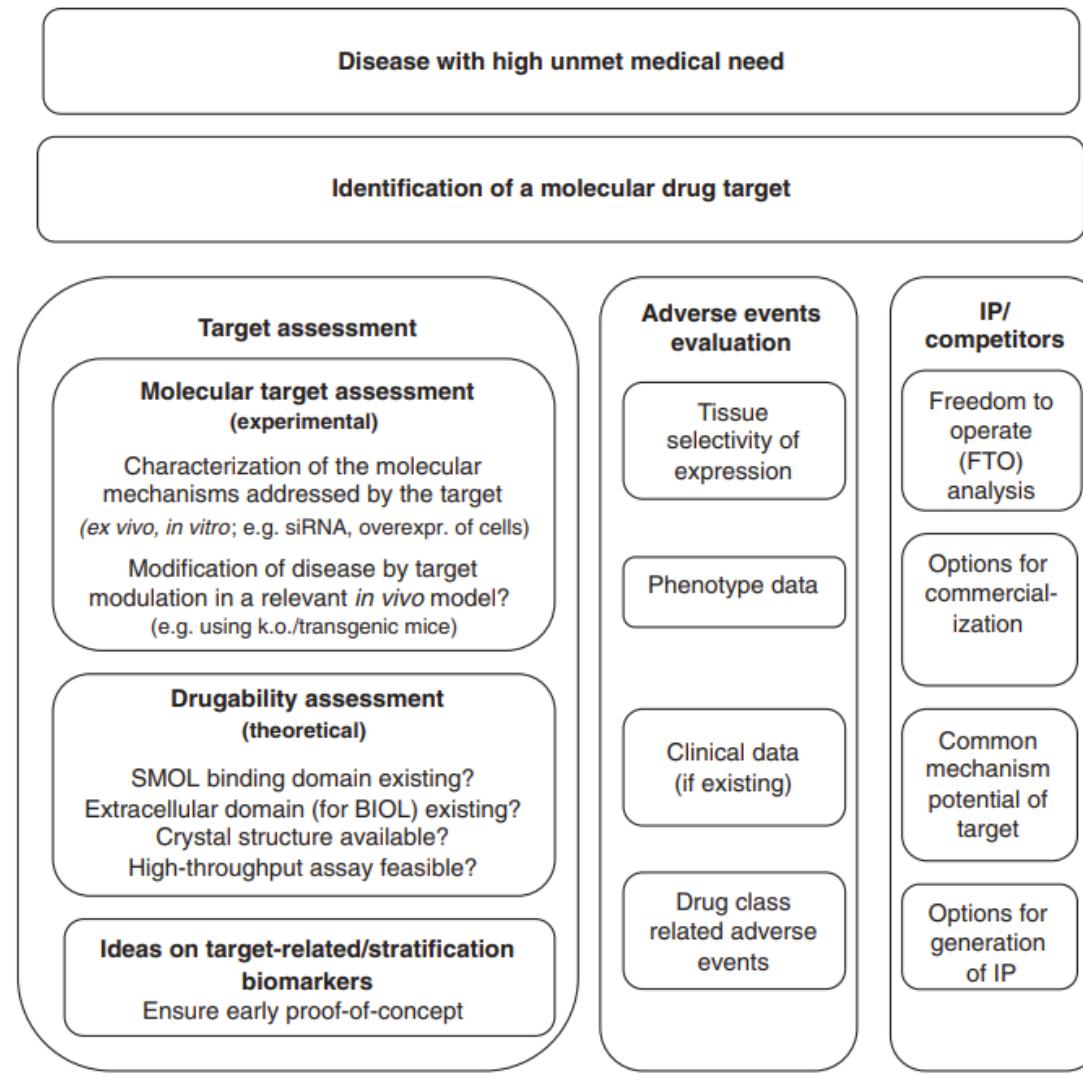




**One application for Chemical Biology  
tools: Target Identification**

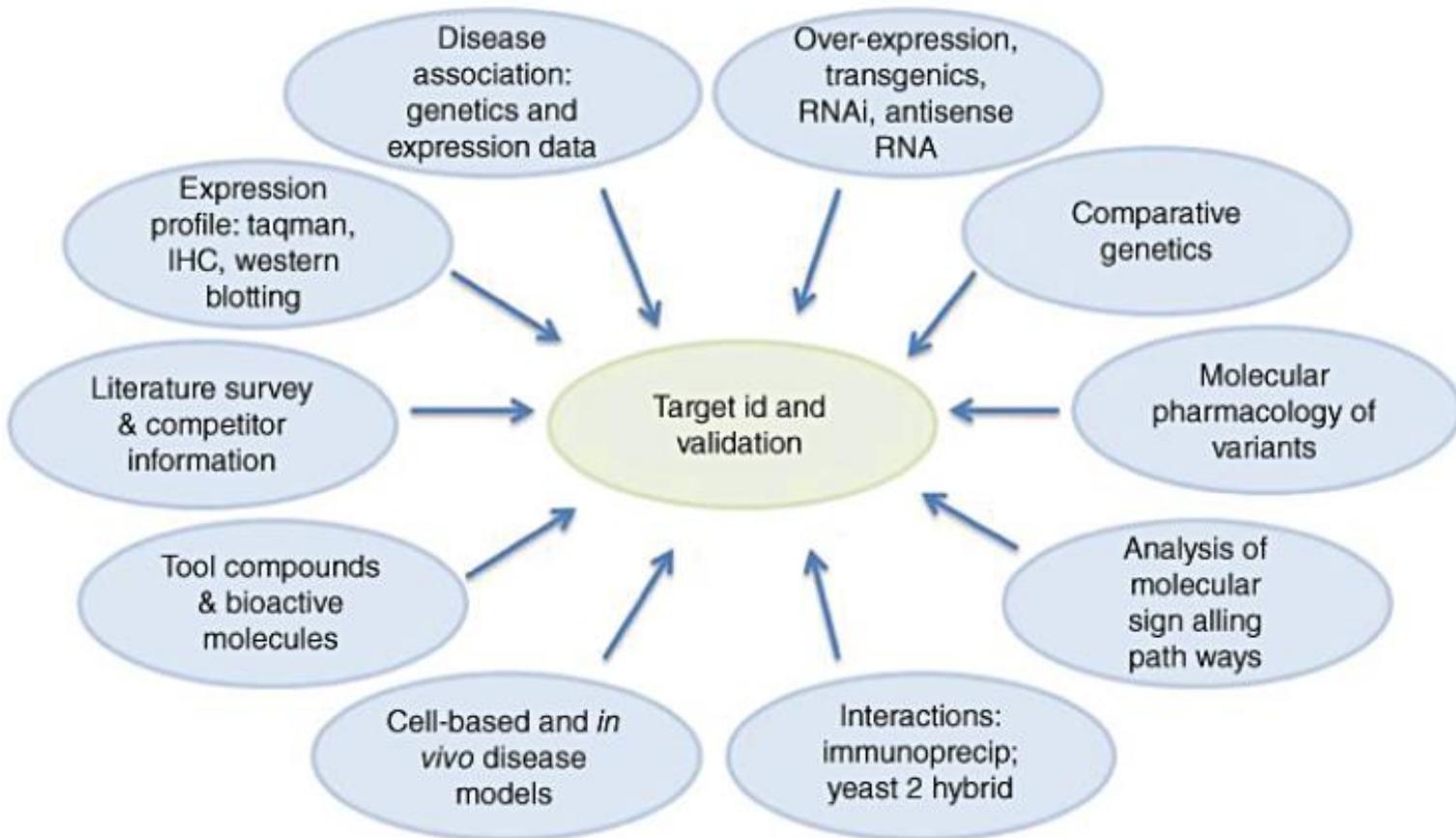
**What makes a good drug target?**

# Criteria for a good drug target are complex and connected

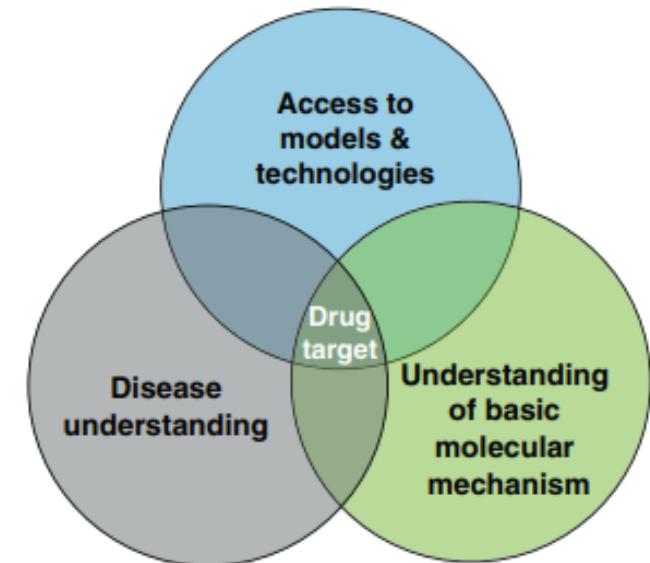


# The option space for target identification is increasing:

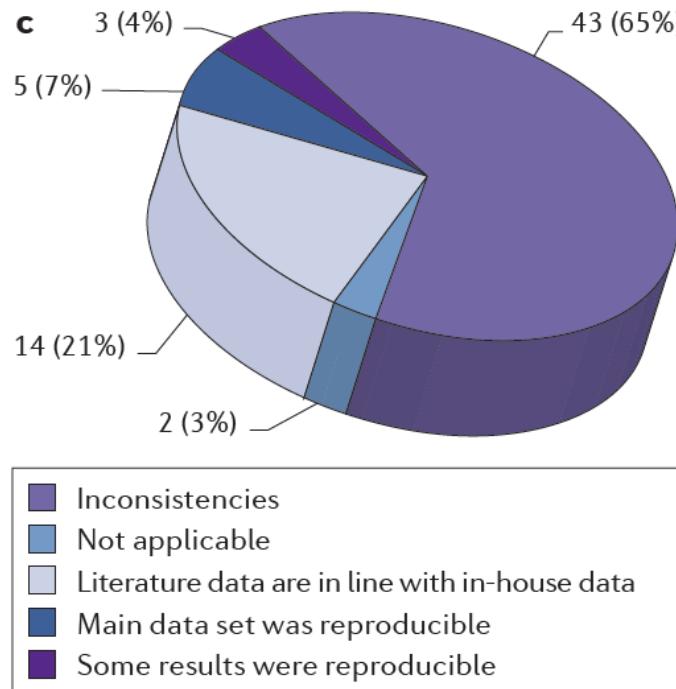
There are multiple sources to identify a drug target:



The Drug target space expansion depends on:



# How good is the academic literature as a source for drug targets?



## Bayer study:

67 projects investigated (70% from oncology)

In **2/3 of the investigated projects inconsistencies between published and in-house data**

## Amgen study:

Data from 53 landmark papers reproduced internally

**Scientific findings were confirmed in 11% of cases**

Many industrial drug discovery projects **start from literature reports on new targets**

**A lack of reproducibility of published data causes severe problems**

# Many academic authors are also ignoring target validation work from industry

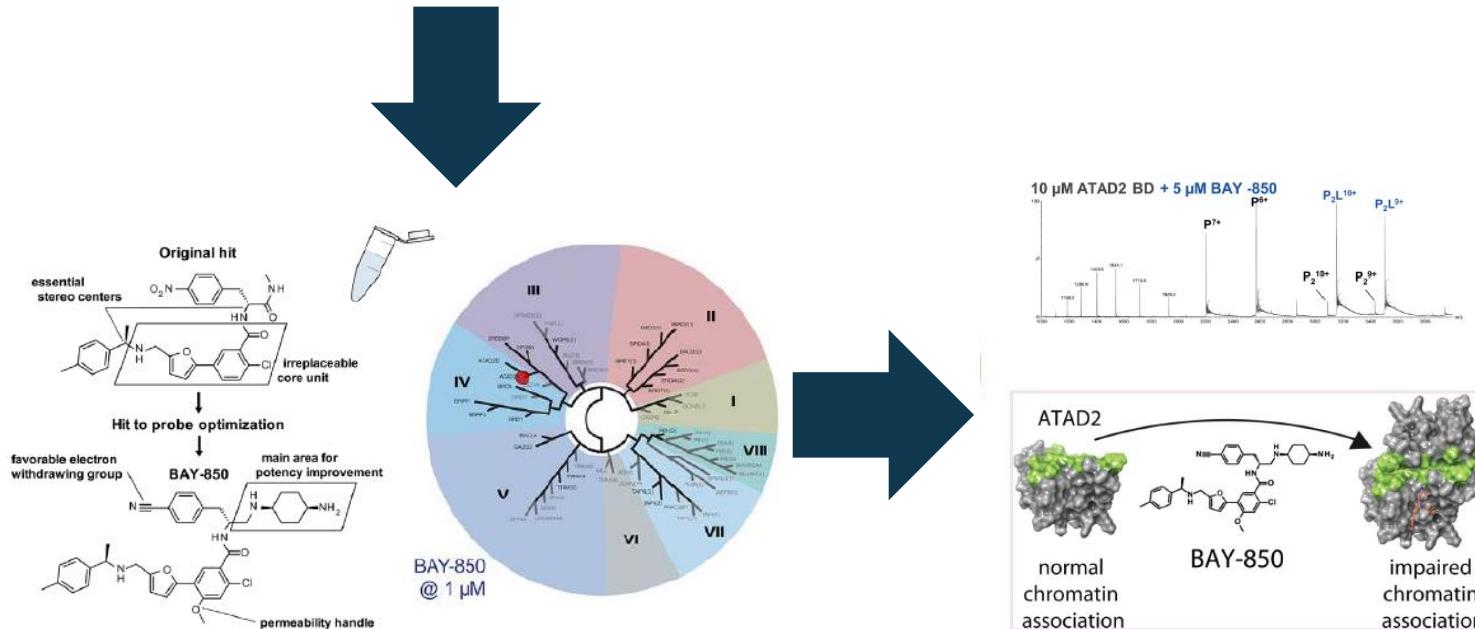
## Integrated Genomic Analysis of the 8q24 Amplification in Endometrial Cancers Identifies ATAD2 as Essential to MYC-Dependent Cancers

Maria B. Raeder, Even Birkeland, Jone Trovik, Camilla Krakstad, Shyemaa Shehata, Steven Schumacher, Travis I. Zack, Antje Krohn, Henrica MJ. Werner, Susan E. Moody, Elisabeth Wik, Ingunn M. Stefansson, Frederik Holst, [...],

Helga B. Salvesen

[ view all ]

Published: February 5, 2013 • <https://doi.org/10.1371/journal.pone.0054873>



ATAD2 is a driver and a therapeutic target in ovarian cancer that functions by upregulating CENPE

Praveen Guruvaiah, Suresh Chava, Chiao-Wang Sun, Nirupama Singh, Courtney A. Penn & Romi Gupta

*Cell Death & Disease* 14, Article number: 456 (2023) | [Cite this article](#)

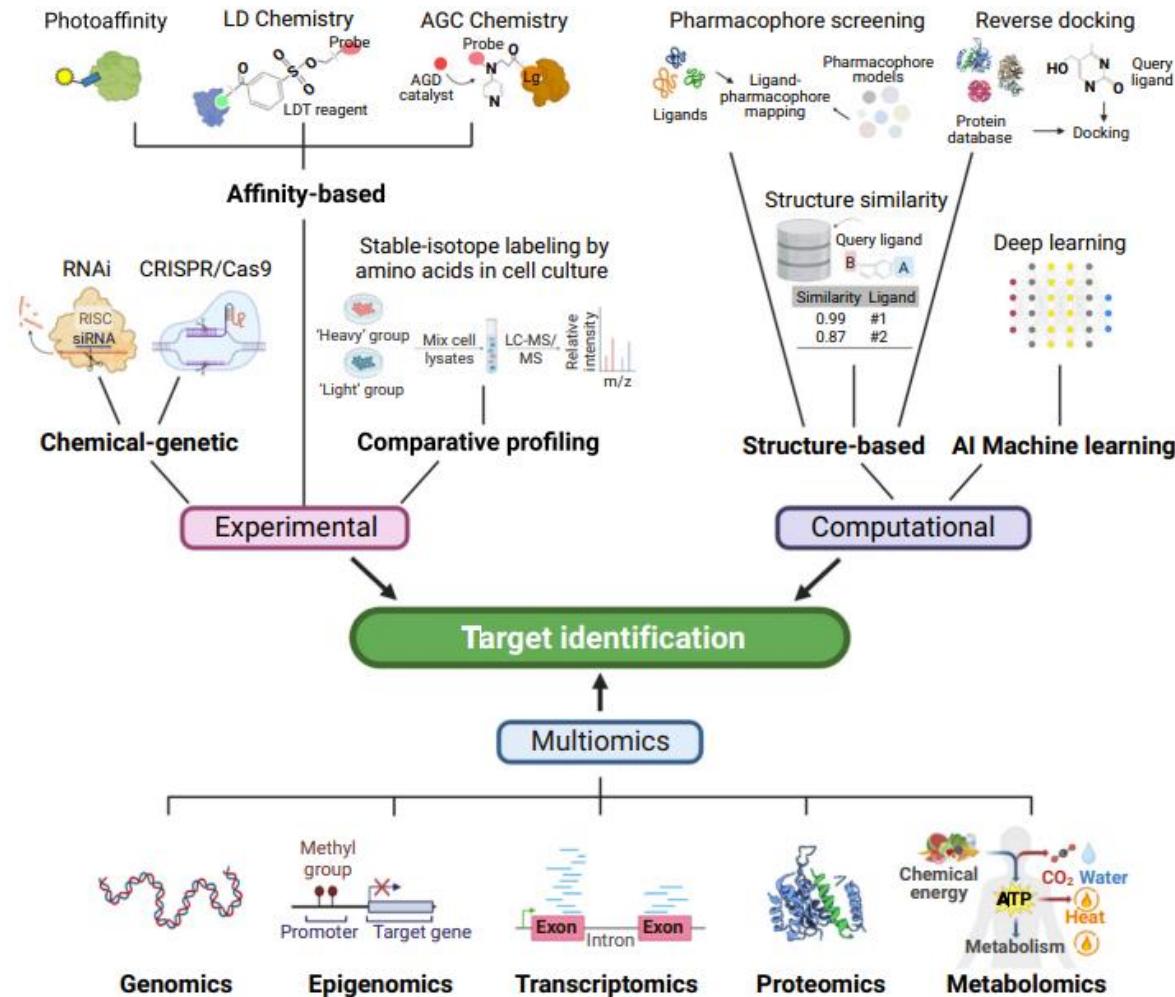
1118 Accesses | 1 Citations | 6 Altmetric | [Metrics](#)

active on the nontransformed and cancer cells (Figure 4E). Thus, we concluded that the cytotoxic effects displayed by BAY-850 cannot be unmistakably linked to ATAD2 BD inhibition. Further evidence for a disconnect between the observed growth inhibition and the inhibition of ATAD2 BD was provided by gene expression studies, in which BAY-850 treatment did not affect the expression of some of the previously identified ATAD2 target genes<sup>11,12</sup> (Supporting Information Figure 7). Consistently, other recently published ATAD2 BD inhibitors also failed to demonstrate significant effects on target gene expression and cancer cell survival below 20  $\mu$ M despite engaging ATAD2 BD in living cells.<sup>8</sup> Potential

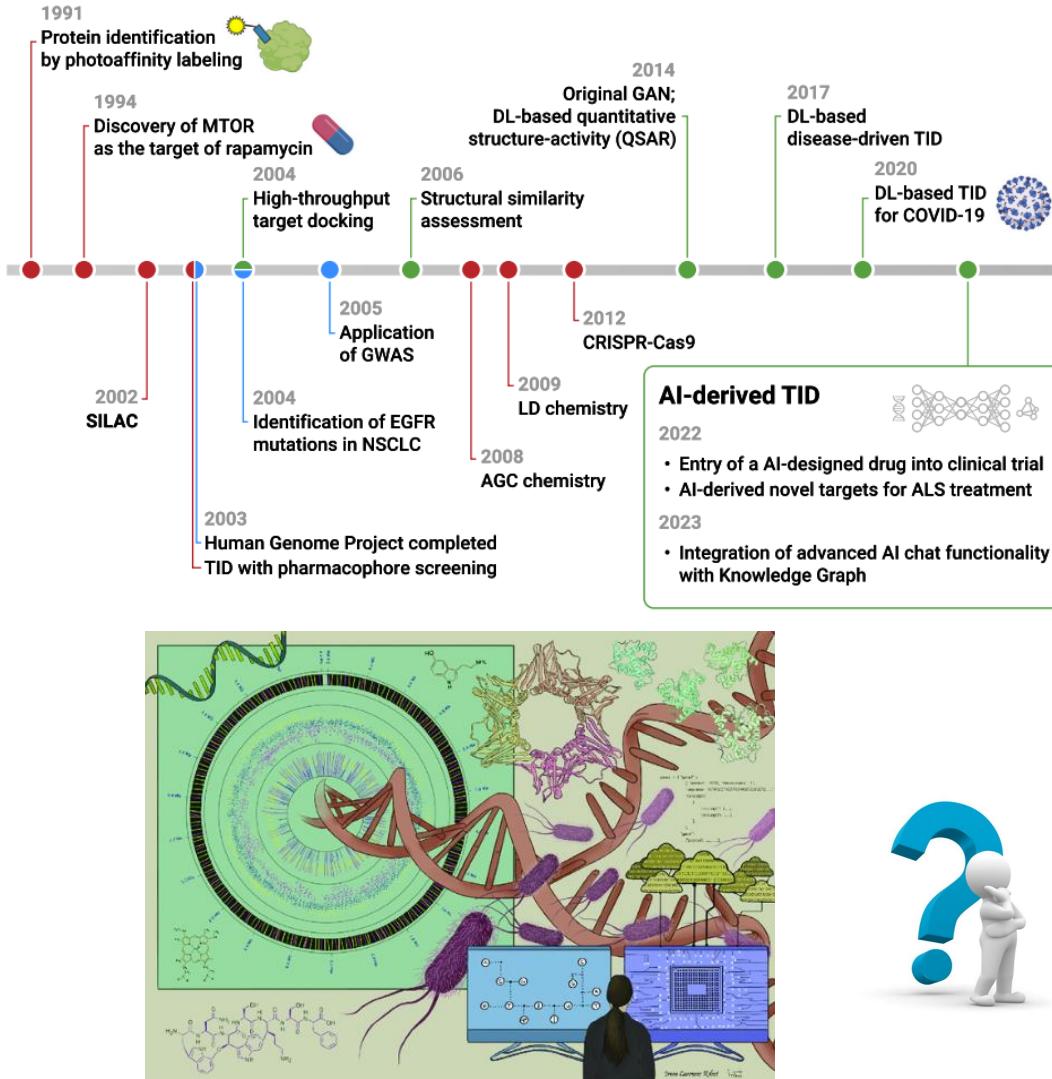


Are there modern ways to find drug targets?

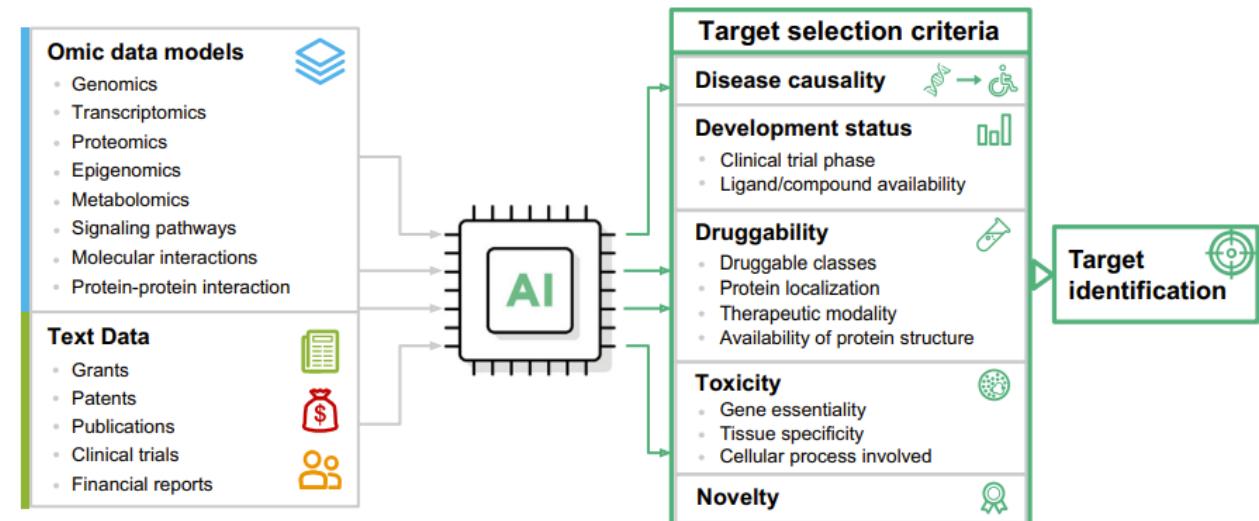
# Modern Chemical Biology tools offer a flexible for Target Discovery



# AI might play an important role to deal with the complexity of PhenOMICs data

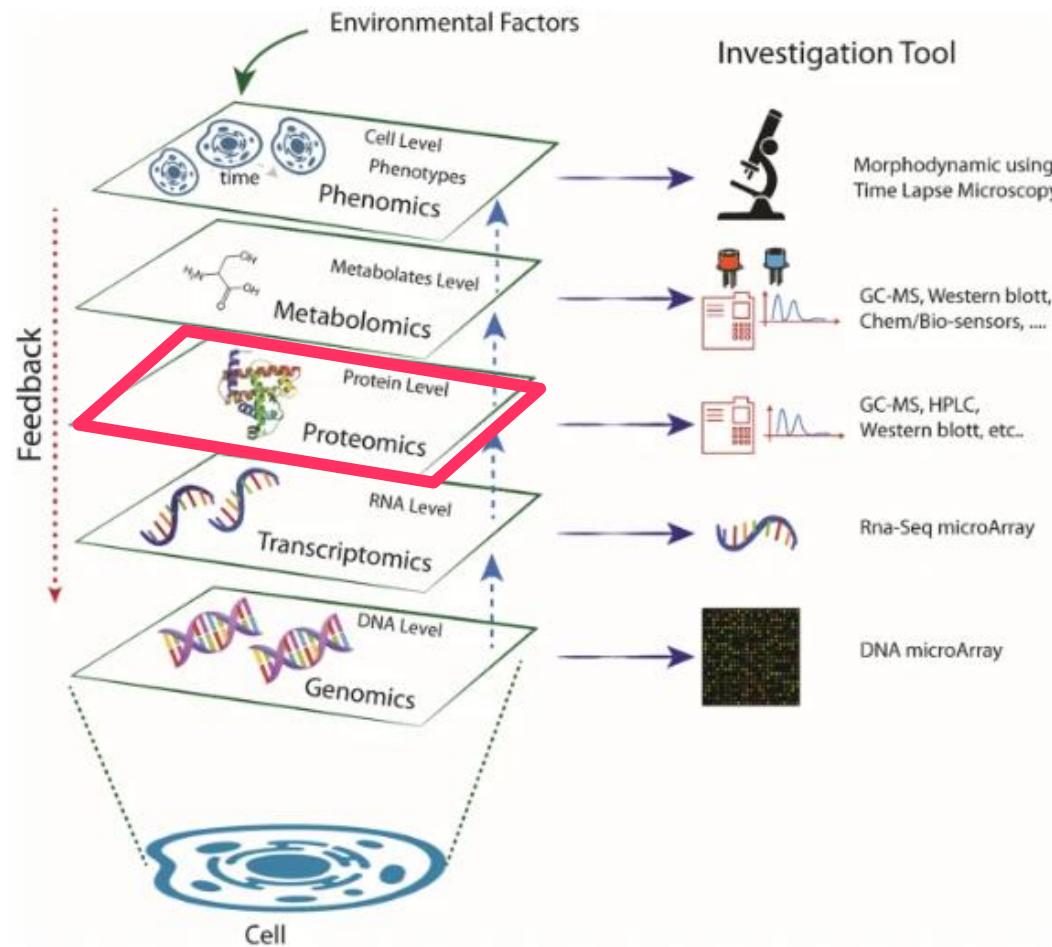


## Workflow of artificial intelligence (AI)-driven target discovery

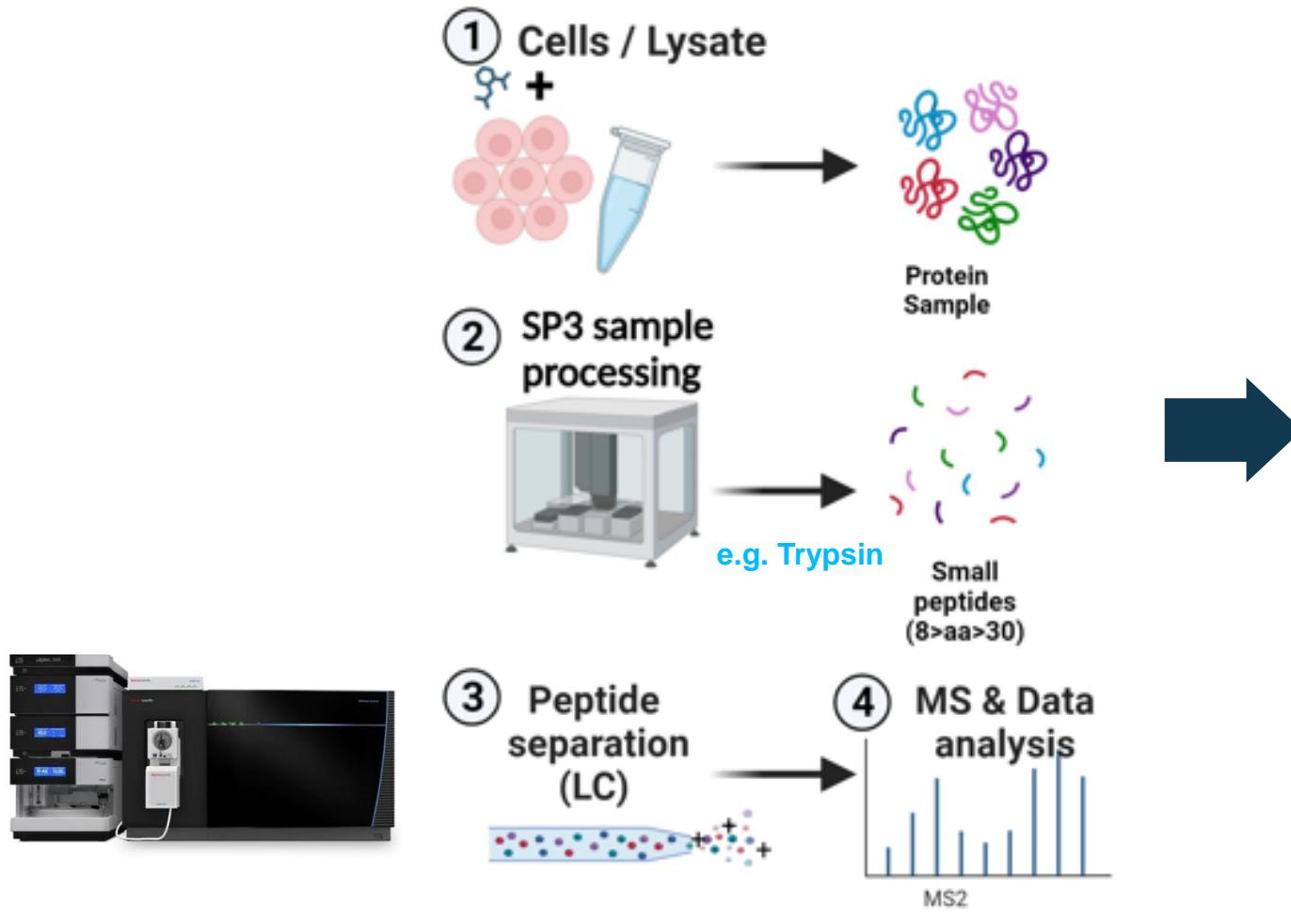


# Overview PhenOMICs tools - Use case example Proteomics

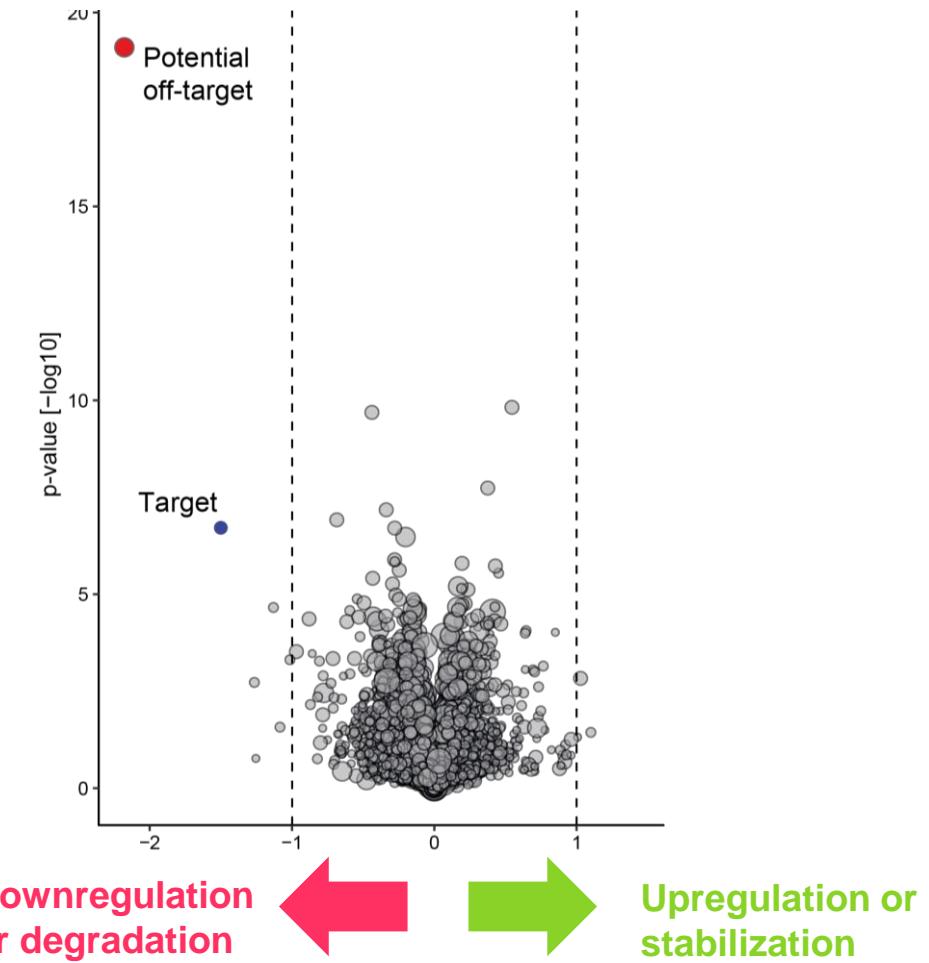
*„Analysis of genetic, disease associated and/or modality mediated effects on relevant biological systems with image-based, functional genomics, sequencing and mass spectrometric methods“*



# PhenOMICs Tools – Overview Proteomics

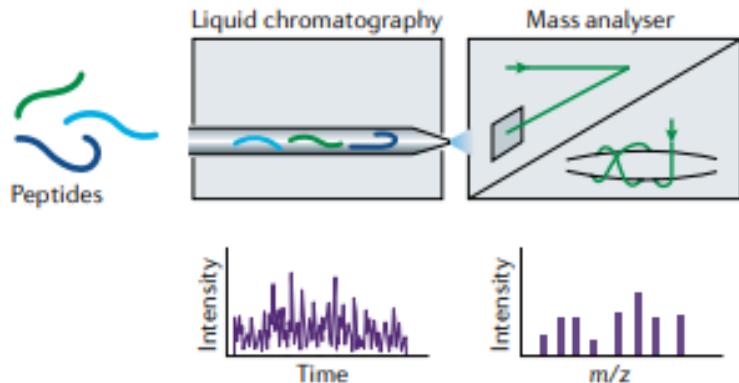


Data representation: Vulcano-Plot

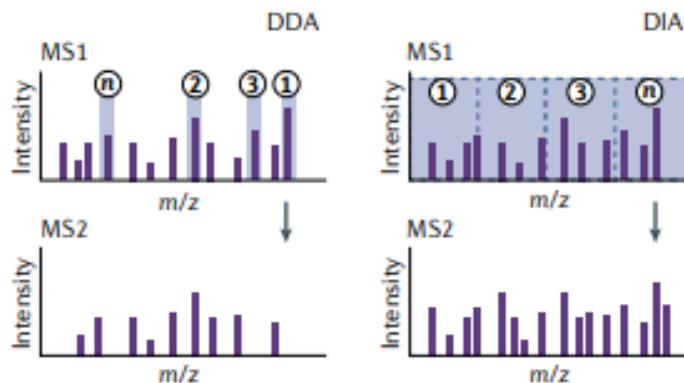


# Proteomics workflows and their technological improvements

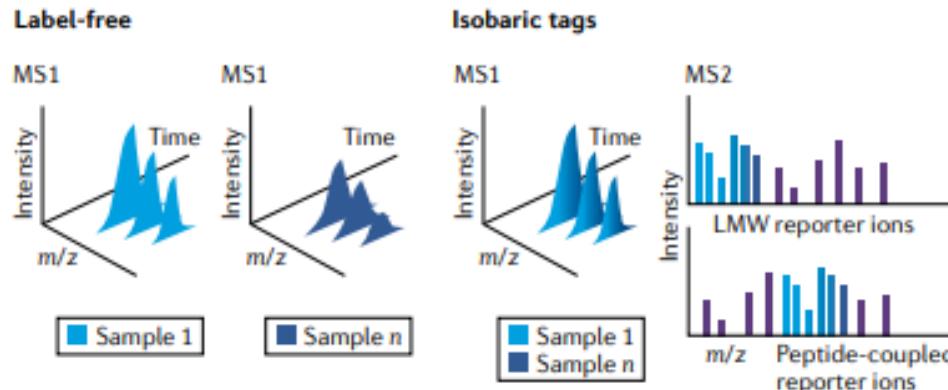
## a LC-MS/MS



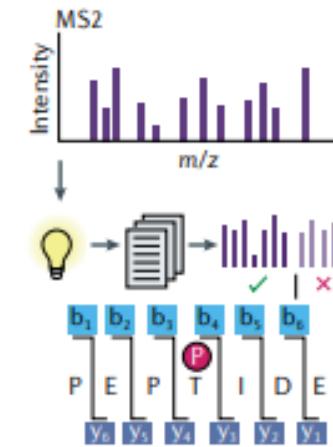
## b Acquisition



## c Quantification



## d Identification



## Vocabulary:

DDA: Data Dependent Acquisition  
→ Fragmentation of the most intense  
→ peptide mode in MS1

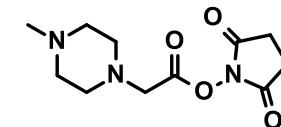
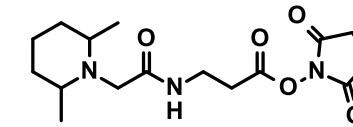
DIA: Data independent acquisition  
→ Fragmentation of all peptide  
→ precursors in a narrow window in MS1

TMT: tandem mass tag

→ e.g. TMT18 (18 Isotopes)

ITRAQ: Isobaric tags for relative  
and absolute quantification

SILAC: stable isotope labeling by/with  
amino acids in cell culture

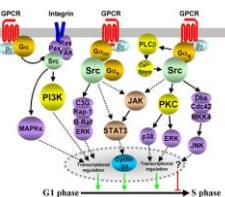


# Chemoproteomics – A short overview

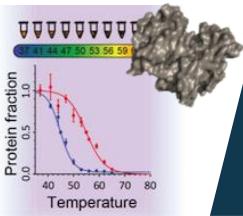
- // (Chemo-)Proteomics allows the **qualitative and quantitative** analysis of **protein expression patterns** in large scale by mass spectrometry (before and after chemical modulation)
- // **Significant technological improvements** in the last decade → analysis and quantification of >8000 proteins possible with reduced sample amounts and measurement times
- // Fast **evolving field** → chemoproteomics, tissue proteomics, single cell proteomics, phosphoproteomics

## For State of the Art Applications

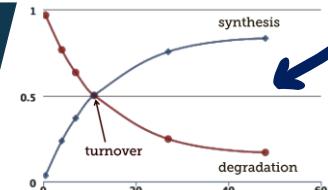
... as broad applicable **target validation tool** (complementary to genomics data)



... to support phenotypic screens by identifying **novel targets & protein-protein interaction networks**



... to prove target engagement, e.g. by measuring **protein degradation** levels of PROTACs

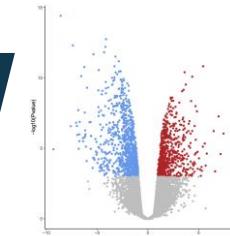


## For Visionary Applications

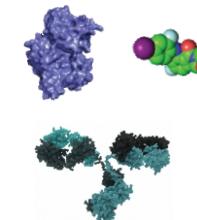
... to analyse **healthy vs. disease state**, e.g. quality check for disease hypothesis/models



... for a **better characterization** of assets, e.g. off-targets, biomarkers ...

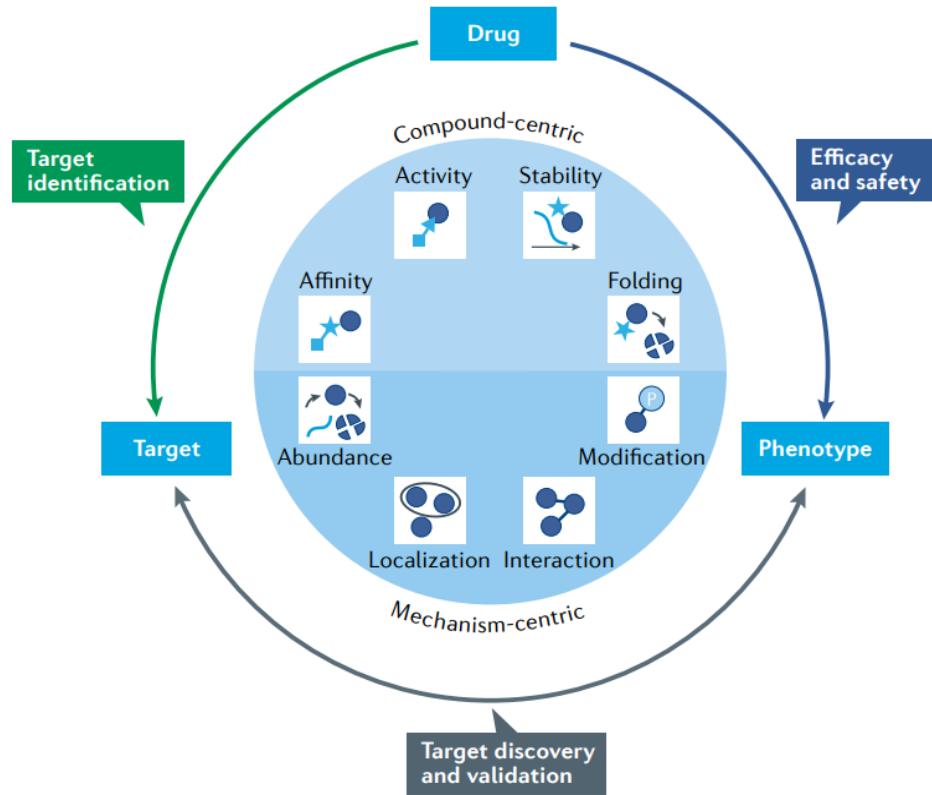


... to screen for **novel lead structures** for currently undruggable targets

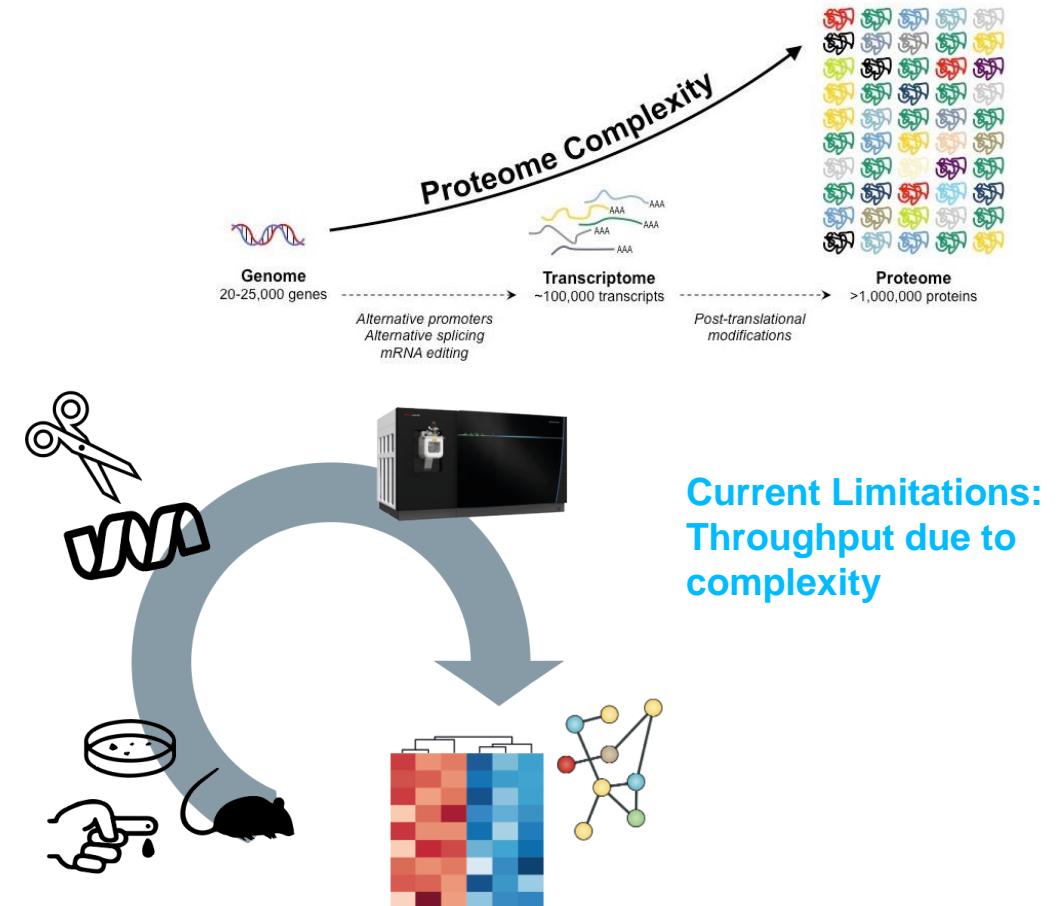


# Proteomics tools are the currently most impactful tool in the Chemical Biology field

## Proteomics applications in the preclinical drug discovery process



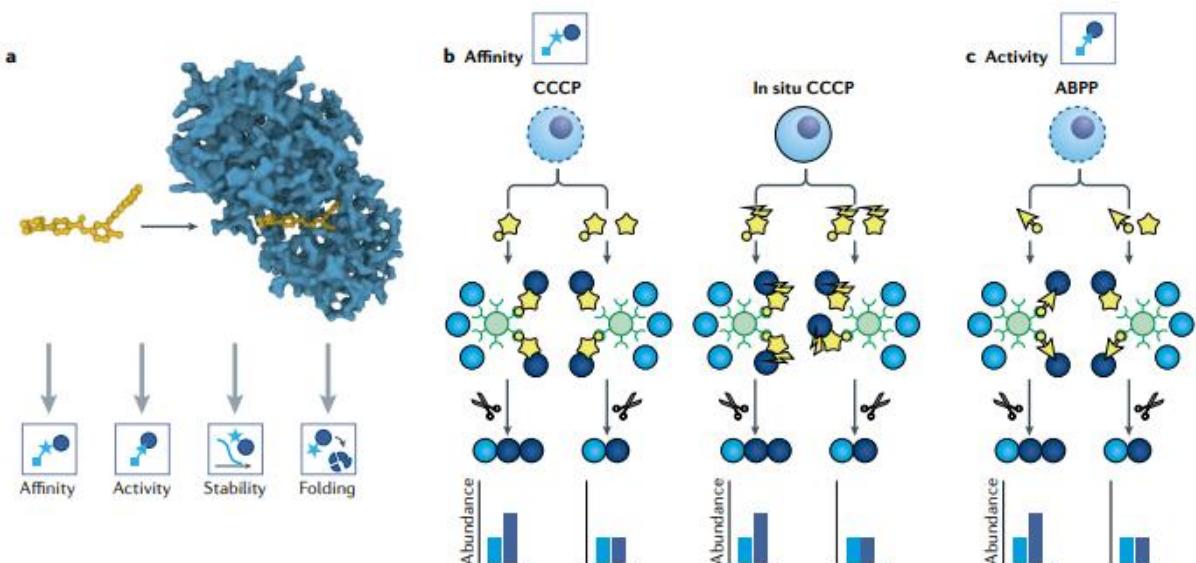
## Proteomics enables characterization of the complex human proteome



**Current Limitations:**  
Throughput due to complexity

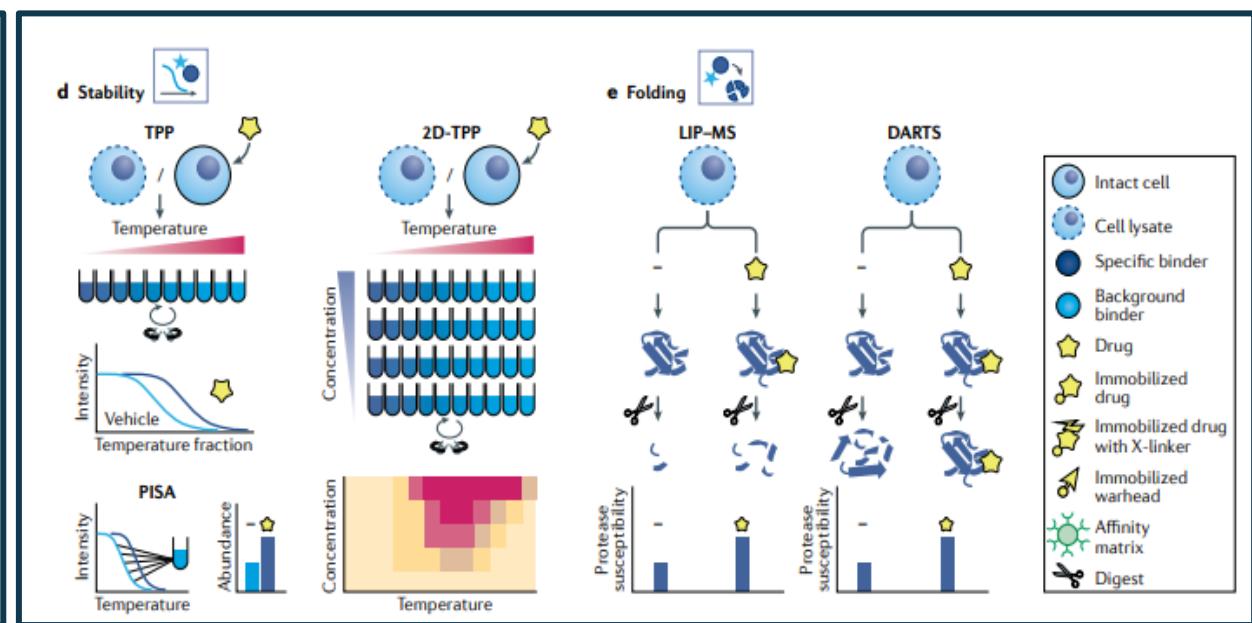
# Overview: Chemoproteomics Use Cases in Drug Discovery

## Affinity and Activity Methods



CCCP = Compound-Centric Chemical Proteomics  
ABPP = Affinity/Activity based Protein Profiling

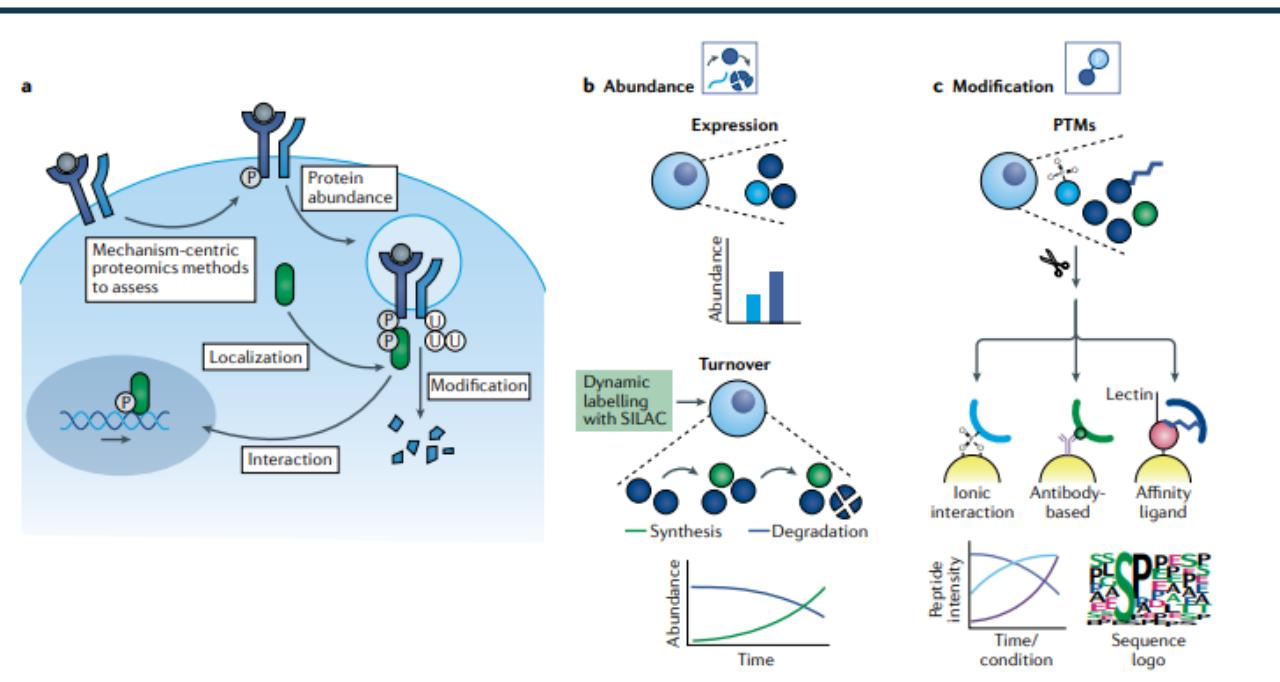
## Stability and Folding Methods



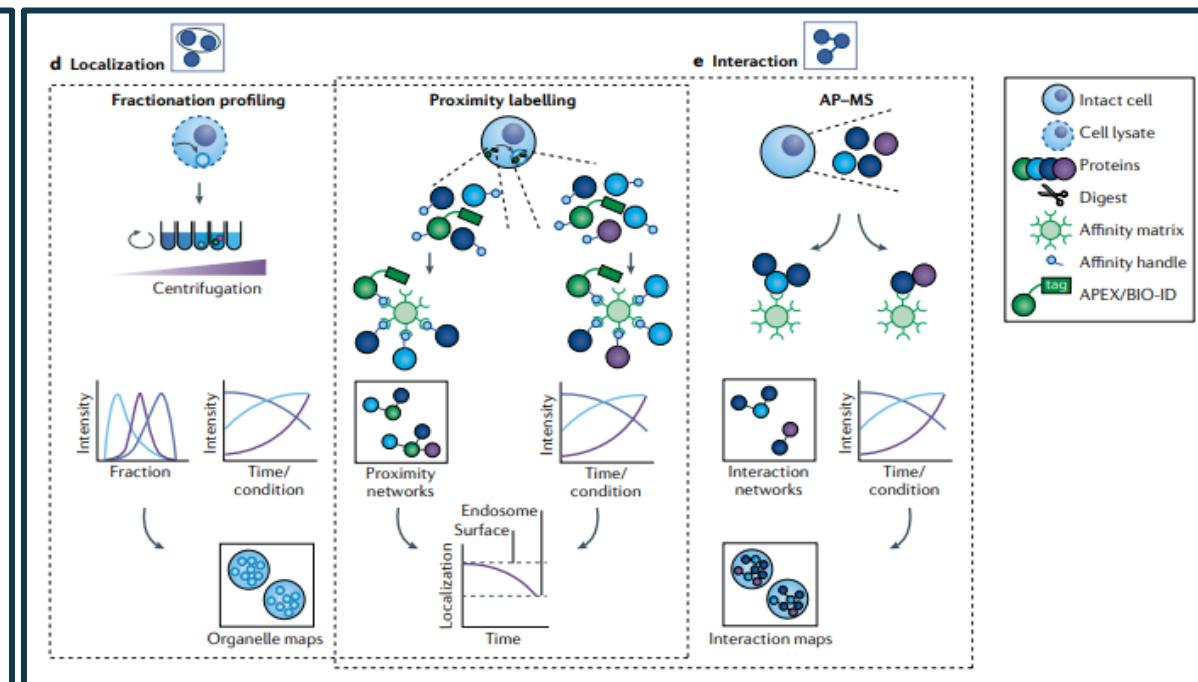
TPP = Thermal Proteome Profiling  
LIP-MS = Limited Proteolysis coupled to Mass spectrometry  
DARTS = Drug affinity responsive targets stability

# Overview: Chemoproteomics Use Cases in Drug Discovery

## Expression and Modification Methods



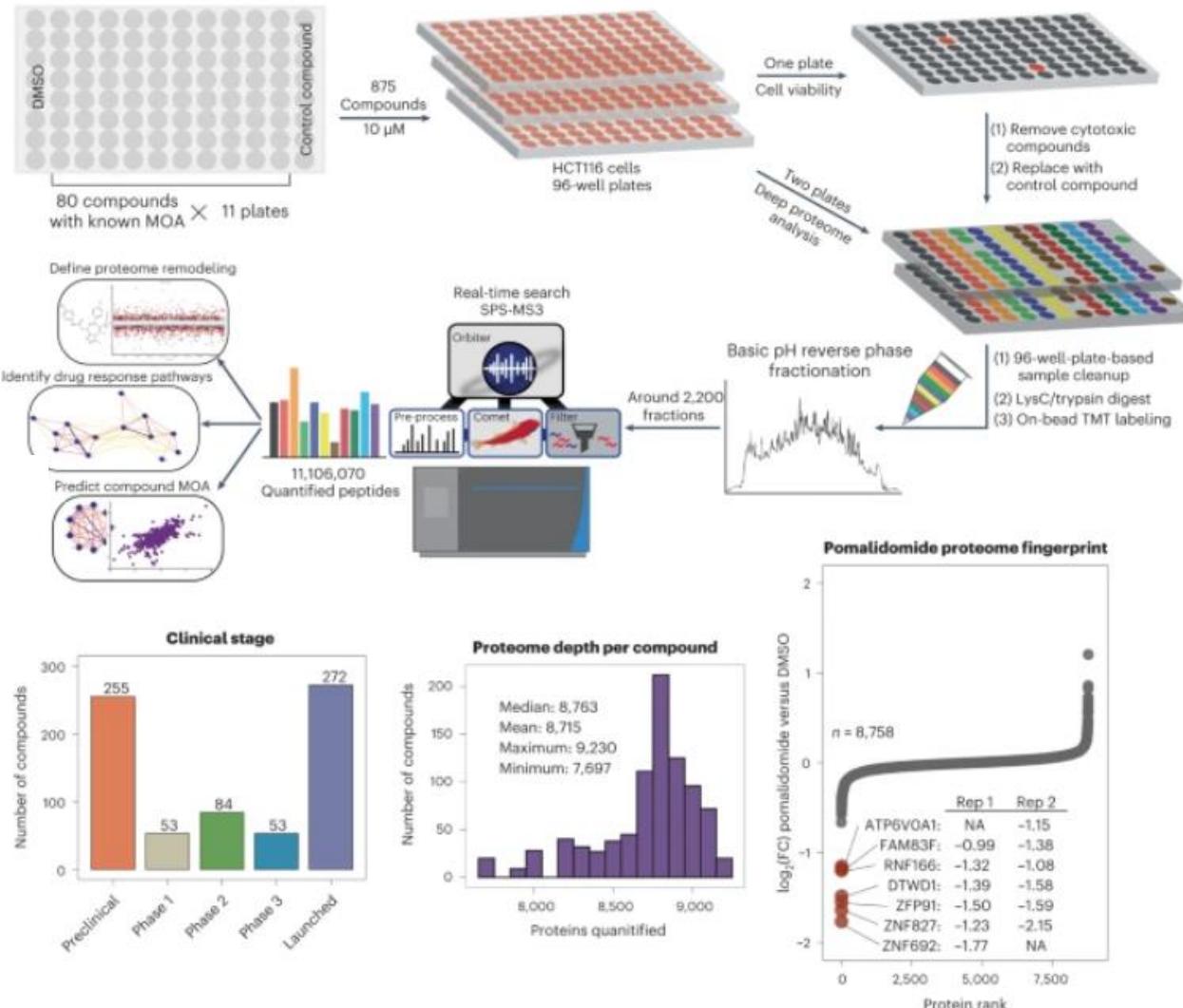
## Localization and Interaction Methods



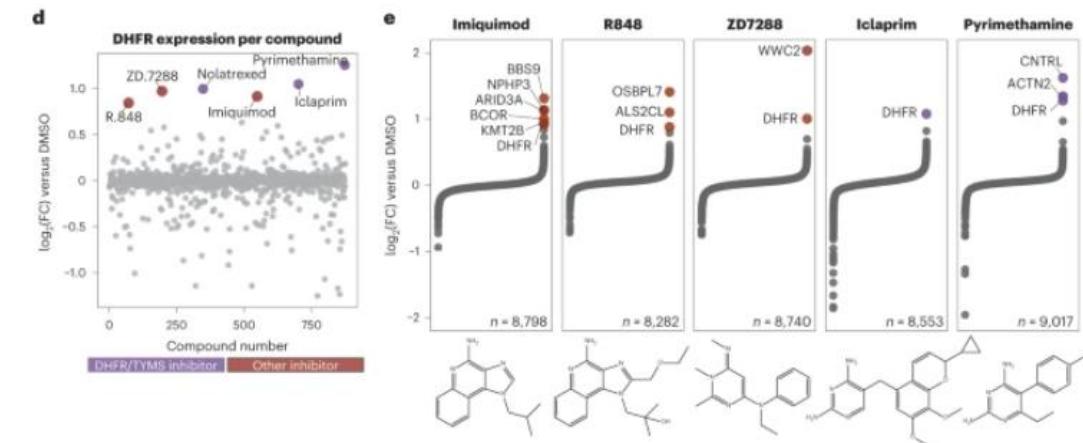
PTM = Post translational modification

AP-MS = Affinity Purification Mass Spectroscopy

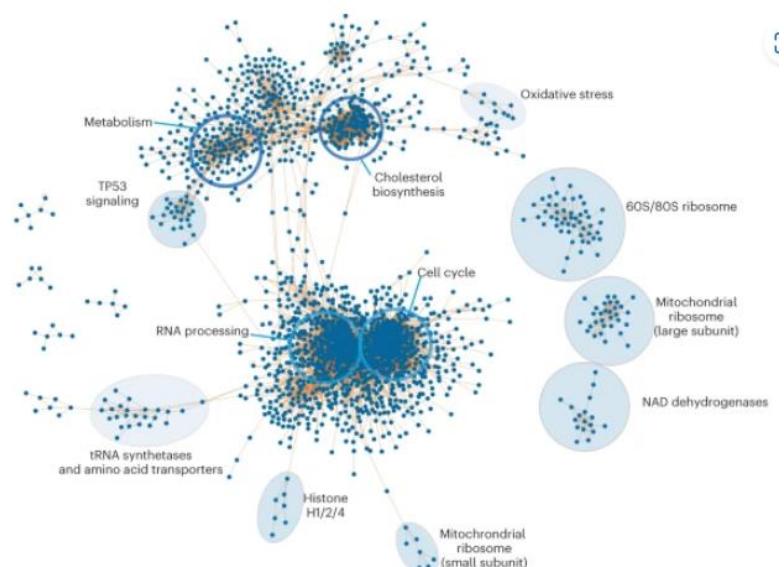
# Currently largest study: A proteome-wide fingerprinting atlas of drug mechanism of action



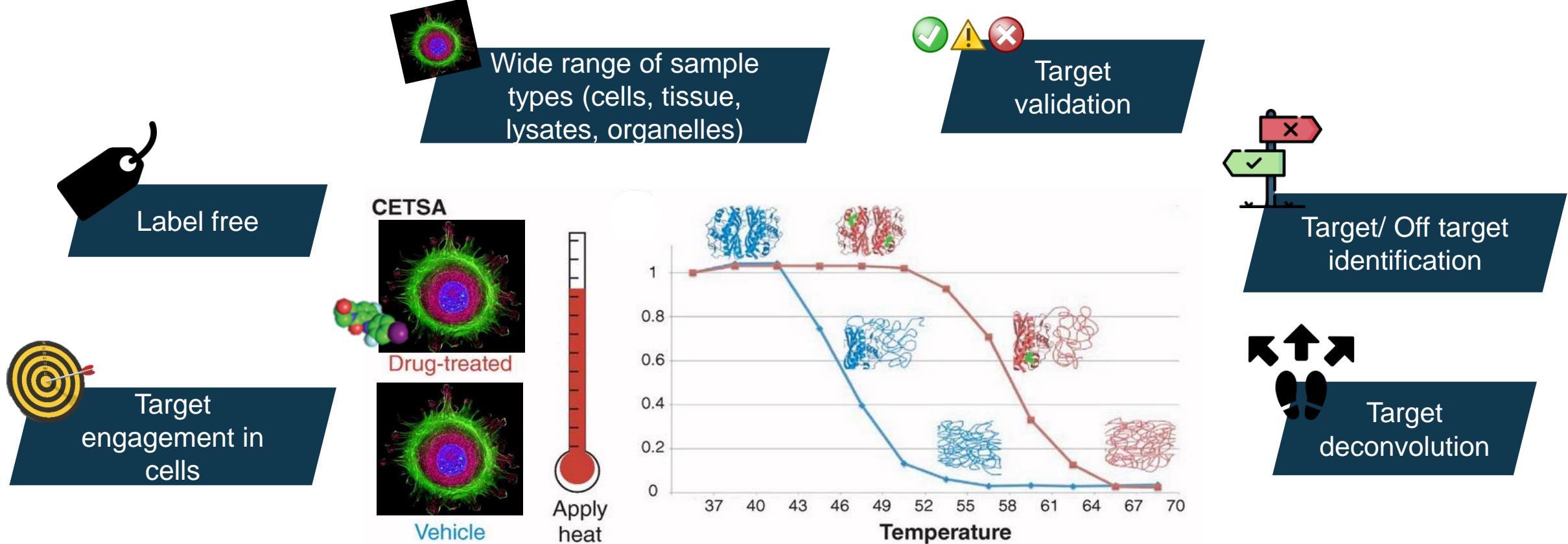
## Example: DHFR expression modulators



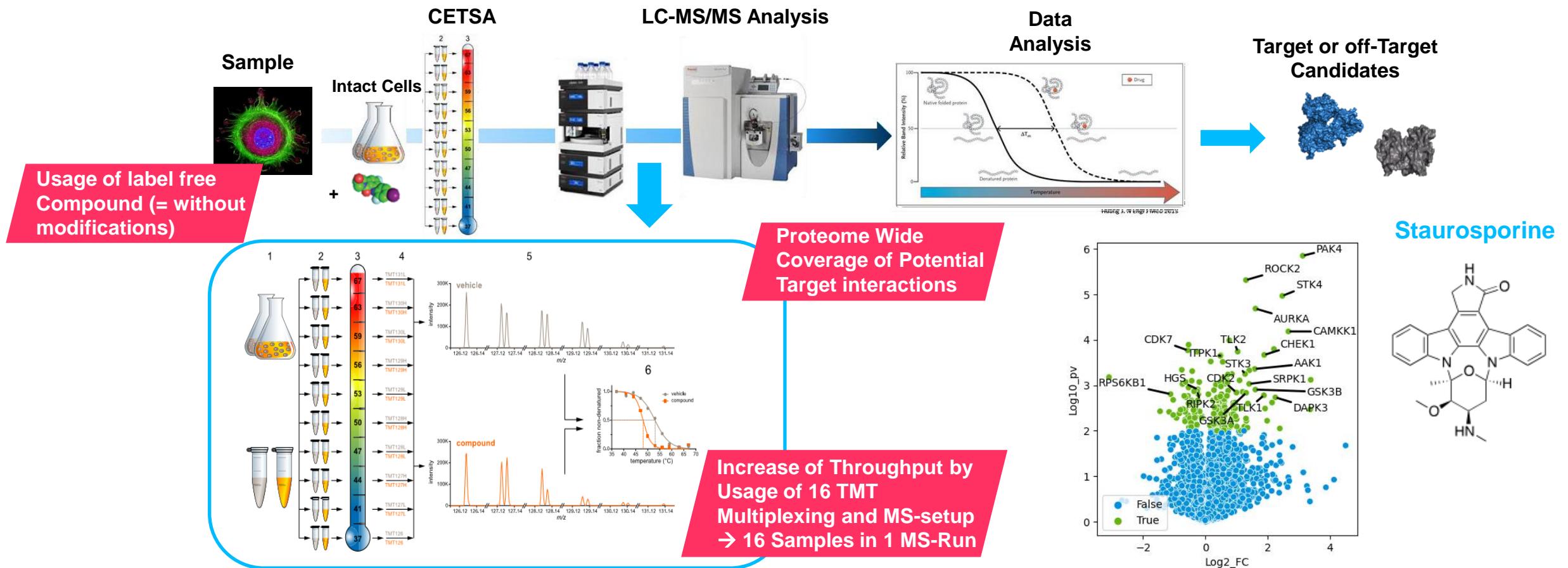
## An atlas allows proteome wide compound clustering



# Examples for advanced Chemoproteomics tools: Target engagement and deconvolution by Cellular Thermal Shift Assays (CETSA)

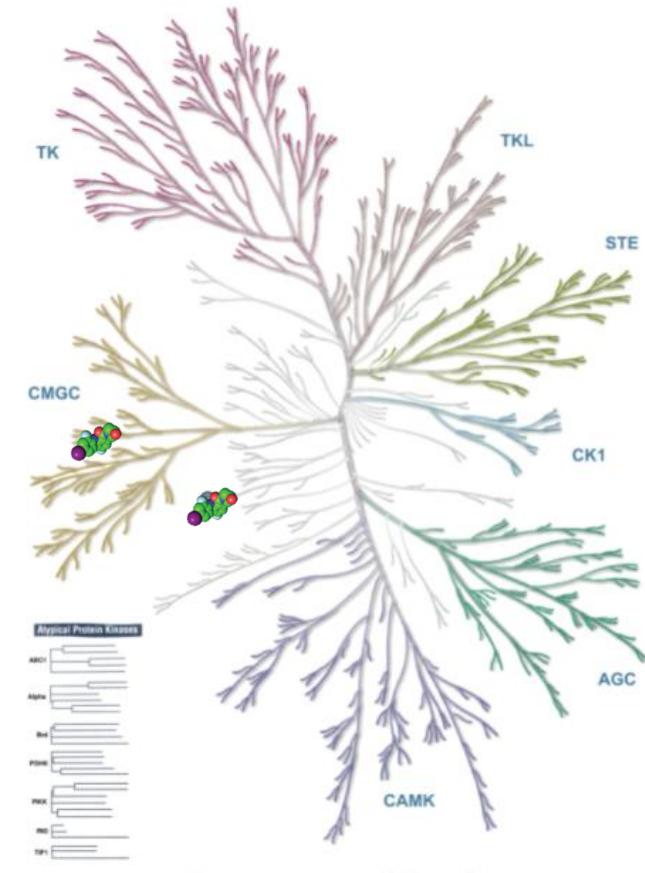
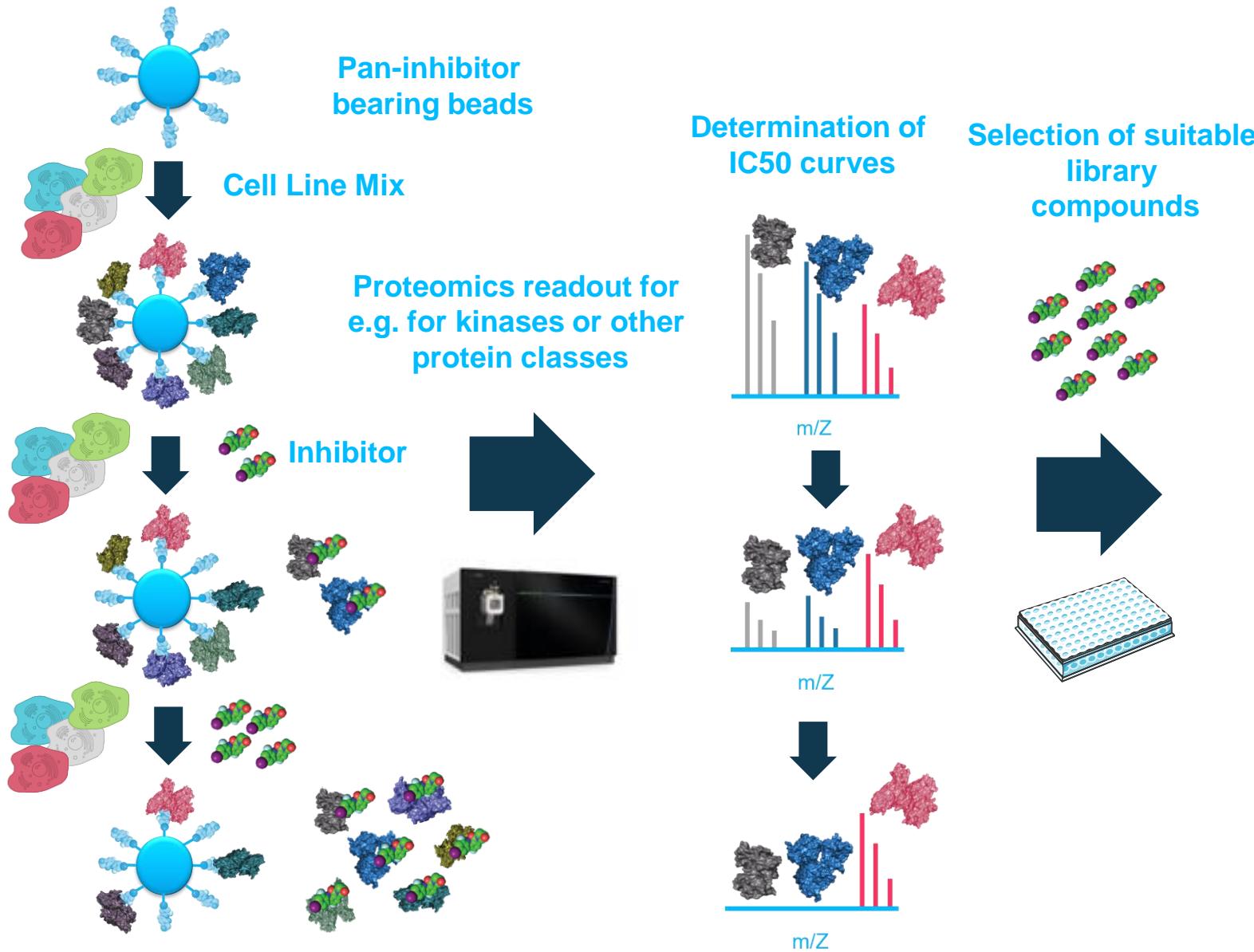


**Basic Principle :** Heating of cells with subsequent **quantification of the presence of target protein** in the soluble fraction by a broad **variety of detection methods** (e.g. Western Blot or Mass spectrometry)



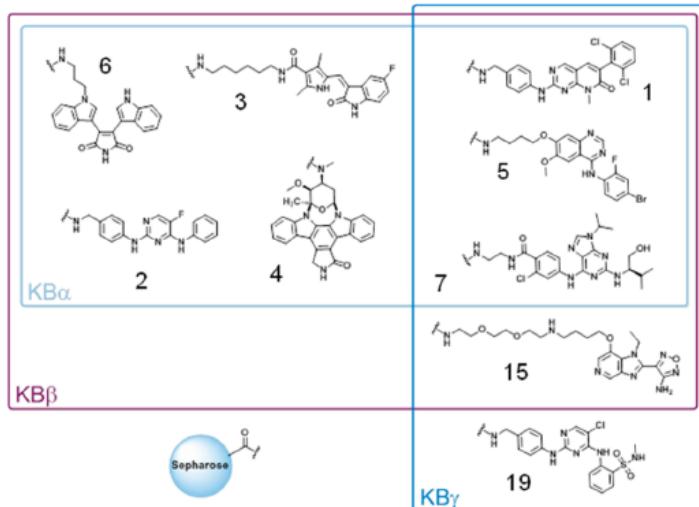
- // The difference in thermal stability can be used to monitor protein-drug interactions across the whole proteome in living cells or lysates enabling target engagement in an unbiased way
- // CETSA MS allows the identification of markers for drug efficacy and toxicity as well as

# Chemoproteomics based screens – Basic Principle

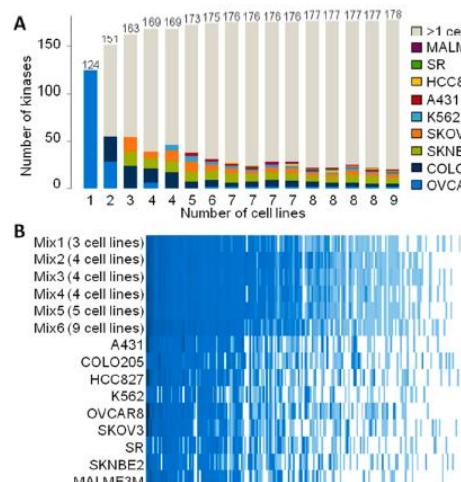


# Chemoproteomics Example – The KinoBead Technology

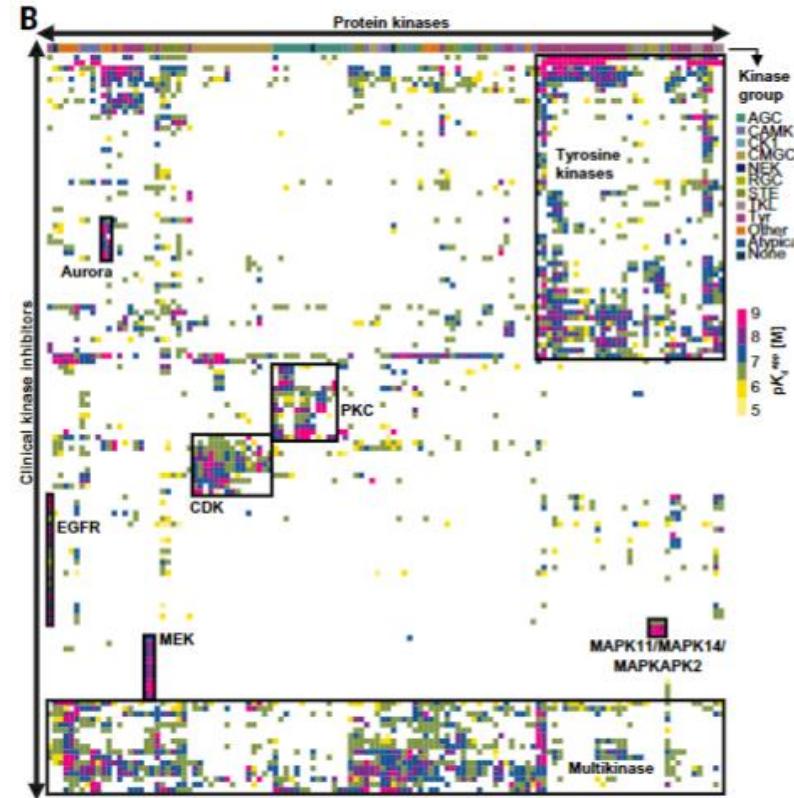
## Examples for the Pan-Kinase Inhibitors



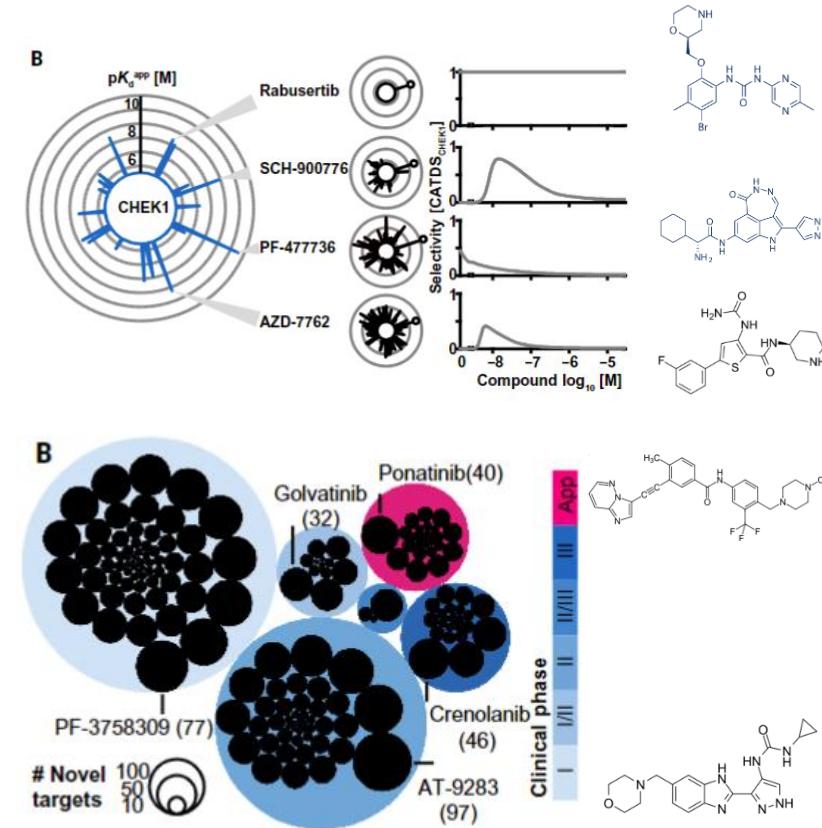
## Optimization of the cell line mixtures



## Profiling of clinical Kinase Inhibitors on Scale



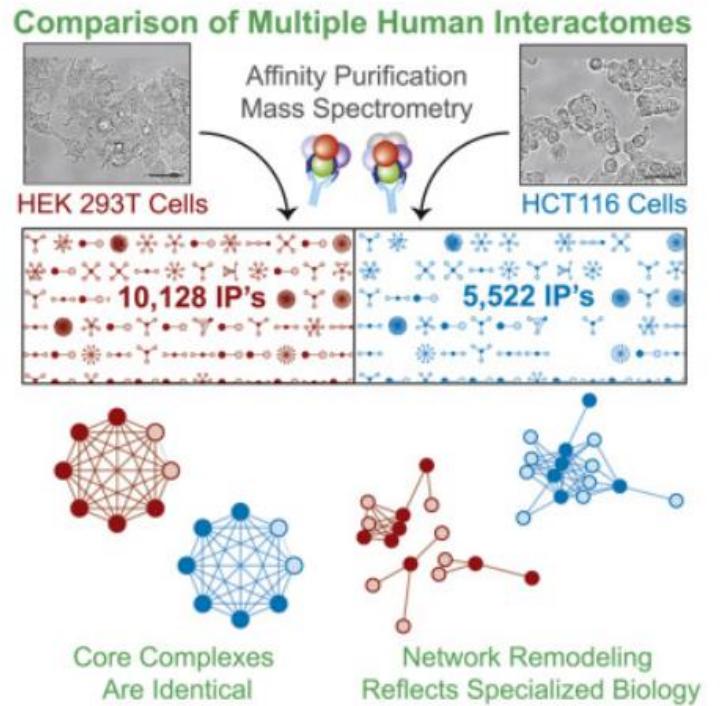
**Outcome: Several off-targets were not known before and might reflect clinical success rate**



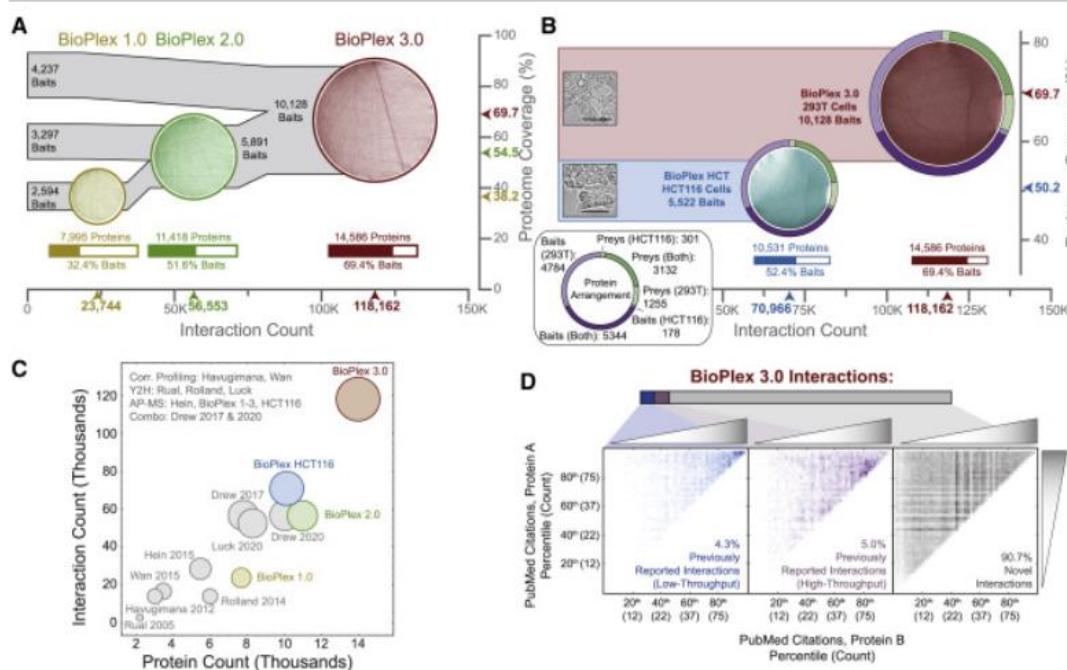
M. Bantscheff et al., *Nat. Biotechnol.* **2007**, 25, 1035-1044.  
G. Médard et al., *J. Proteome Res.* **2015**, 14, 1574-1586.  
S. Klaeger et al., *Science* **2017**, 358, 4368.

# Proteomics based interactome analysis: Bioplex database

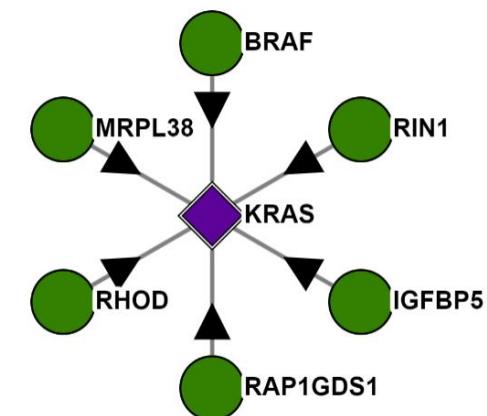
## Immunoprecipitation setup:



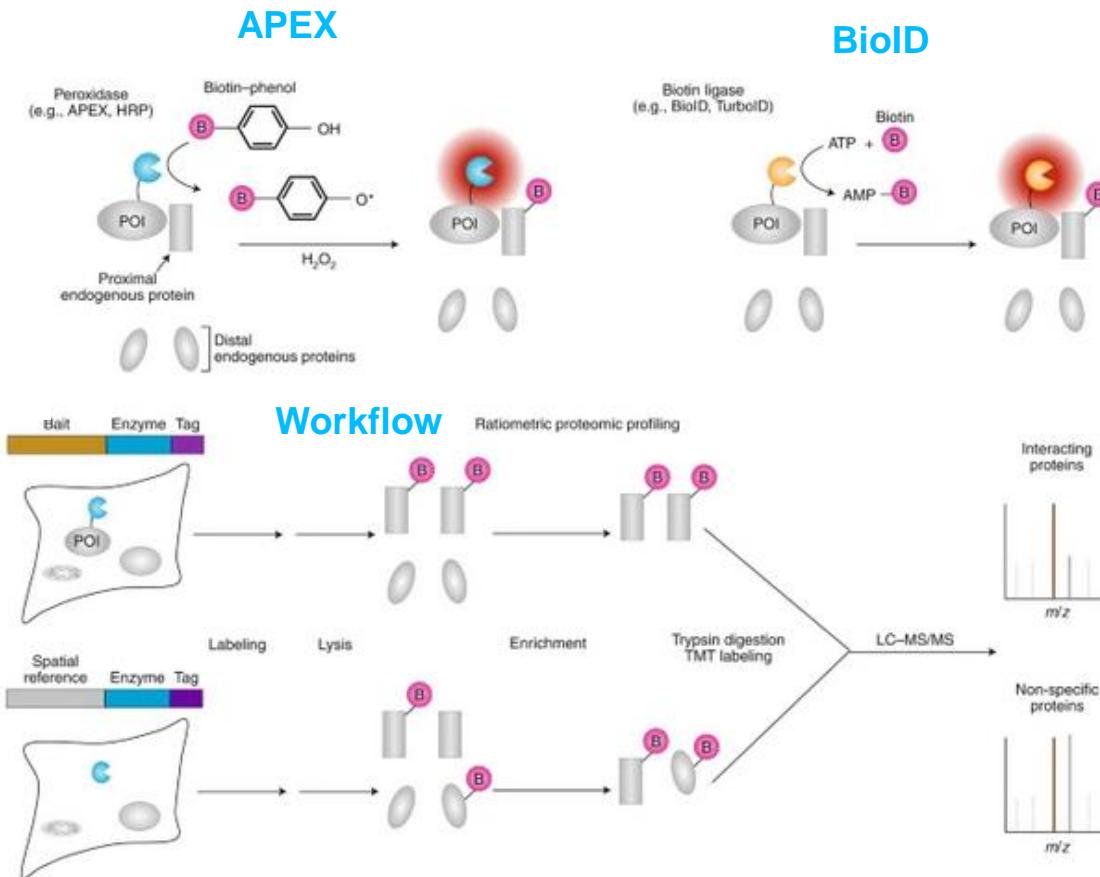
## Bioplex database construction:



## Example: KRAS



# Unraveling Interactomes by Proximity Labeling

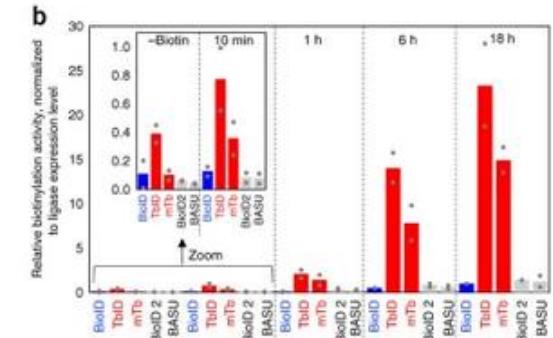
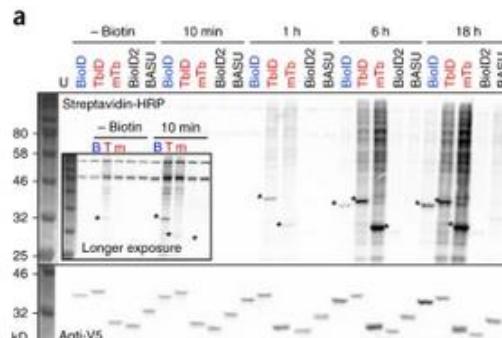


## TurboID: Tool improvements via protein engineering

### Directed evolution of TurboID.



### Characterization of TurboID and miniTurbo in mammalian cells.



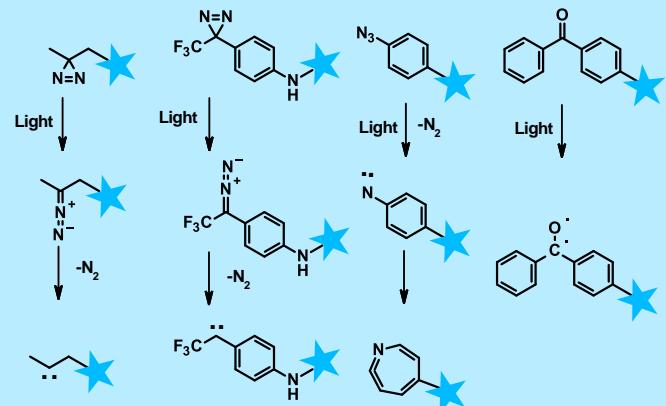
Proximity Labeling needs a fusion of an APEX or Biotin ligase tag to the POI (Protein of interest) and allows a Chemoproteomics analysis of the labeled proteins



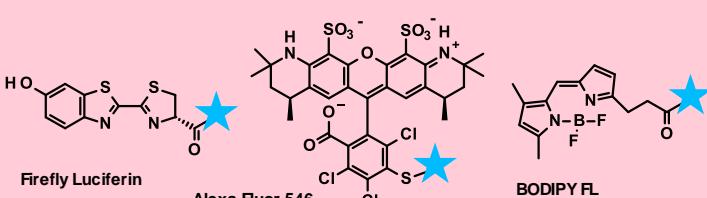
# **The Central Element for Chemical Biology: development of the right Chemical Probing concepts**

# Overview: Chemical Biology Probe Chemistry

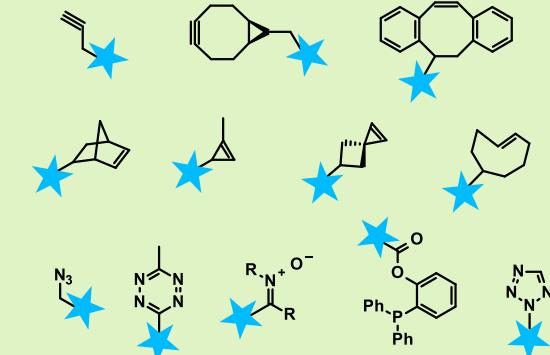
## Photoreactive Probes



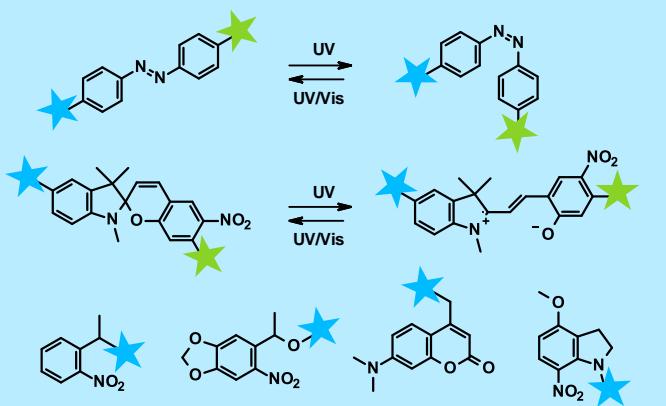
## Fluorescence Groups



## Bioorthogonal Click-Groups

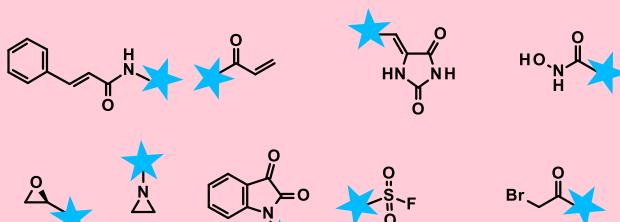


## Photoswitches & Photocages

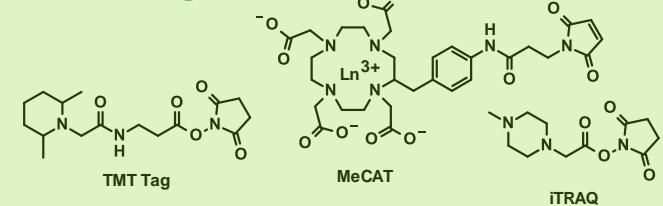


# Chemical Biology Probe Molecules

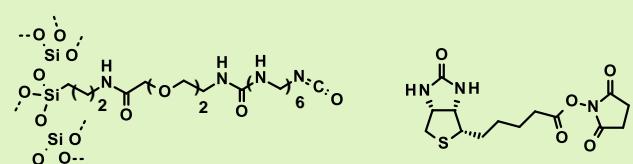
## Warheads



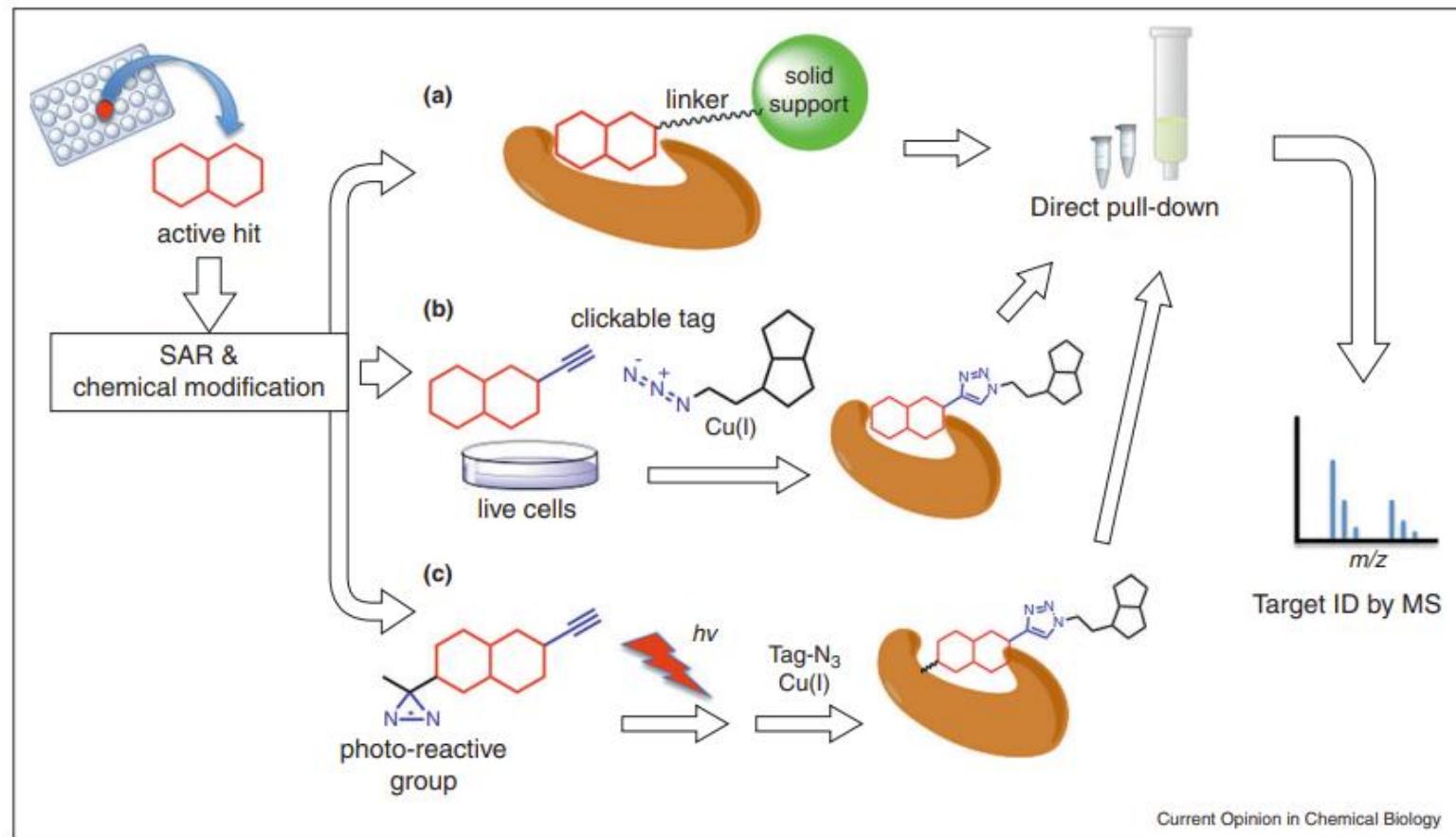
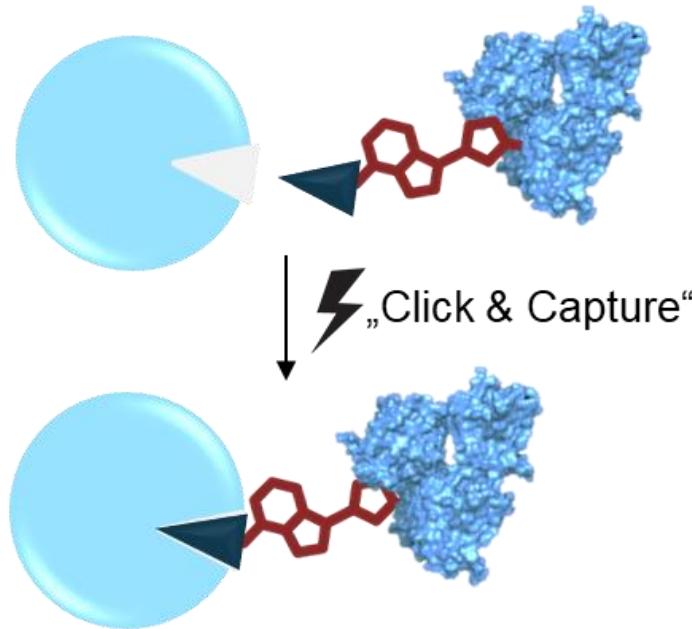
## MS/MS-Tags



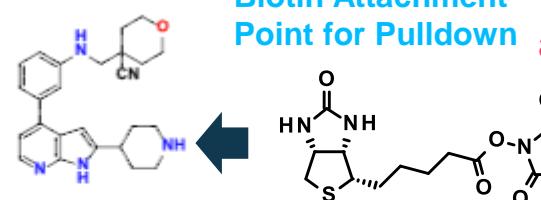
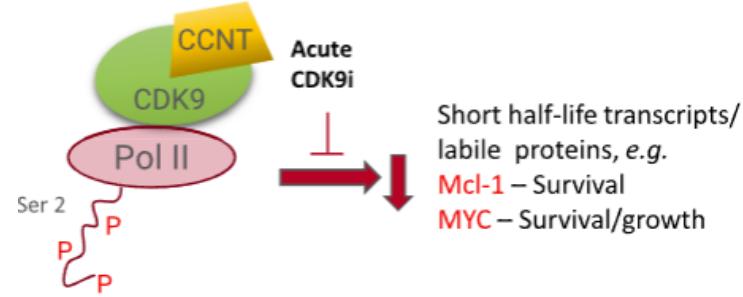
## Immobilization



# Pulldown/Affinity Proteomics – Basic Principle

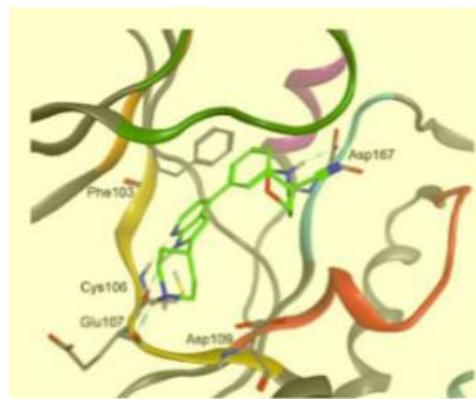


# Example for classical Affinity Proteomics – Astra Zeneca CDK 9 program

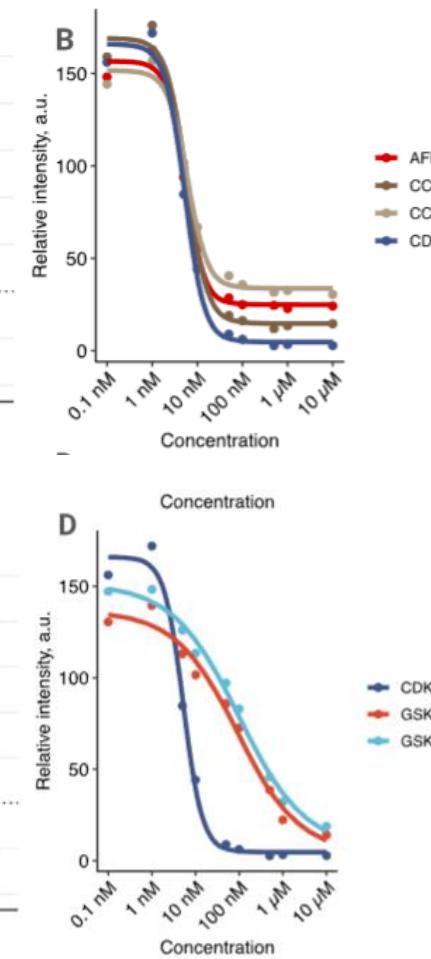
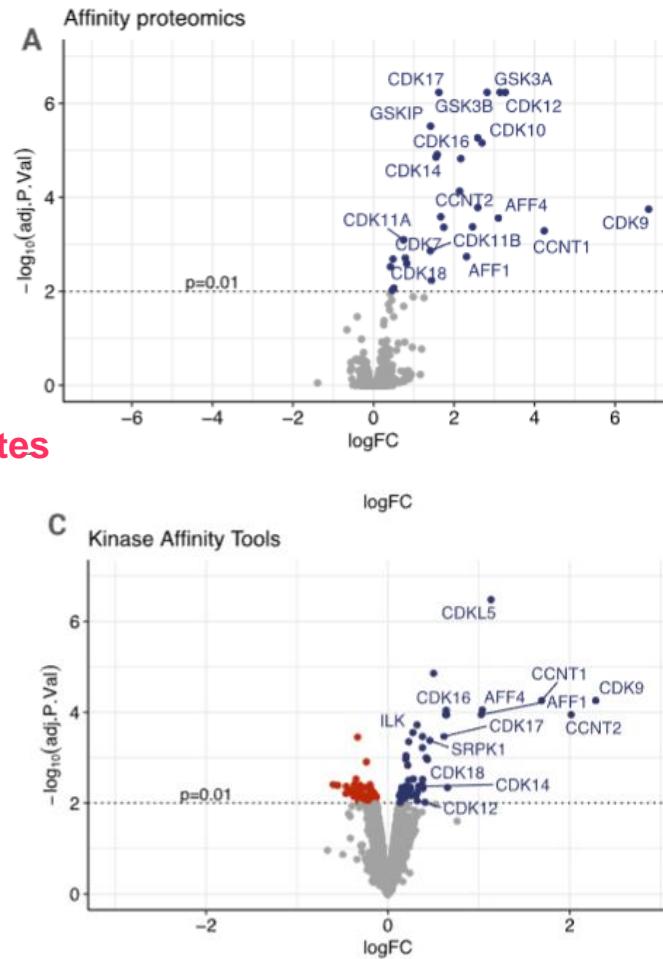


Biochemical Assay	Potency
Km ATP	< 3 nM
5 mM ATP	< 3 nM

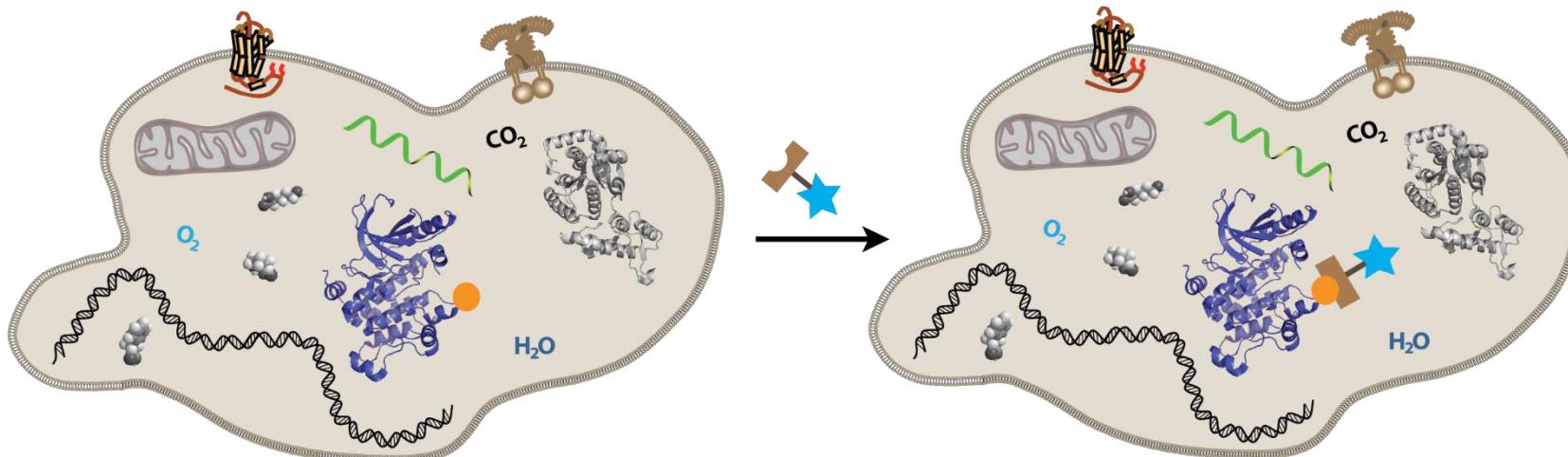
!!! SAR understanding for  
Probe design is crucial



The Affinity pulldown results is way broader than a Kinase profiling



# Bioorthogonal and Click Chemistry – Basic principle



● and ■ react without interfering with native biochemical processes

★ additional molecular probe

Carolyn R. Bertozzi

“for the development of click chemistry and bioorthogonal chemistry”

Morten Meldal

“for the development of click chemistry and bioorthogonal chemistry”

K. Barry Sharpless

“for the development of click chemistry and bioorthogonal chemistry”

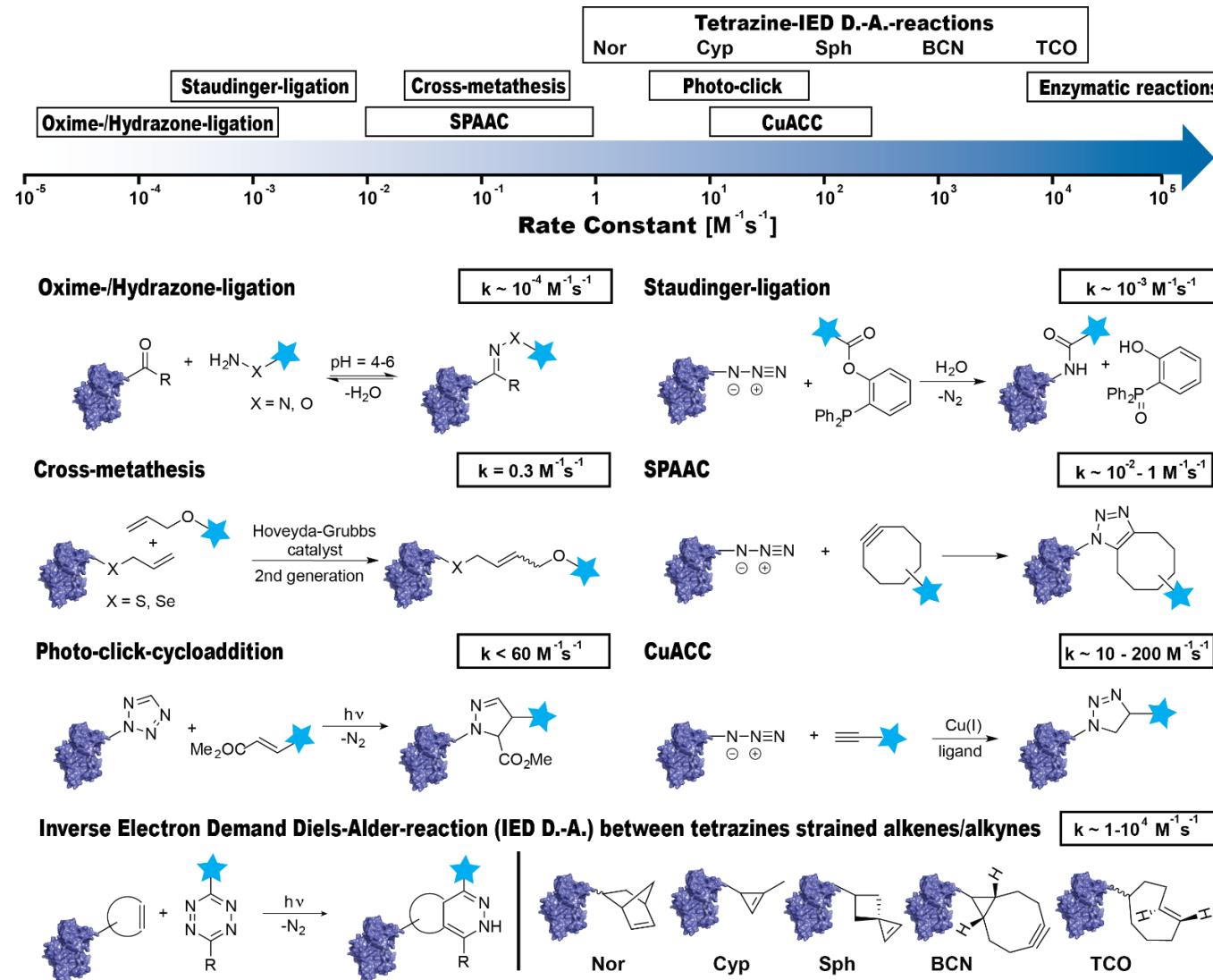
Nobel Prize 2022



E. M. Sletten, C. R. Bertozzi, *Angew. Chem. Int. Ed.* **2009**, 48, 6974-6998.

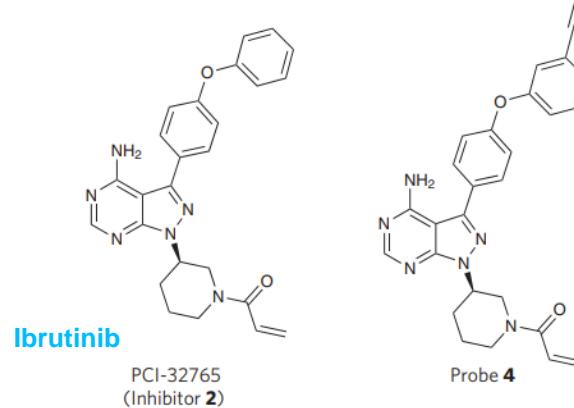
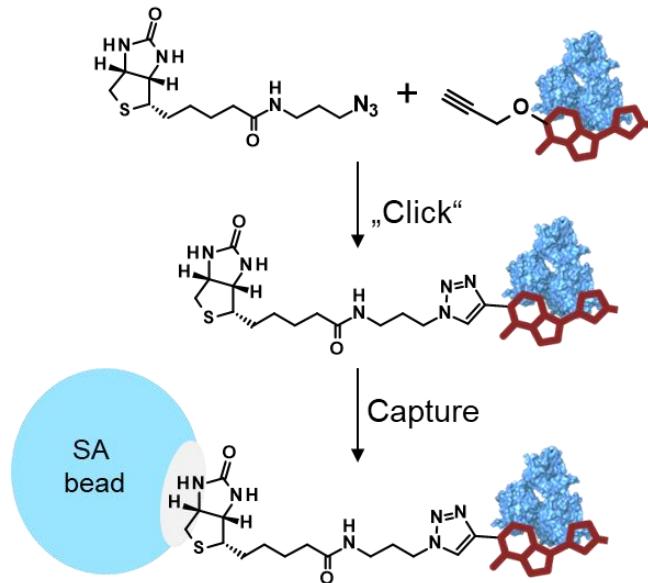
R. E. Bird, S. A. Lemmel, X. Yu, Q. A. Zhou, *Bioconjugate Chemistry* **2021**, 32, 2457-2479.

# Bioorthogonal Chemistry – Overview about modern tools

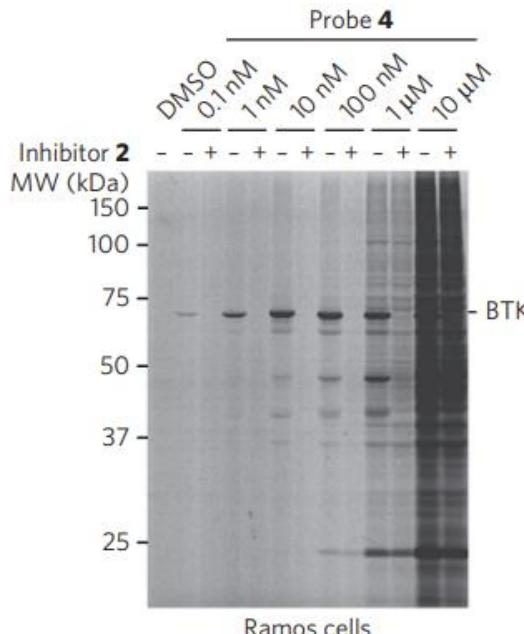


K. Lang, J. W. Chin, *ACS Chem. Biol.* **2014**, 9, 16-20.  
 K. Lang, J. W. Chin, *Chem. Rev.* **2014**, 114, 4764-4806.

# Application Example for Click Chemistry: Target Deconvolution by Activity based Protein Profiling (ABPP)

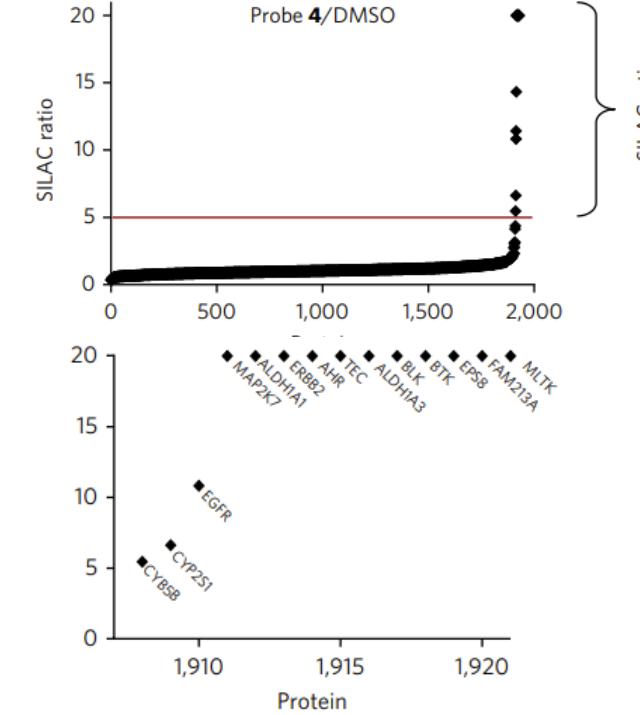


## Western Blot analysis

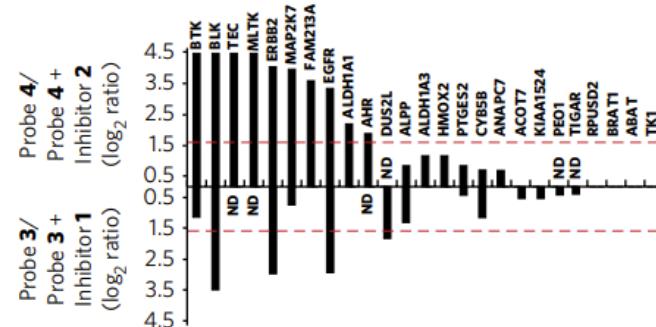


B. F. Cravatt et al., *Nat. Chem. Biol.* 2014, 10, 760-767.

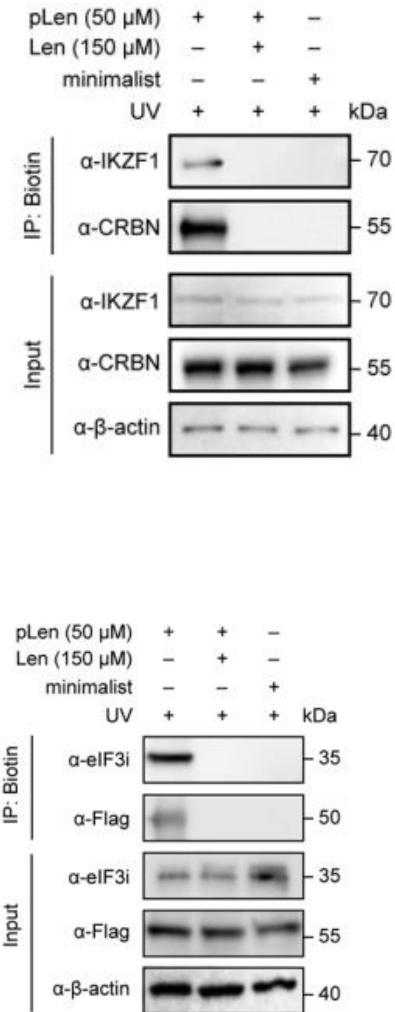
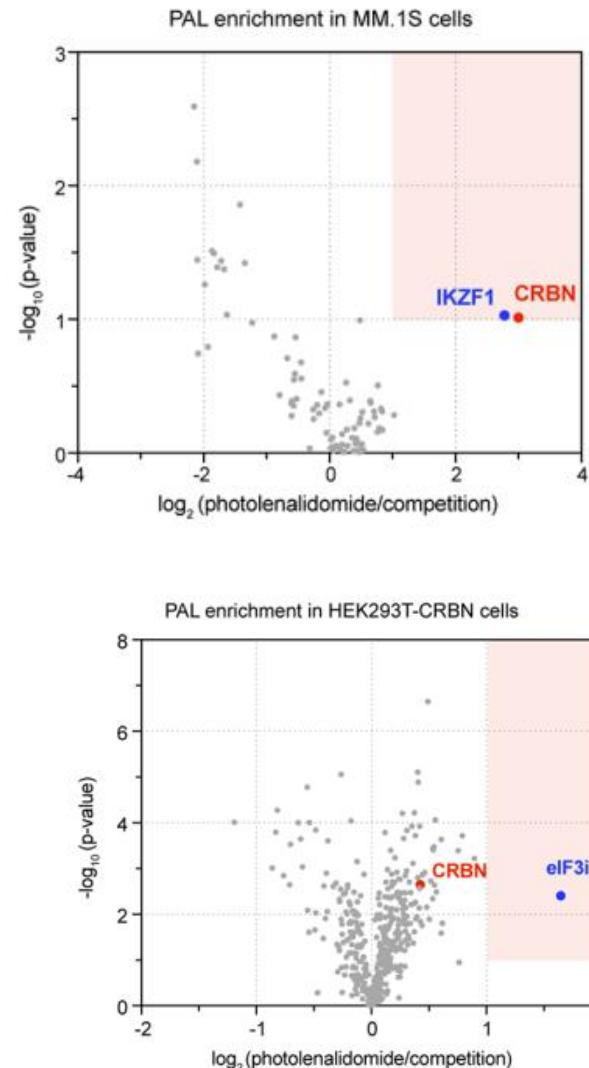
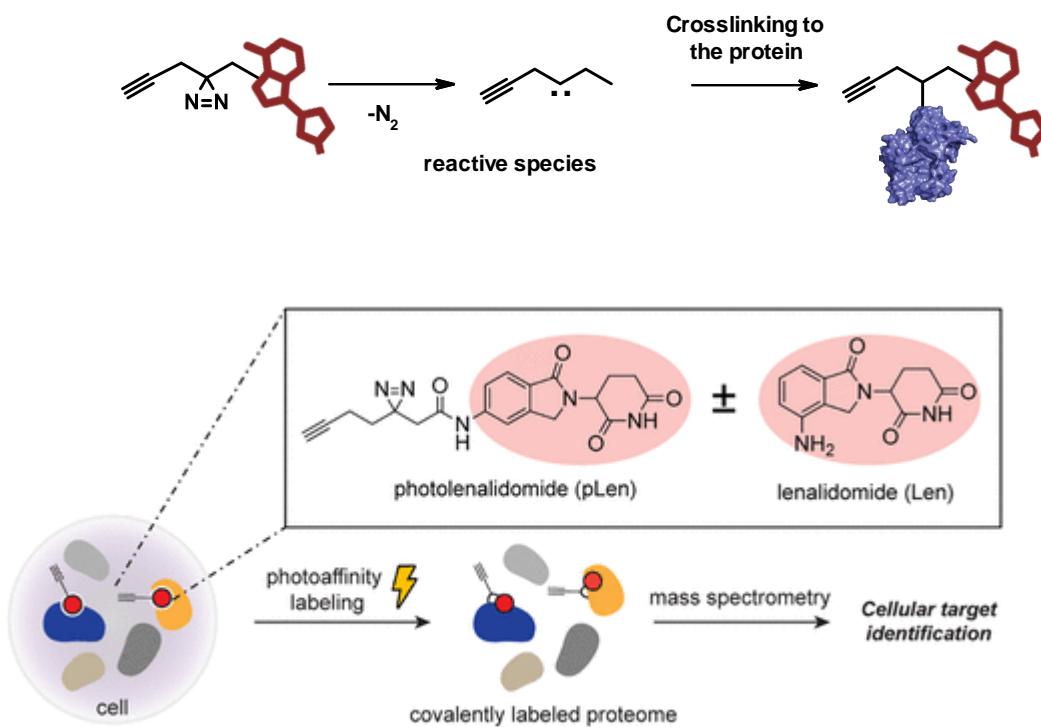
## SILAC Proteomics



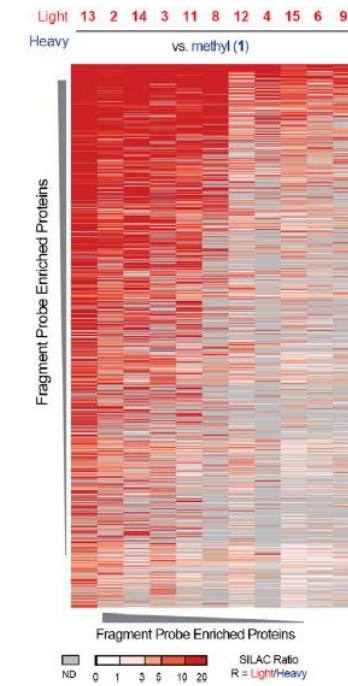
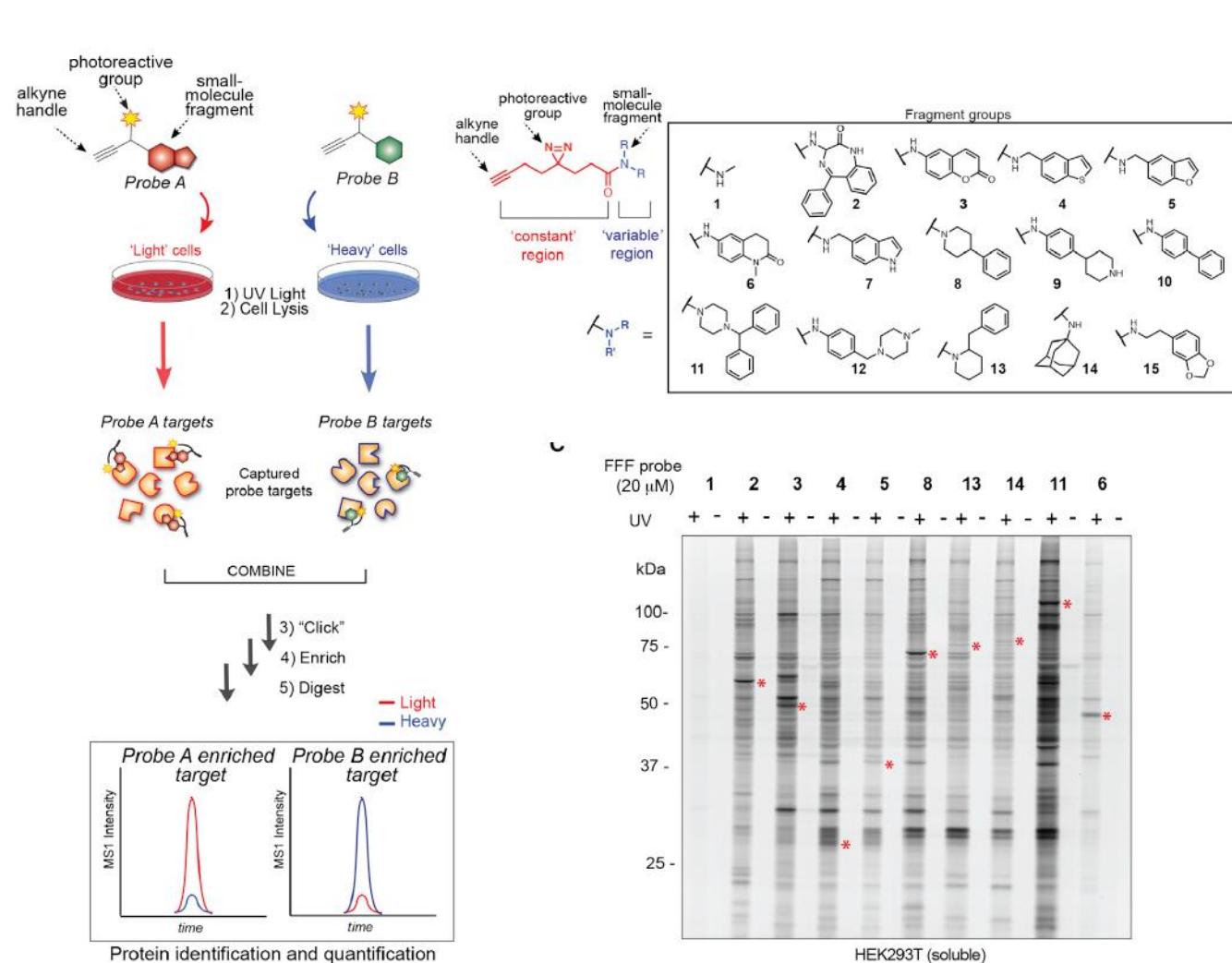
## Competition Ratio Proteomics



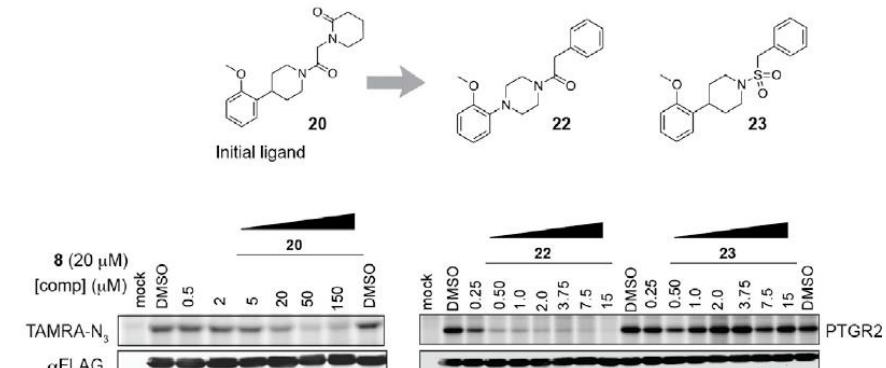
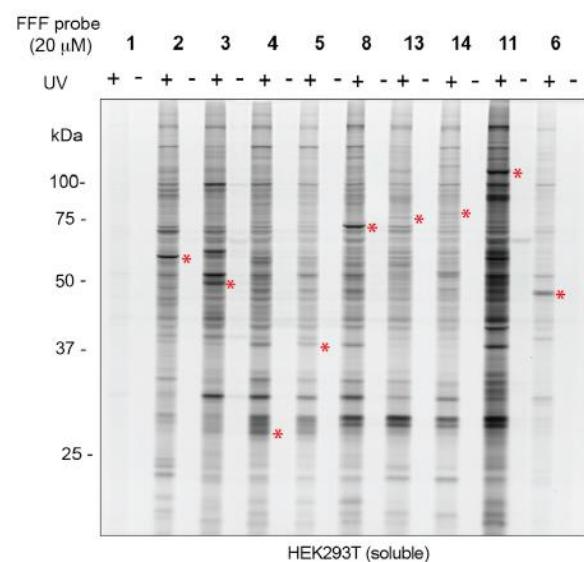
# The labeling efficiency of Activity based Protein Profiling (ABPP) experiments can be improved by Photoaffinity tags (PAL)



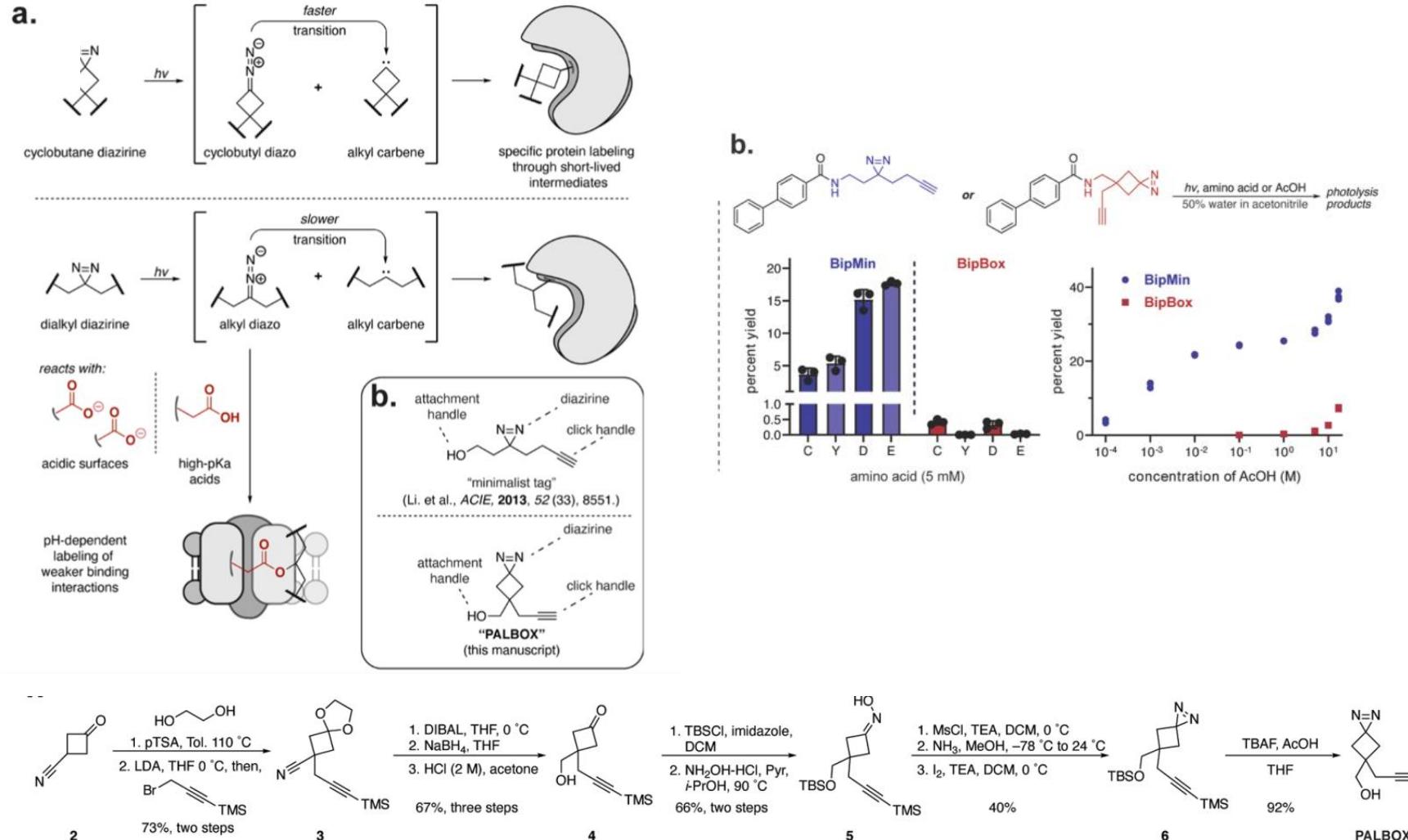
# Cellular Fragment-Based Screening by Photoaffinity based Protein Profiling (ABPP)



Fragment Enrichment  
Clustering, Target  
Selection & Fragment  
Optimization



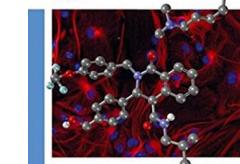
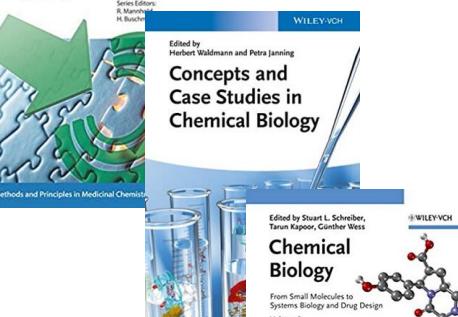
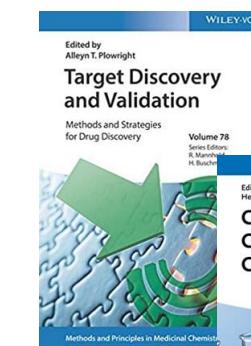
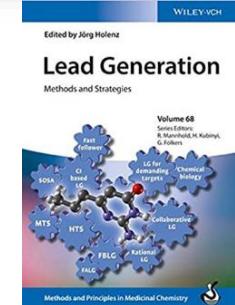
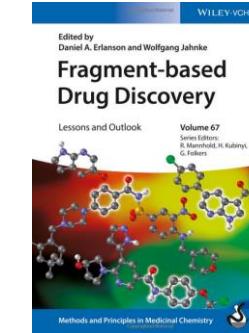
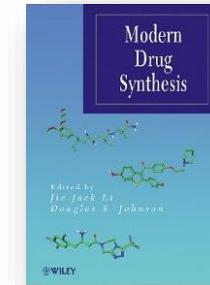
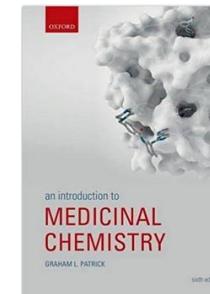
# The Chemical Nature of the Probe has significant influence on the labeling efficiency and biological outcome of a Photoaffinity labeling experiment



# Recommended Literature

## Medicinal Chemistry:

P. Graham: An Introduction to Medicinal Chemistry, 2017  
G. Klebe: Drug Design: Methodology, Concepts, and Mode-of-Action, 2013  
D. Erlanson, Wolfgang Jahnke: Fragment-based Drug Discovery, 2016  
J. J. Lie, D. S. Johnson, Modern Drug Synthesis (Case Studies), Wiley, 2013  
J. Holenz, Lead Generation: Methods, Strategies, and Case Studies, Wiley, 2016  
Methods and Principles in Medicinal Chemistry: Several Volumes with different topics  
D.A. Smith: Metabolism, Pharmacokinetics and Toxicity of Functional Groups, 2010  
B. Rupp: Biomolecular Crystallography, 2009  
Swiss course on Medicinal chemistry: <https://scg.ch/component/eventbooking/scmc22>



## Chemical Biology:

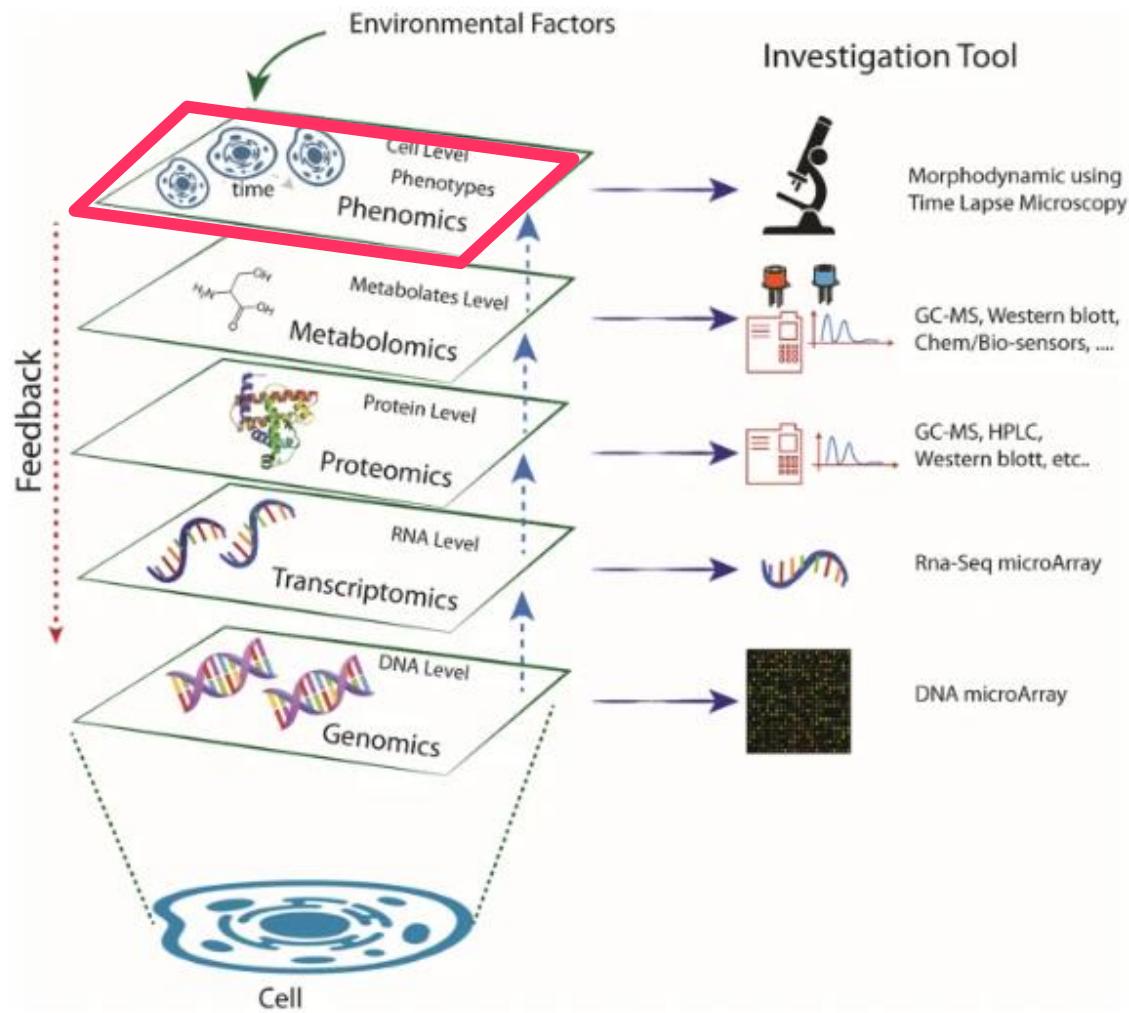
A. Plowright, R. Mannhold, H. Buschmann, J. Holenz: Target Discovery and Validation: Methods and Strategies for Drug Discovery, 2019  
H. Waldmann, P. Janning: Concepts and Case Studies in Chemical Biology, 2014  
A. D. Miller, J. A. Tanner: Essentials of Chemical Biology  
S. Schreiber, T. Kapoor, G. Wess: Chemical Biology, 2007  
P. Cromm: Inducing Targeted Protein Degradation: From Chemical Biology to Drug Discovery and Clinical Applications, 2022  
P. Wyatt: Proteomics. Principles, Techniques and Analysis, 2018  
T. Engel, J. Gasteiger: Chemoinformatics: Basic Concepts and Methods: Basic Concepts and Methods, 2018  
F. Lottspeich, J. Engels: Bioanalytics: Analytical Methods and Concepts in Biochemistry and Molecular Biology, 2018

|||||||

*Thank You for  
your attention!!!  
Happy to take  
questions???*



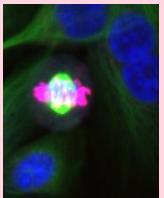
# Overview PhenOMICs tools



# PhenOMICs Tools IV – Overview Image based approaches

## Phenotypic Approach

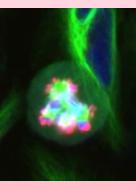
*What is the underlying target or mechanism?*



**Discovery of phenotypic differences**

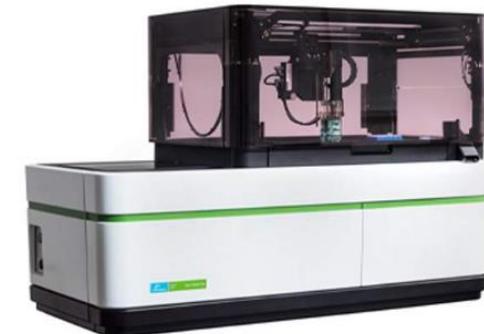
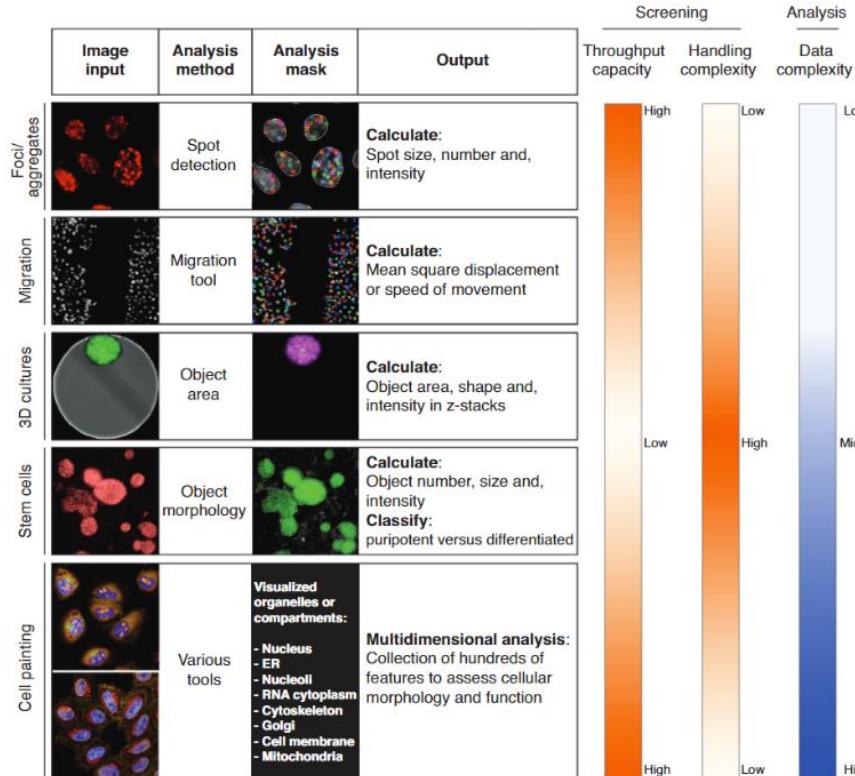


**Example:**  
Mitotic phenotype under Sagopilone treatment



## Definition:

- // Characterization of compound induced effects on cellular phenotypes
- // Multiple readouts possible (Imaging, Omics, ELISA, Histology), however in most cases by **fluorescence microscopy**
- // Quantification of effects via **image analysis** covering typically several parameters (High-Content-Screening (HCS))
- // Single timepoint analysis and/or kinetic monitoring
- // High Importance of target deconvolution strategies



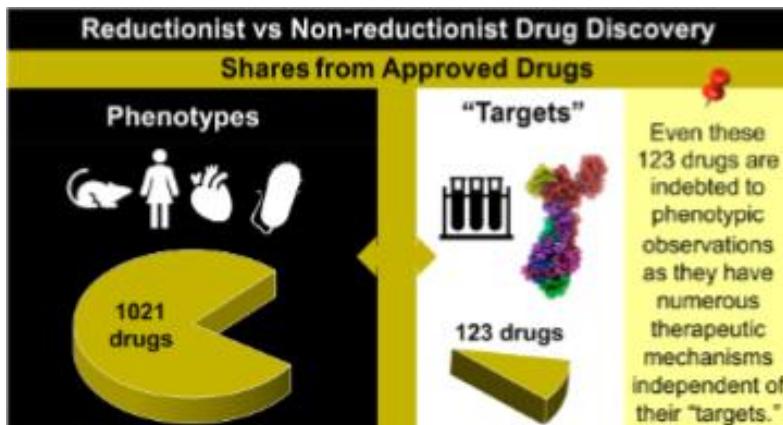
Example of an Automated High-Content Screening Systems



# The fundamental question: Is target-based drug discovery efficient? A critical view on R&D productivity

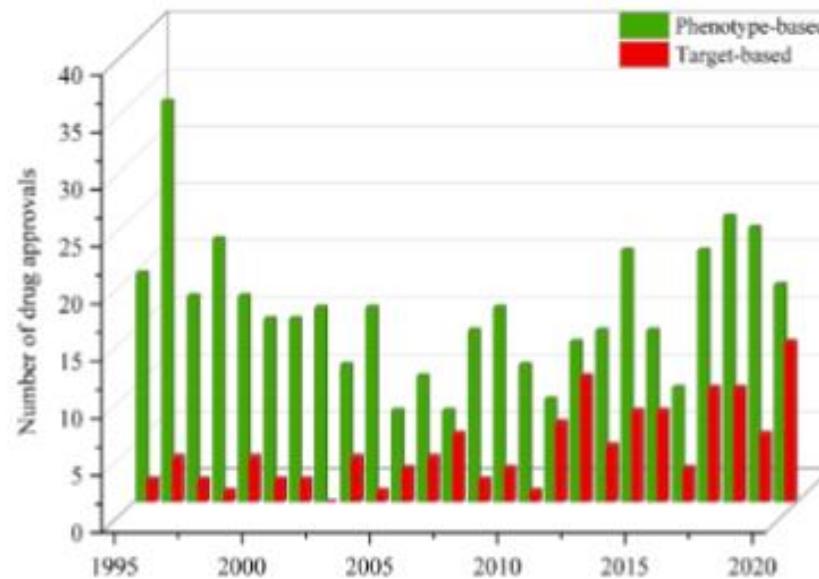
## Is Target-Based Drug Discovery Efficient? Discovery and “Off-Target” Mechanisms of All Drugs

Arash Sadri\*

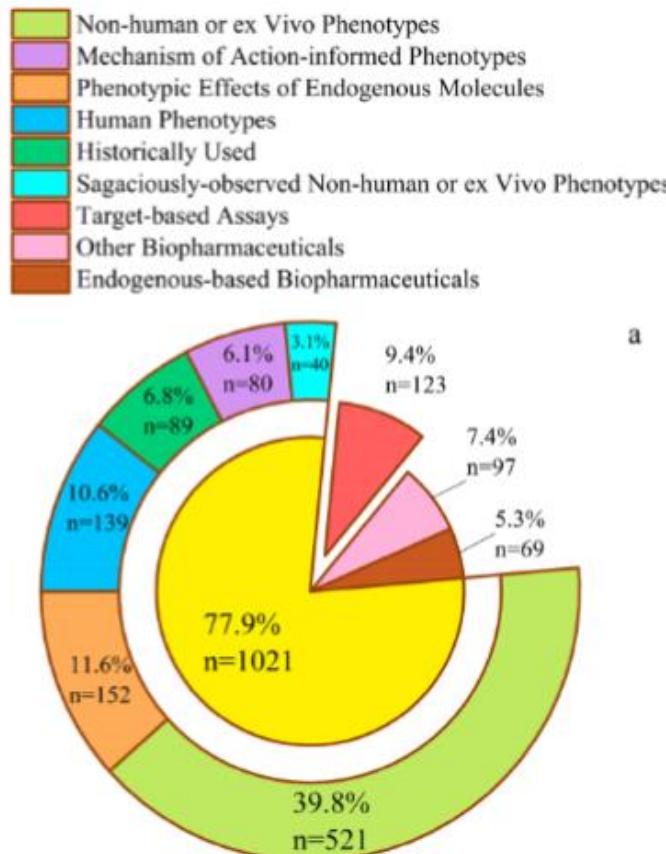


- This is the first systematic and comprehensive assessment of the real-world efficiency of target-based drug discovery.
- Merely 9.4% of approved small-molecule drugs have been discovered by this approach.
- Even these supposedly target-based drugs depend on numerous off-target mechanisms for their therapeutic effects.
- Reductionist target-based drug discovery has thus far been inefficient and maybe a cause of the productivity crisis.
- Approaches that prioritize higher-level observations are potentially more efficient based on both observational and theoretical evidence.

## Source of FDA approved drugs per year:



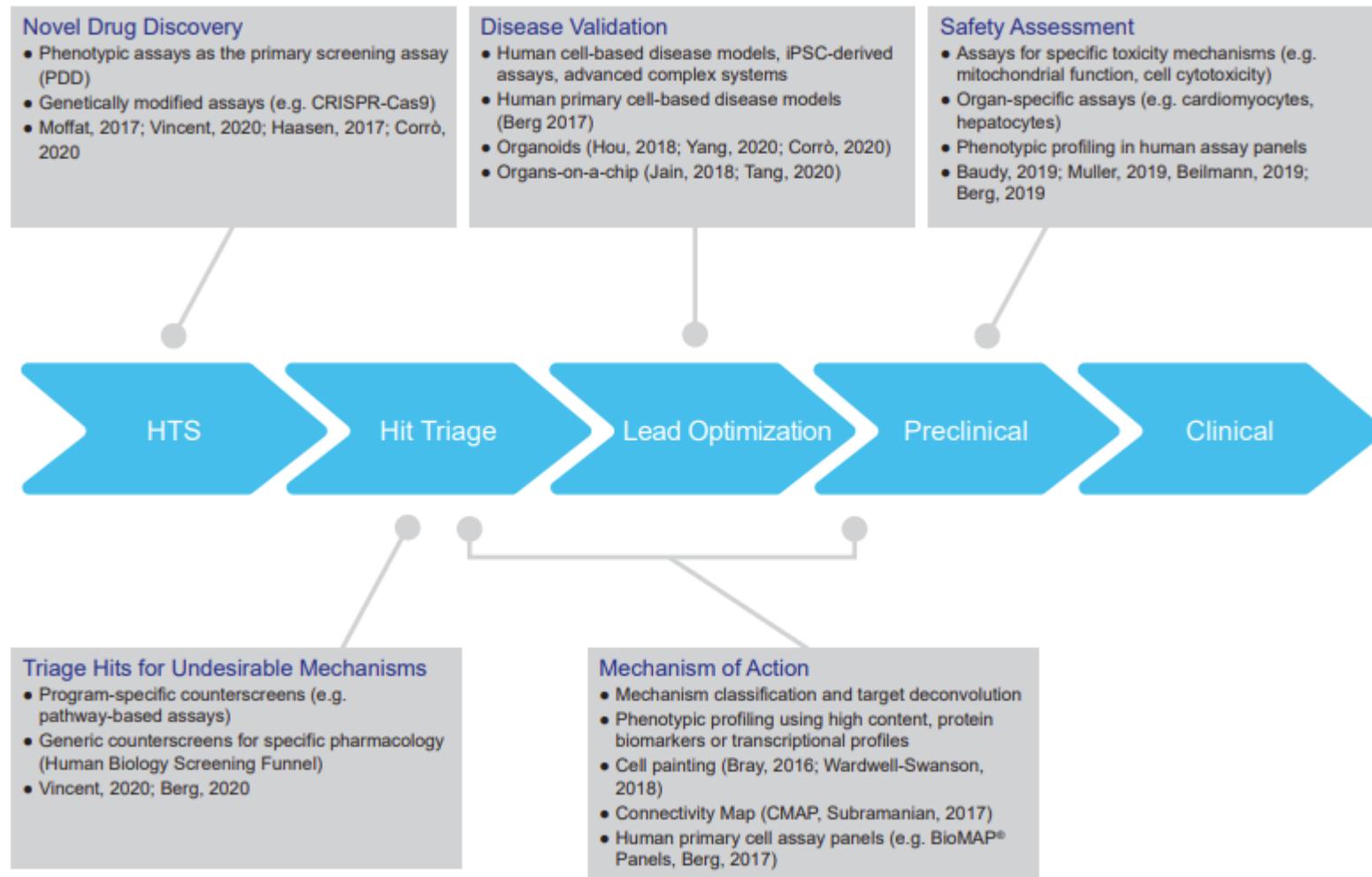
# Many approved and successful drugs are hitting multiple targets although they were optimized for one main target



**Table 2. Counts of “Off-Target” Therapeutic Mechanisms of “Target-Based” Drugs<sup>a</sup>**

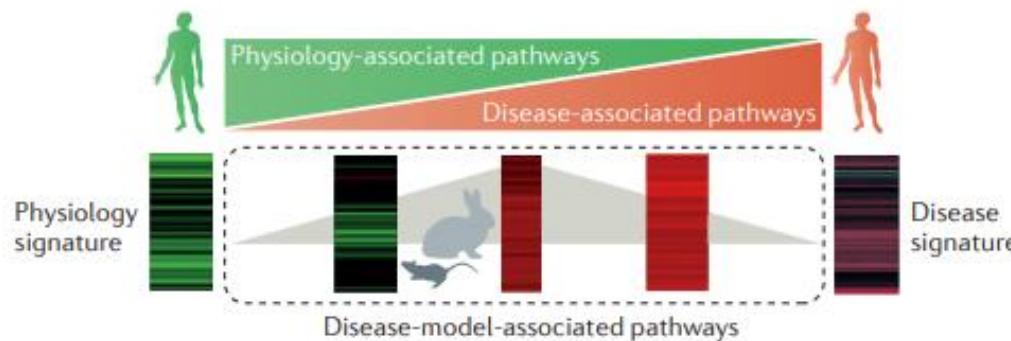
DONEPEZIL	40	BORTEZOMIB	69	ORLISTAT	10
ACARBOSE	14	CARFILZOMIB	2	RIMEGEPANT	1
ALISKIREN	12	EFAVIRENZ	2	ROFLUMILAST	9
RIVAROXABAN	7	NINTEDANIB	229	SACUBITRIL	2
EDOXABAN	1	GEFITINIB	111	TIRBANIBULIN	2
ZANAMIVIR	1	ERLOTINIB	109	VENETOCLAX	2
OSELTAMIVIR	1	LAPATINIB	16	SAQUINAVIR	11
FOMEPIZOLE	2	VANDETANIB	114	RITONAVIR	8
SITAGLIPTIN	13	AFATINIB	41	INDINAVIR	7
SAXAGLIPTIN	20	OSIMERTINIB	8	NELFINAVIR	8
LINAGLIPTIN	1	NERATINIB	4	LOPINAVIR	2
ALOGLIPTIN	1	SORAFENIB	140	ATAZANAVIR	1
ELTROMBOPAG	1	PAZOPANIB	107	MARAVIROC	3
ARGATROBAN	1	AXITINIB	102	ELTROMBOPAG	1
DABIGATRAN	2	REGORAFENIB	20	PALBOCICLIB	38
MIRABEGRON	2	LENVATINIB	10	RIBOCICLIB	14
DASATINIB	158	IMATINIB	78	ABEMACICLIB	17
NILOTINIB	63	CERITINIB	9	TALAZOPARIB	3
PONATINIB	13	OLAPARIB	4	CABOZANTINIB	5
BOSUTINIB	74	RUCAPARIB	17	ACALABRUTINIB	3
CRIZOTINIB	148	NIRAPARIB	2	VEMURAFENIB	18
TOFACITINIB	34	IBRUTINIB	40	SUNITINIB	270

# Phenotypic drug discovery opens a different perspective to assess the polypharmacological behaviour of small molecules

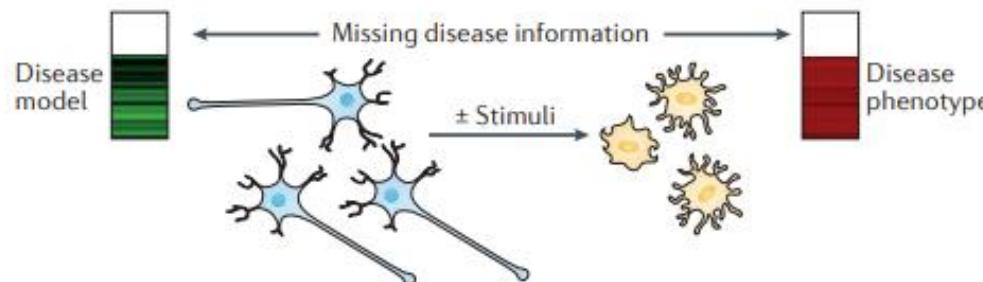


# Phenotypic Drug Discovery – step by step

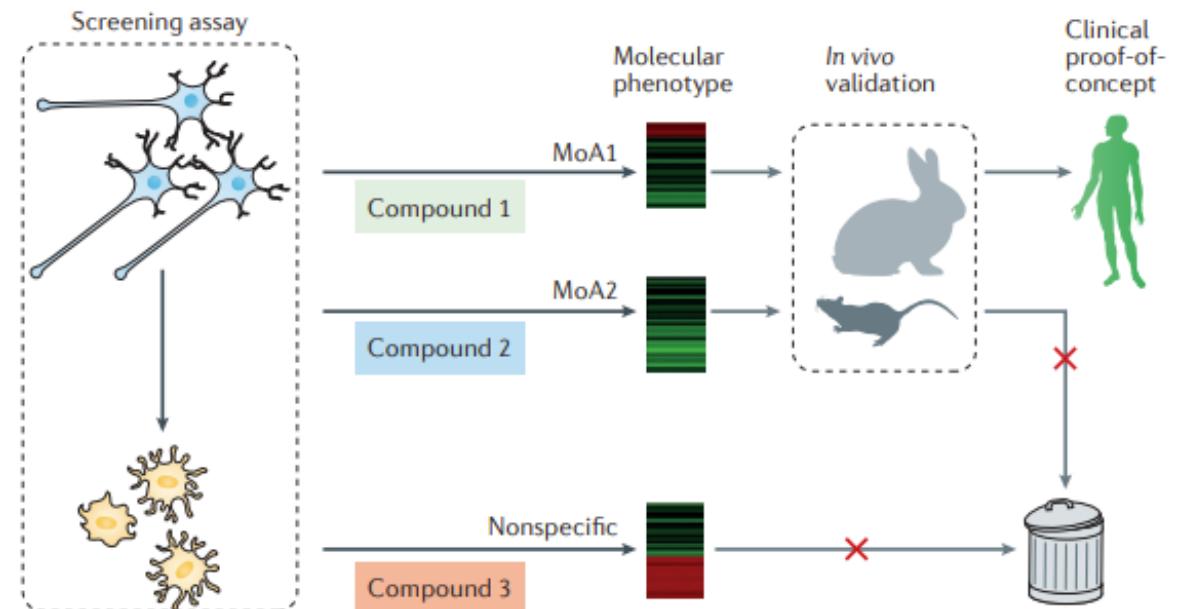
## Step 1: Definition of the phenotypic signature



## Step 2: Implementation of the phenotypic model

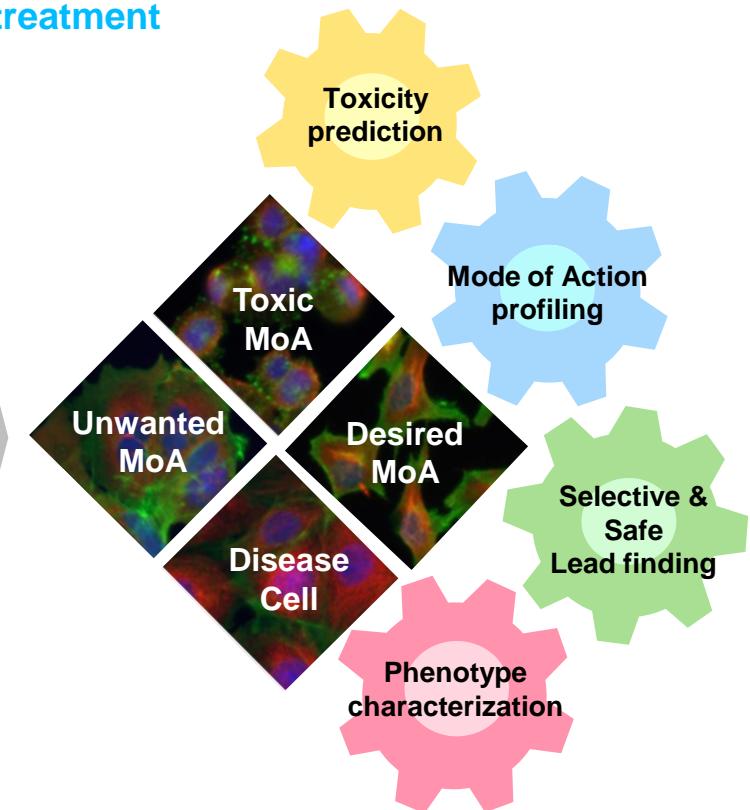
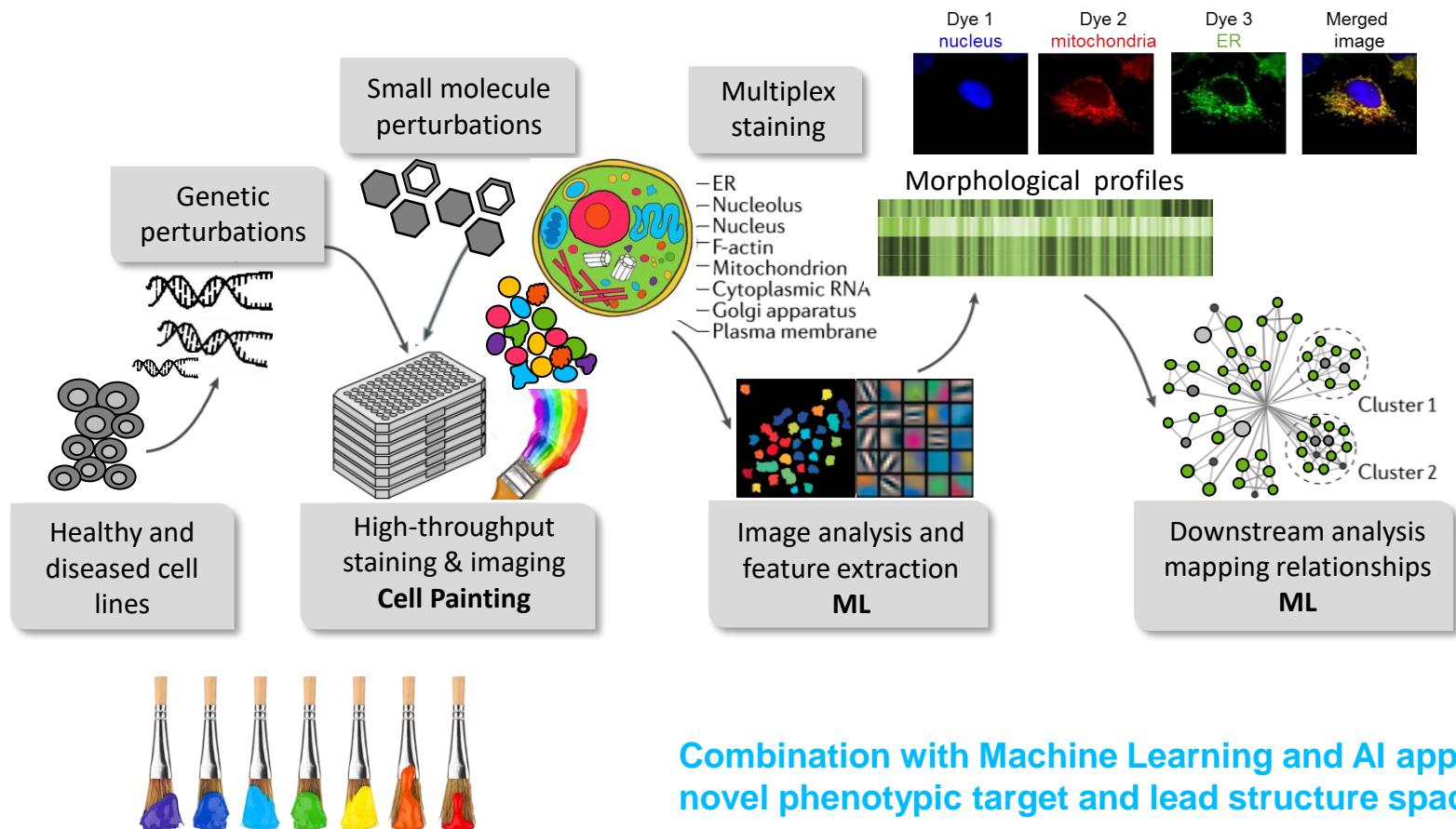


## Step 3: Screening and MoA Deconvolution



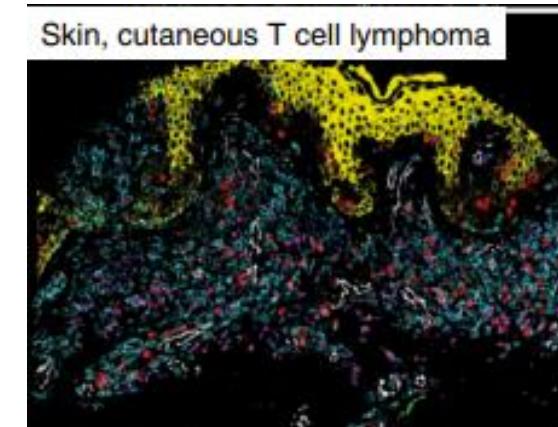
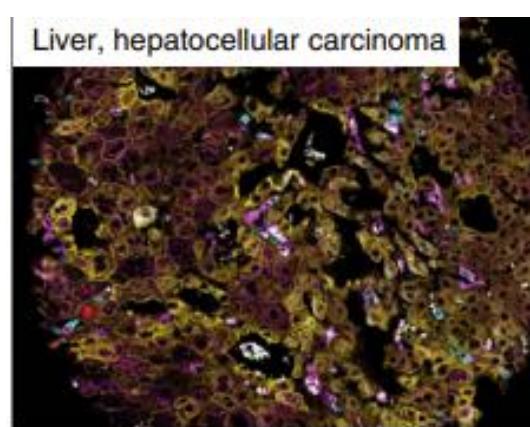
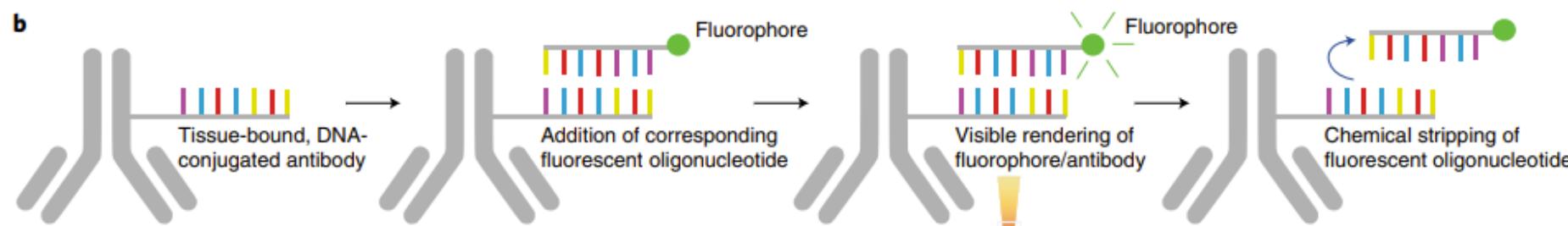
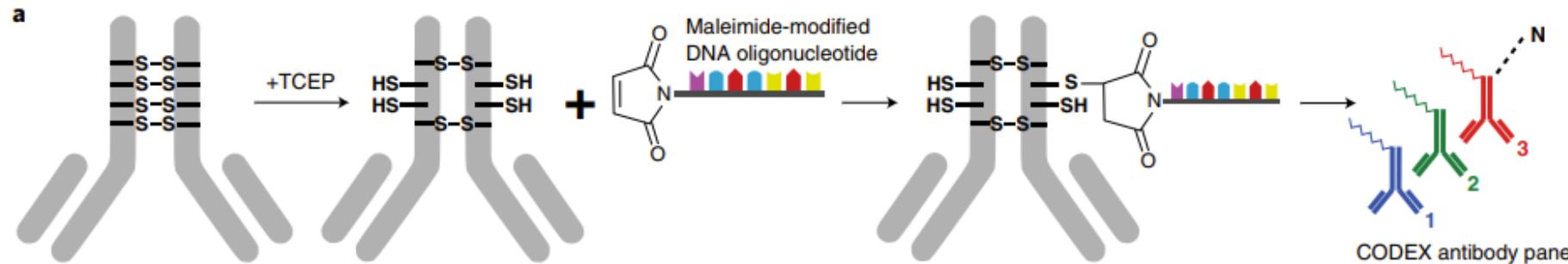
# Cell Painting: A novel Imaging approach for cellular phenotyping

Cell Painting allows the fingerprinting of a huge variety of cellular changes after compound treatment



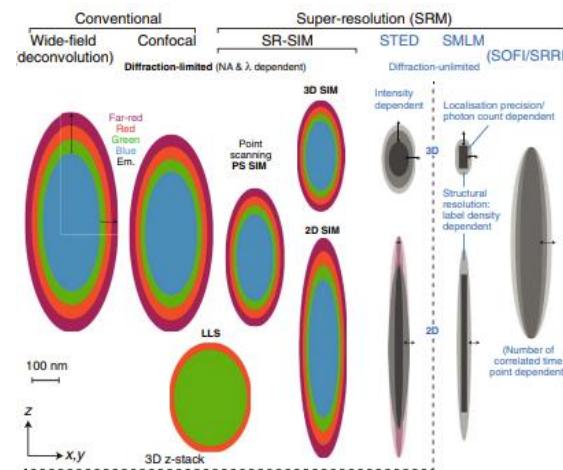
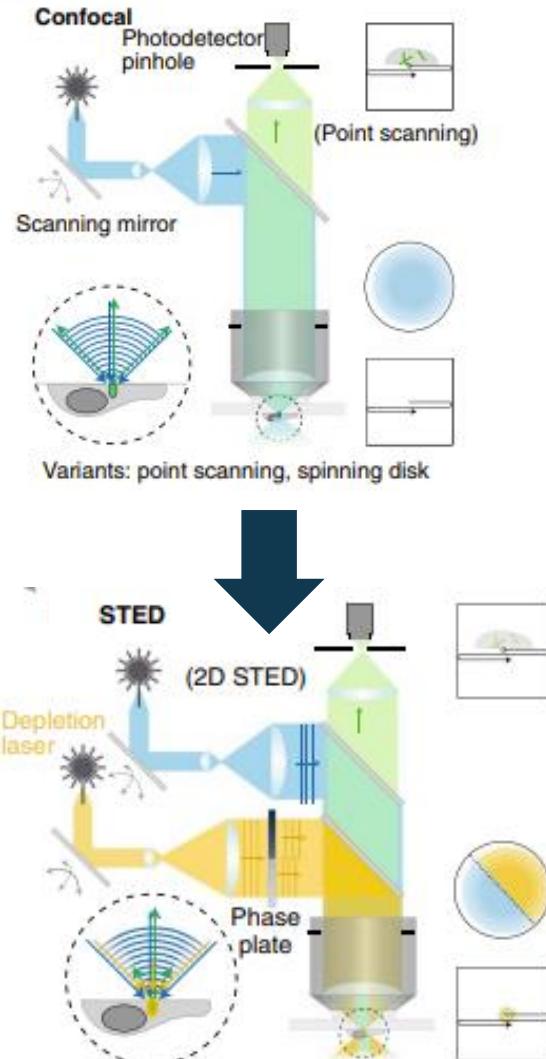
Combination with Machine Learning and AI approaches gives access to a novel phenotypic target and lead structure space

## Advances in labeling techniques have huge influence on phenotypic drug discovery: Example CODEX technology

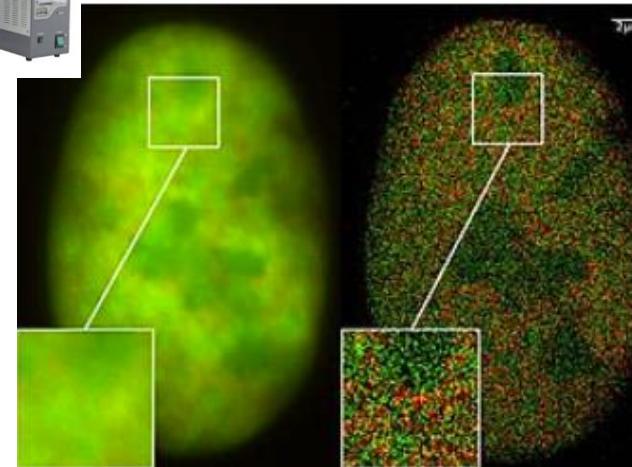


60

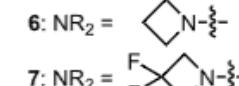
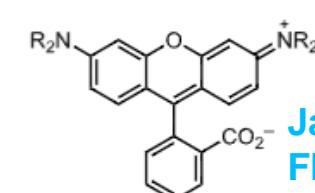
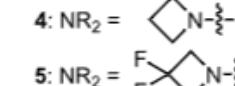
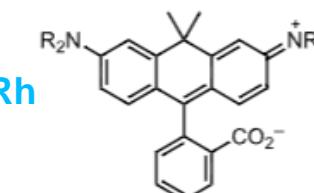
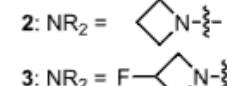
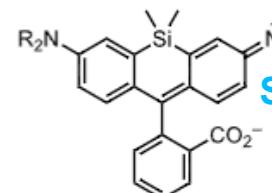
# Outlook: The resolution becomes constantly better: Super-Resolution Microscopy



conventional vs super-resolution

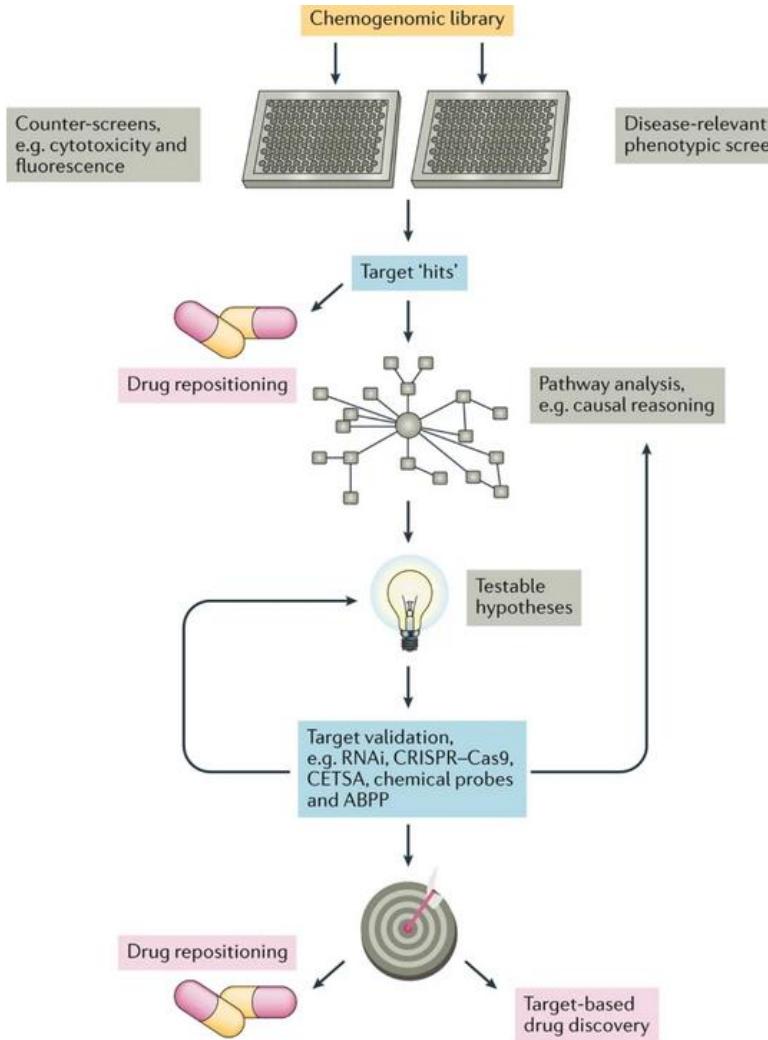


Examples for super resolution dyes:

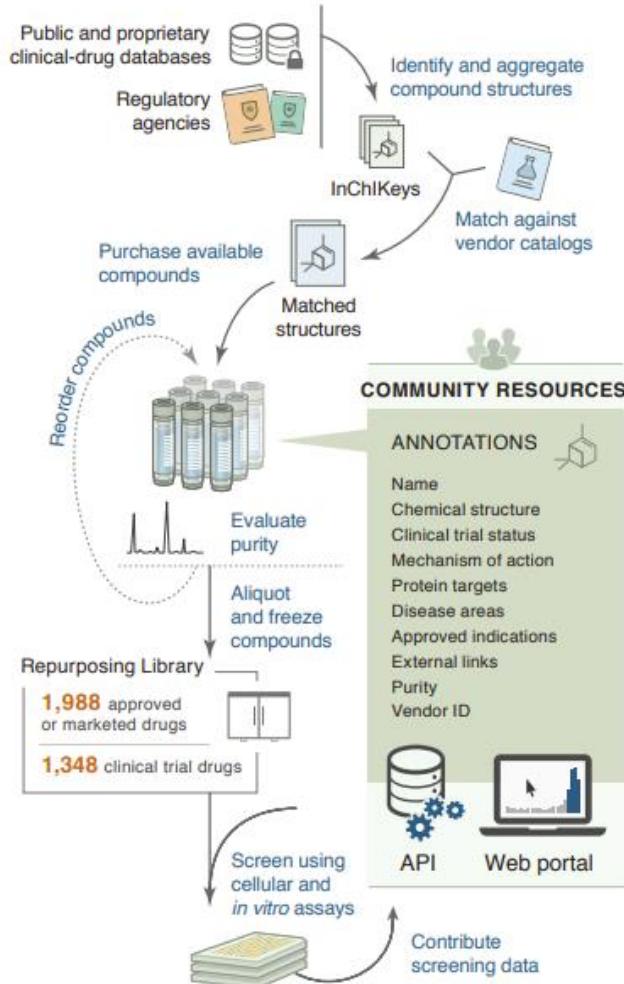


# The basis of Phenomics based drug discovery: A well annotated Chemogenomics Library

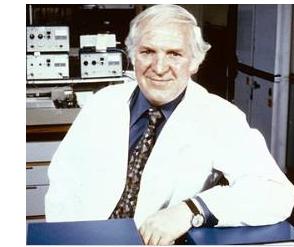
## Use cases:



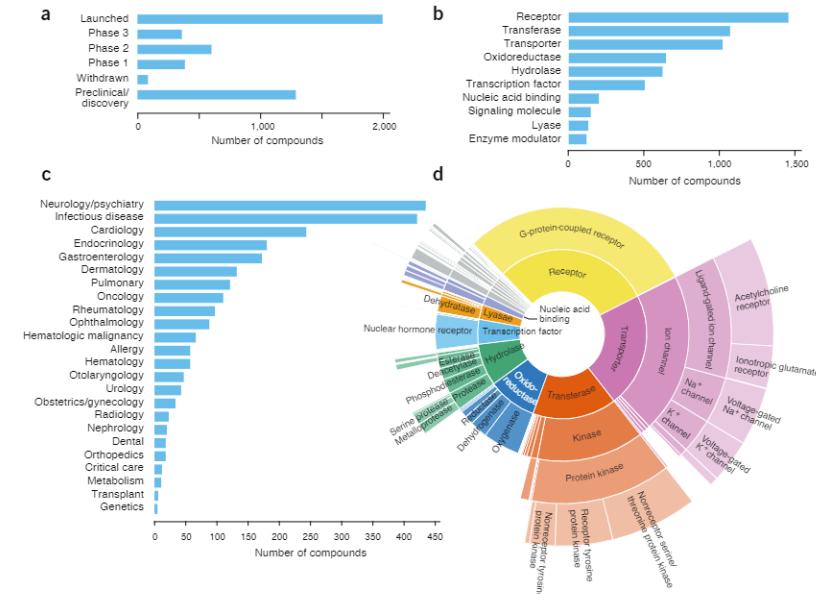
## Typical construction workflow:



„The best way to discover a new drug is to start with an old one“  
- James Black



## Composition example:



L. H. Jones, M. E. Bunnage, *Nat. Rev. Drug Disc.* **2017**, *16*, 285-296.

Corsello, S., Bittker, J., Liu, Z. et al. *Nat Med* **23**, 405–408 (2017).