

# The GPS Platform

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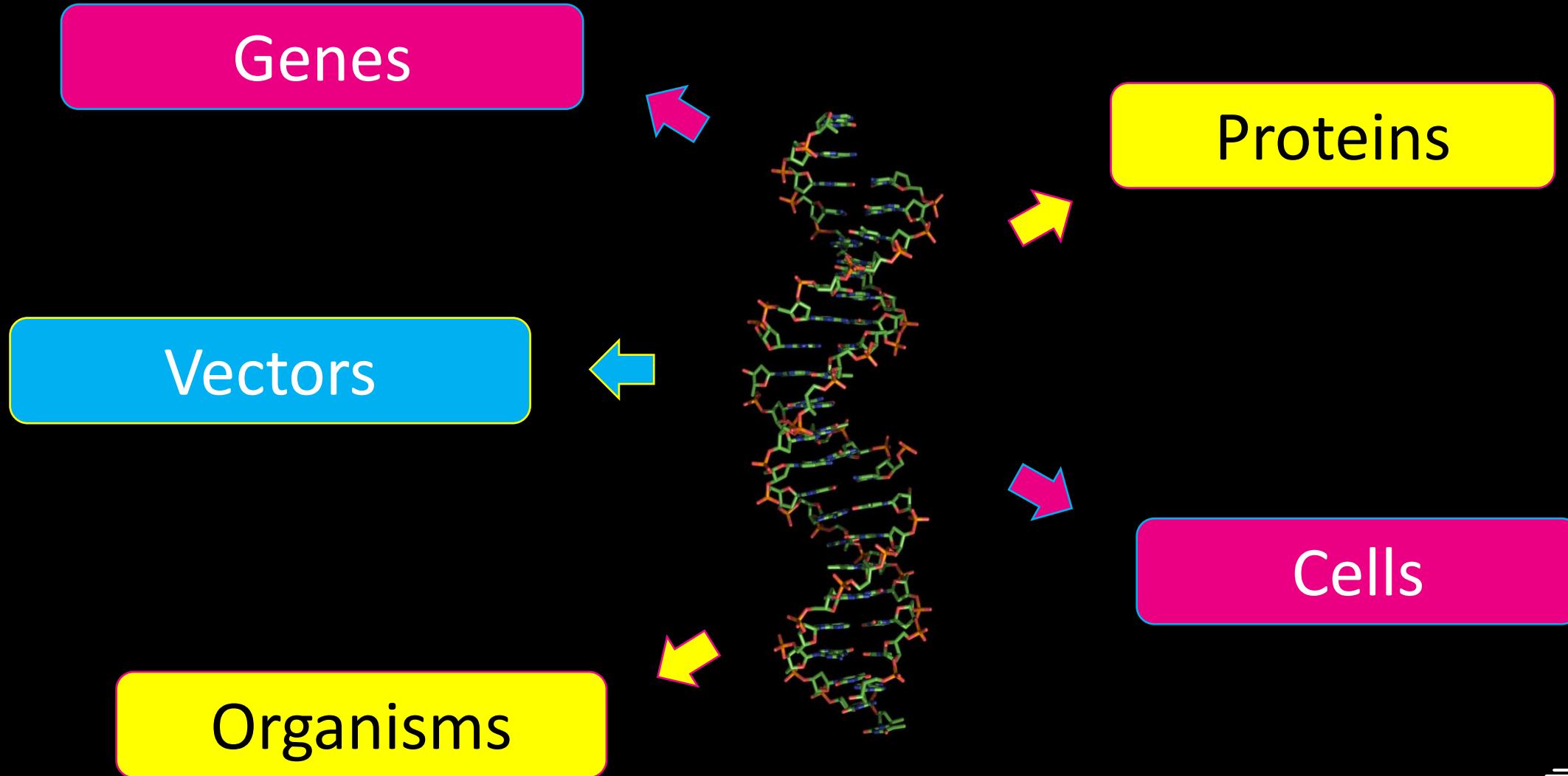
“O, she doth teach the torches  
to burn bright.”

ATGACCCCCGAACACCTTCCAACAGAACAGTATGAAGCGCAGTTAG  
CCGAAAAAGTGGTACGTTGCAAAGTATGATGGCACCGTTTCTGA  
CCTGGTCCGGAAGTGTTCGCTGCCGGTCAGTCATTACCGGATG  
CGCGCGGAGTTCCGCATCTGGCACGATGGCGATGACCTGTATCACA  
TCATTTCGATCAACAAACCAAAAGCCGCATCCGCGTGGATAGCTT  
CCCCGCCGCCAGTGAACTTATCAACCAGTTGATGACGGCGATGATT  
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ATACCATAAGAAGCTGGATGATGAGTGGCGTCAGGAAGCGGAGGCC  
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TGAACGTCTGCCGGTGCAGGGAAAGAGATGATCTACCGTCAGGTA  
GAAAACAGCTTACCCAGCCGAACGGCGATGAATATTAGATGC  
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CTGCTGCGCAATACACATCGCAGCTAACCATATTGATAACGTACA  
AATTATTCGTATGGCGGCAGAAGAATTACTCAGGGATGAATGGT  
GTGCGCGAGTTAACCGCCTGCAAGGGATCGACTAAAGAGTTATC  
AGTGCAGAACCATTTTGTGACCCCTCCGCGCAGCGGTCTGGACAG  
TGAAACCGAGAAAATGGTGCAGGCATCCGCGTATTGTACATC  
TCCTGTAACCCGGAAACGTTATGCAAGAACATTAAGCC  
AGACGCACAAGGTGAAACGTCTGGCTCTGTTGATCAGTTCCCCTA

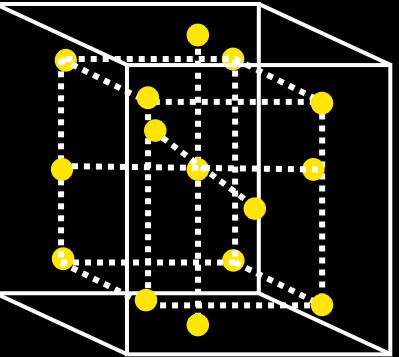
“Methylate tRNA U54 in pos 5”



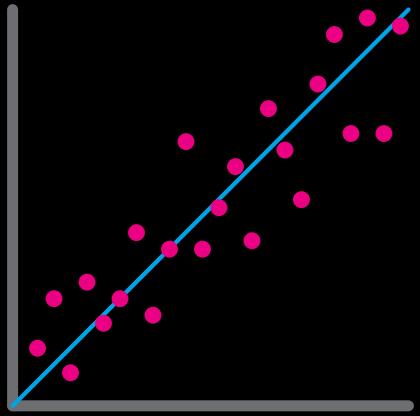
# Biology: a string of ACGT



## Design of Experiment



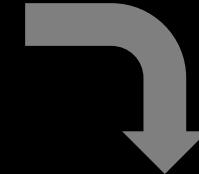
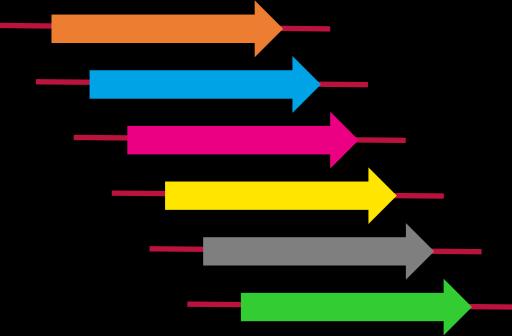
Learn



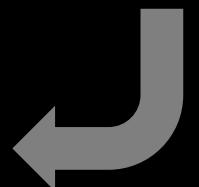
# GPS platform



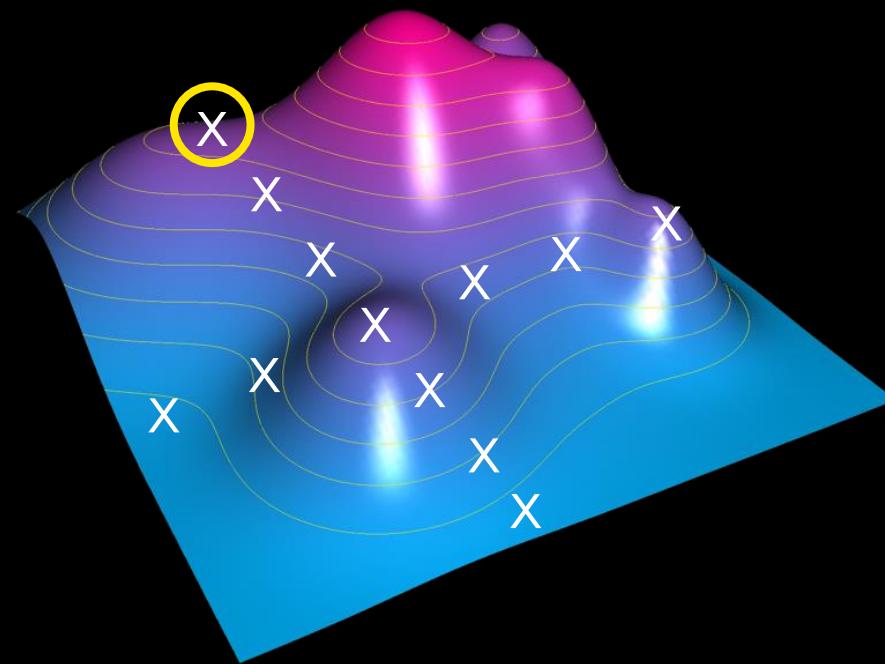
Test



Build

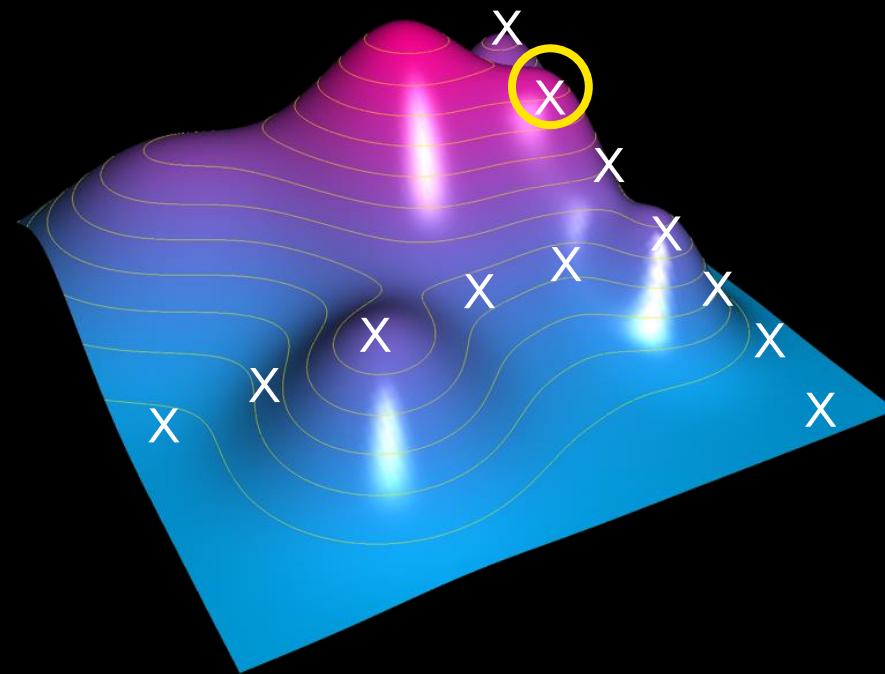


# Sequential optimization



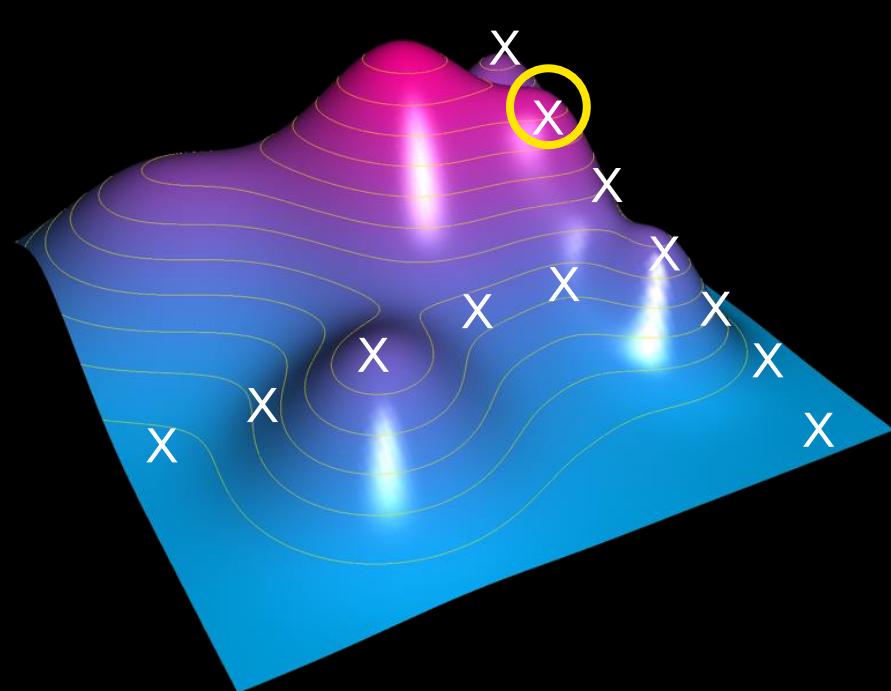
Sequential assays  
Optimize for one parameter at a time

# Sequential optimization

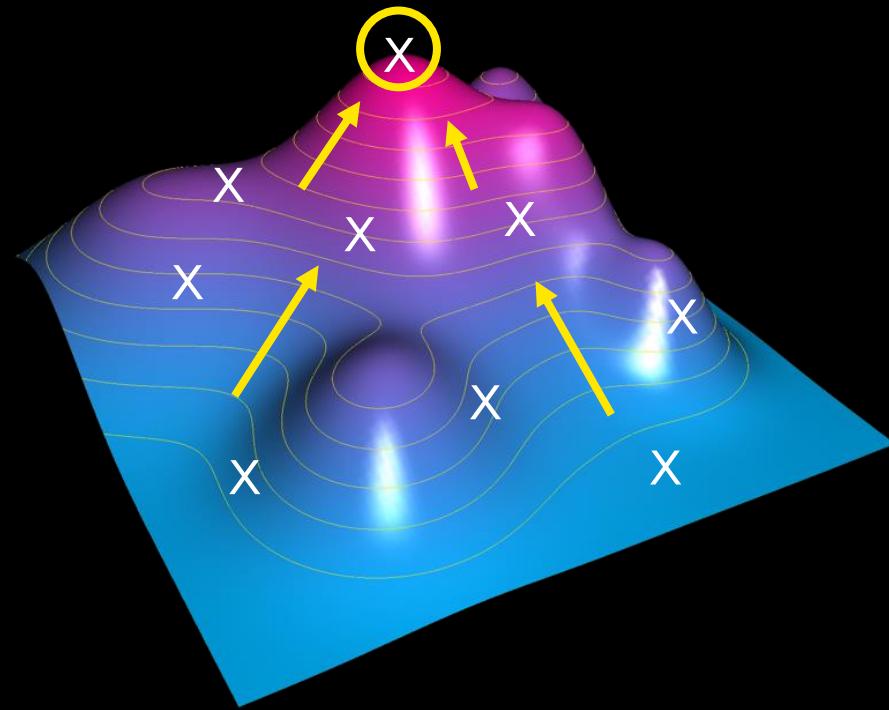


Sequential assays  
Optimize for one parameter at a time

# Design of Experiments (DoE)

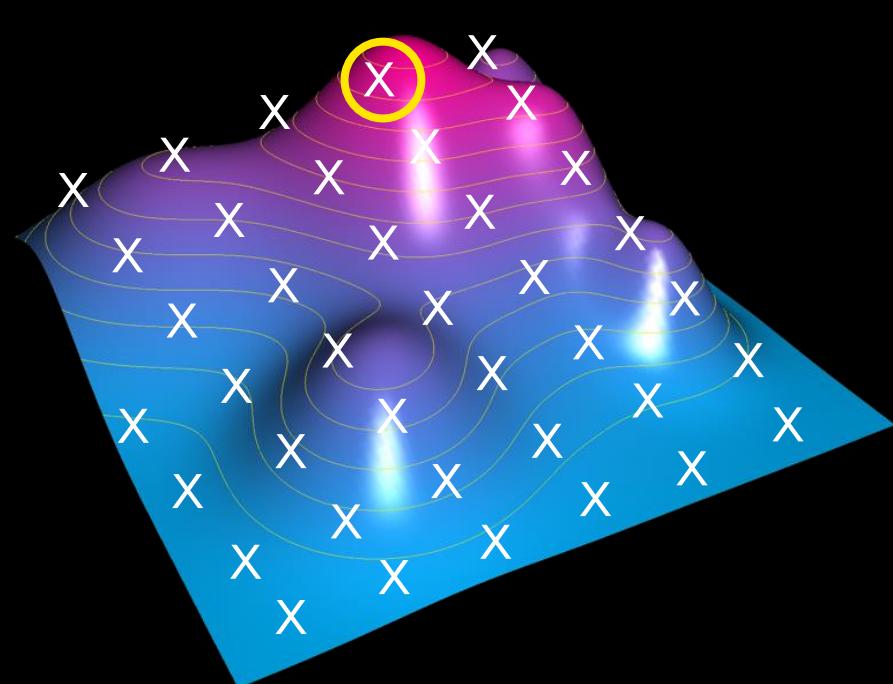


Sequential assays  
Optimize for one parameter at a time

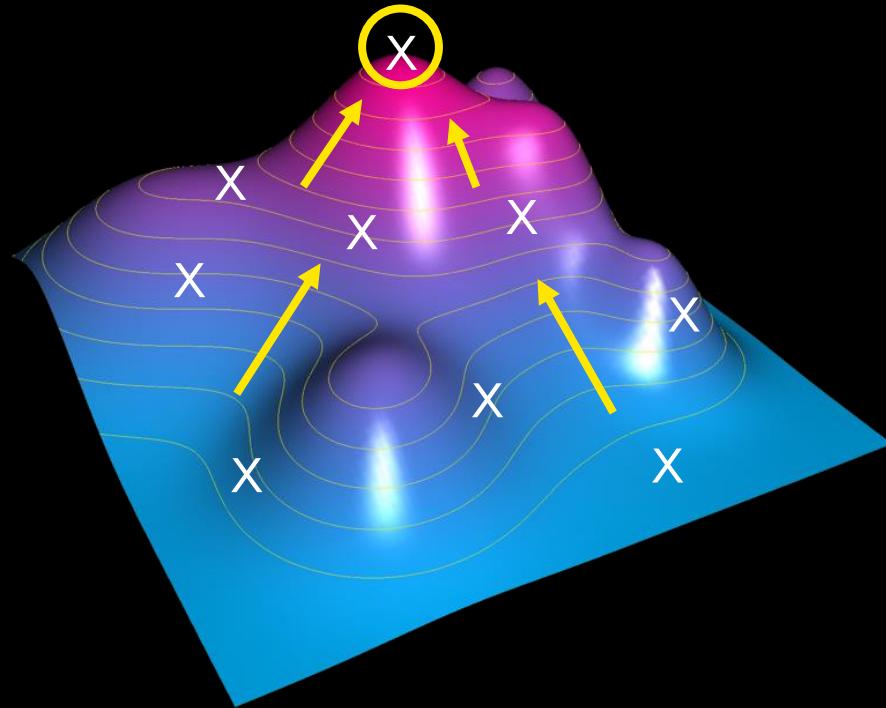


Design Of Experiment  
Optimize for two parameters at once

# DoE vs Library

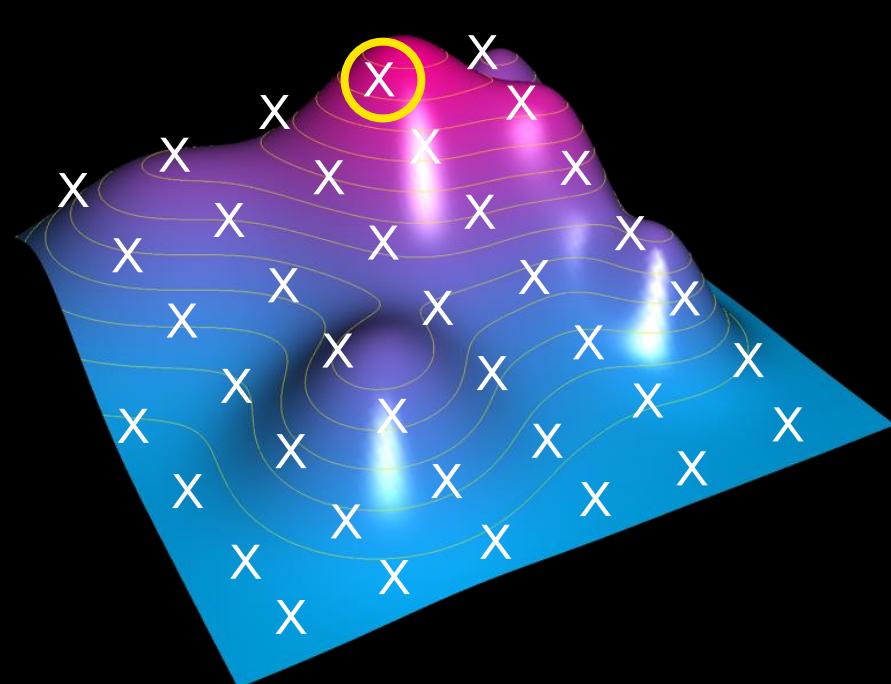


Requires high throughput  
“low” relevance



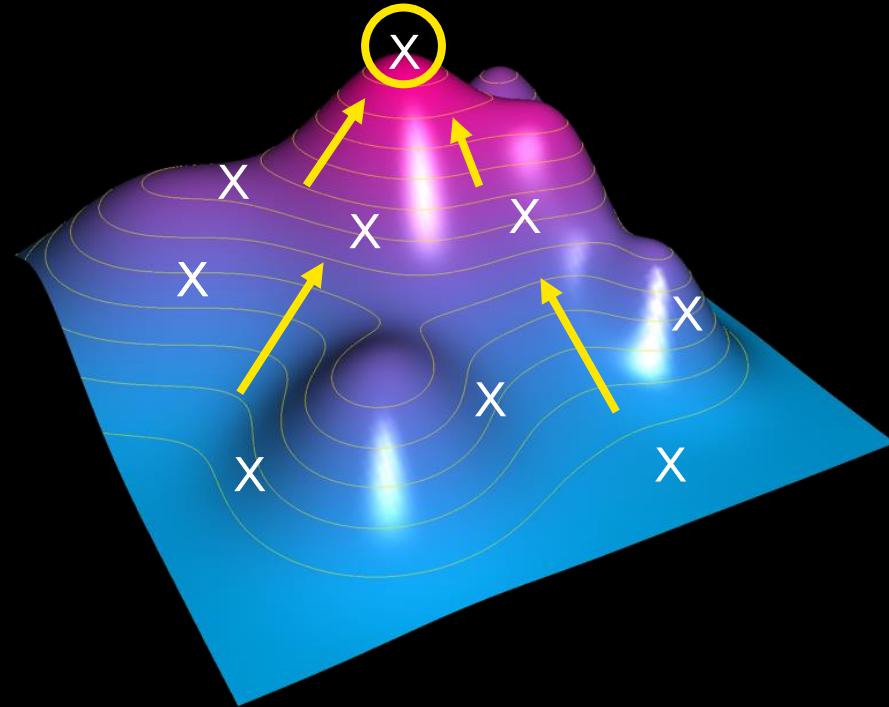
Can use low throughput  
“high” relevant

# DoE vs Library



A library

Requires high throughput  
low relevance **ASSAYS**



Design of Experiment

Can use low throughput  
highly relevant **ASSAYS**

# What antibody library size is required?

Average yeasts display diversity:  $10^{8-9}$

Average phage display diversity:  $10^{10-11}$

Estimated human repertoire:  $10^{18-19}$

How much of total theoretical diversity  
does this cover?

# How big of an antibody library is big enough?

Assume CDR length = 10aa = 30aa/variable domain

Assume 20aa choices at each position

$20^{30} = 10^{39}$  ( $1.7 \times 10^{15}$  moles) possible sequences

Assume 500bp amplicon @ 325kDa each

Assume 1 copy of each sequence option in the library

$$1.7 \times 10^{15} \text{ moles} \times 3.25 \times 10^5 \text{ g/mole} = 5.25 \times 10^{20} \text{ g}$$
$$= 5.25 \times 10^{14} \text{ metric tons}$$

Assume an ultra large crude carrier (ULCC) has max DWT  
~525,000 metric tons

$$5.25 \times 10^{14} \text{ MT} / 5.25 \times 10^5 \text{ MT/ULCC} = 10^9 \text{ ULCC's}$$

## Average Freight Rate Assessment (AFRA) Scale - Fixed



Cargo type      Vessel class, capacity (thousand deadweight metric tons)

Refined products

GP (General Purpose) 10-25 DWT

MR (Medium Range) 25-45 DWT

LR1 (Long Range 1) 45-80 DWT

Refined products  
or crude oil

AFRA (AFRAMAX)\* 80-120 DWT

LR2 (Long Range 2) 80-160 DWT

VLCC (Very Large Crude Carrier) 160-320DWT

Crude oil

>400M

ULCC (Ultra-Large Crude Carrier)

320-550DWT



HELLESPONT ALHAMBRA  
MAJURO





# People use less information than they think to make up their minds

Nadav Klein<sup>a,1</sup> and Ed O'Brien<sup>b,1</sup>

<sup>a</sup>Harris School of Public Policy, University of Chicago, Chicago, IL 60637; and <sup>b</sup>Booth School of Business, University of Chicago, Chicago, IL 60637

Edited by Susan T. Fiske, Princeton University, Princeton, NJ, and approved November 2, 2018 (received for review March 27, 2018)

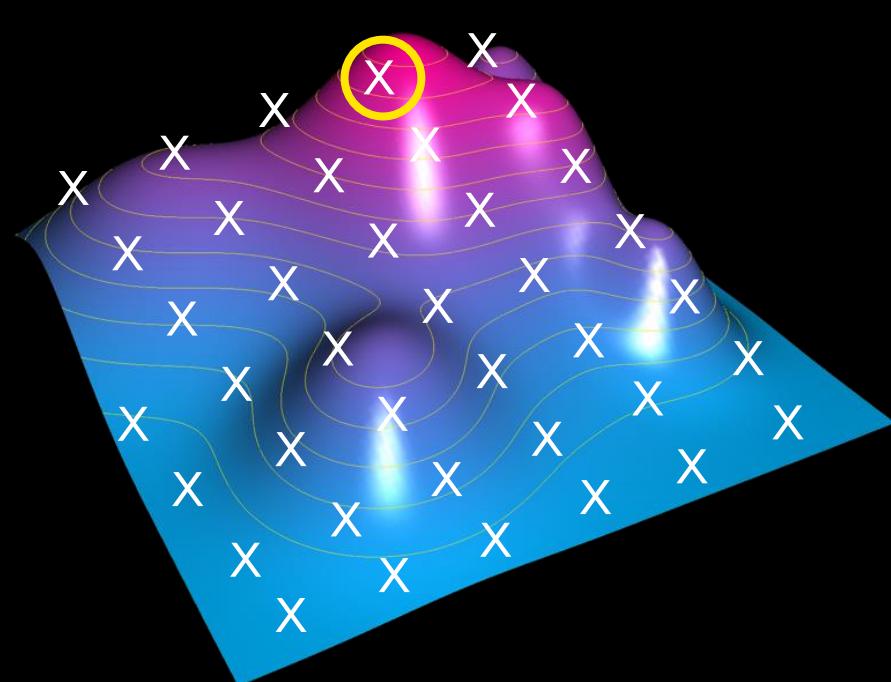
A world where information is abundant promises unprecedented opportunities for information exchange. Seven studies suggest these opportunities work better in theory than in practice: People fail to anticipate how quickly minds change, believing that they and others will evaluate more evidence before making up their minds than they and others actually do. From evaluating peers, marriage prospects, and political candidates to evaluating novel foods, goods, and services, people consume far less information than expected before deeming things good or bad. Accordingly, people acquire and share too much information in impression-formation contexts: People overvalue long-term trials, overpay for decision aids, and overwork to impress others, neglecting the speed at which conclusions will form. In today's information age, people may intuitively believe that exchanging ever-more information will foster better-informed opinions and perspectives—but much of this information may be lost on minds long made up.

critical piece of predicted versus actual tipping points. Critically, we emphasize that nearly all studies follow a “preexperience” paradigm, such that all participants, including predictors, first experience the stimulus once in full before rating it (beyond just reading a description). Thus, predictors are fully informed about “what” to imagine, with any subsequent mispredictions reflecting “how much” they thought they would need to experience before making up their minds. Studies 1 to 4 document this discrepancy across many judgments, from the (unforeseen) speed at which people form preferences to the (unforeseen) speed at which people judge others. Studies 5 to 7 highlight its problematic consequences: Gaining and providing access to information are not nearly as valuable as people think.

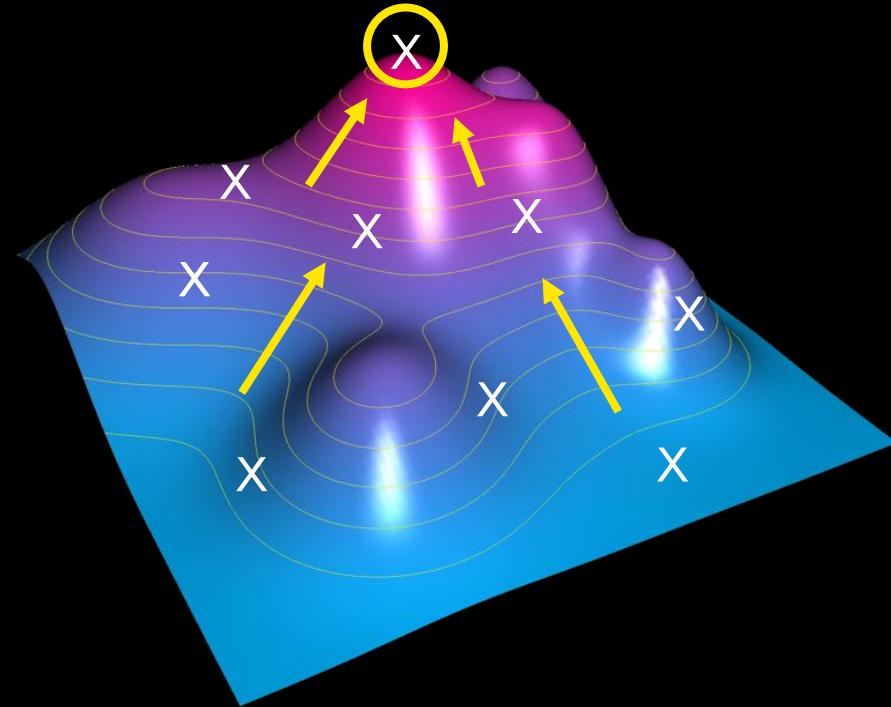
## Results

**Study 1.** In study 1, participants viewed different paintings featuring the same novel style of art, with no variation between the

# Design of Experiments (DoE)

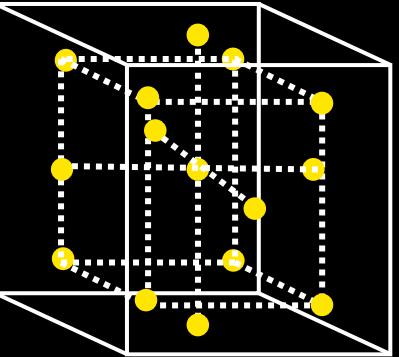


Requires high throughput  
low relevance **ASSAYS**

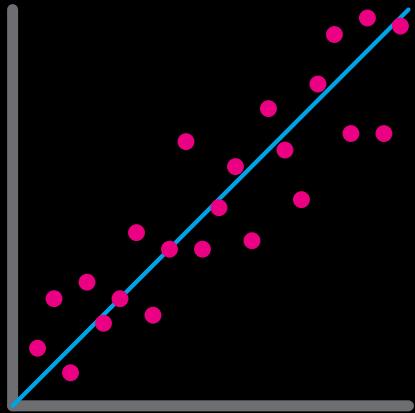


Can use low throughput  
highly relevant **ASSAYS**

## Design of Experiment



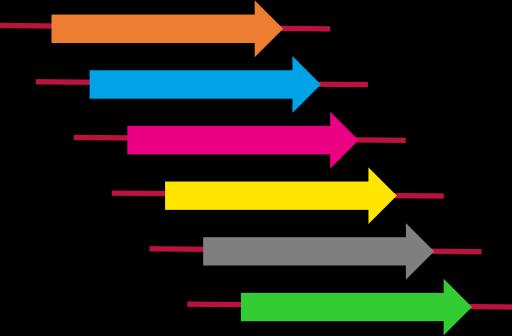
Learn



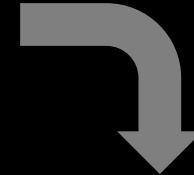
GPS  
platform



Test



Build



# DoE: variable matrix

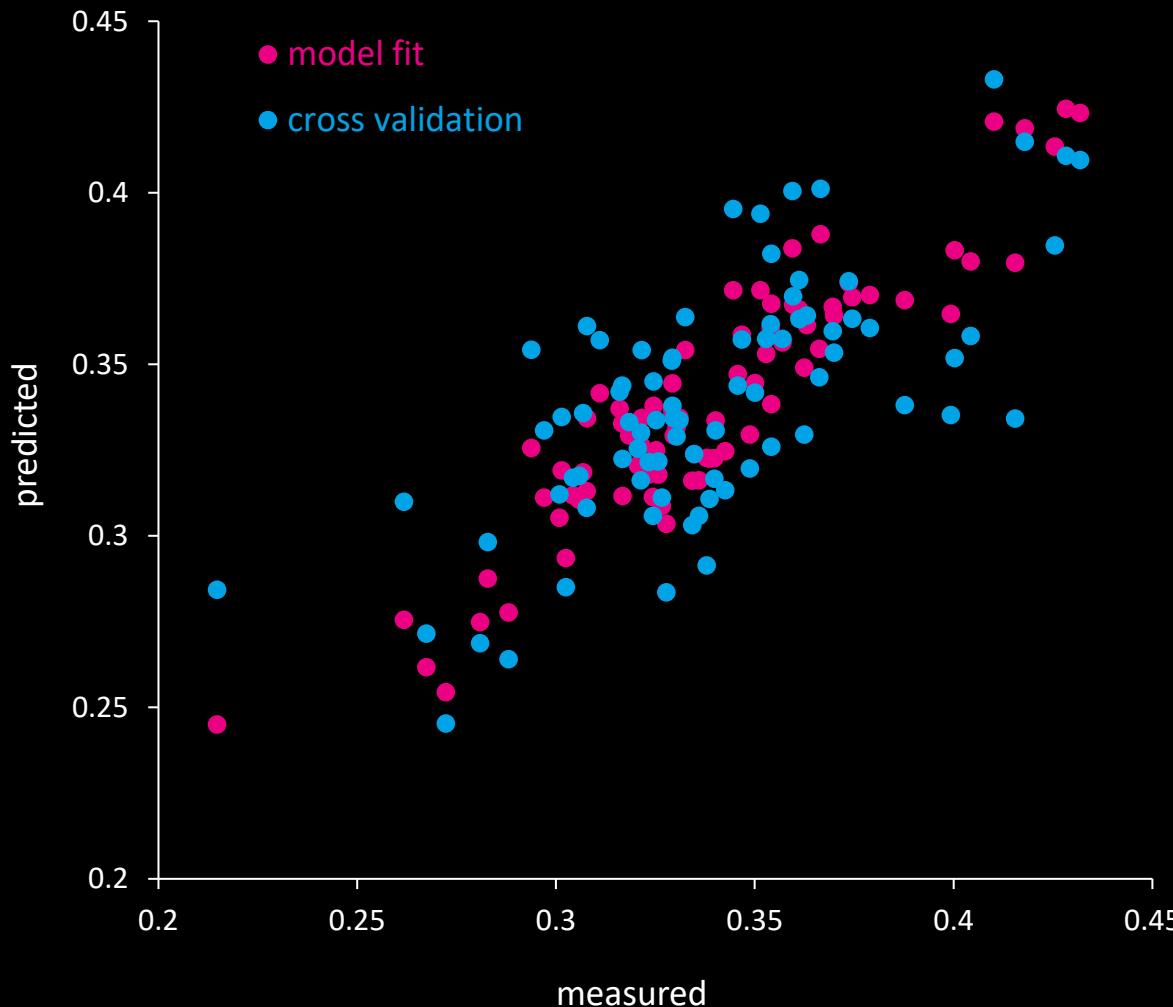
## AA substitutions (Variables)

- Target affinity
  - Cross reactivity
  - Functionality
    - blocking
    - activating
    - cell based
    - other
  - Solubility
  - Expression titer
  - Thermostability
  - Immunogenicity
  - Patentability
  - ... etc ...

... etc ...

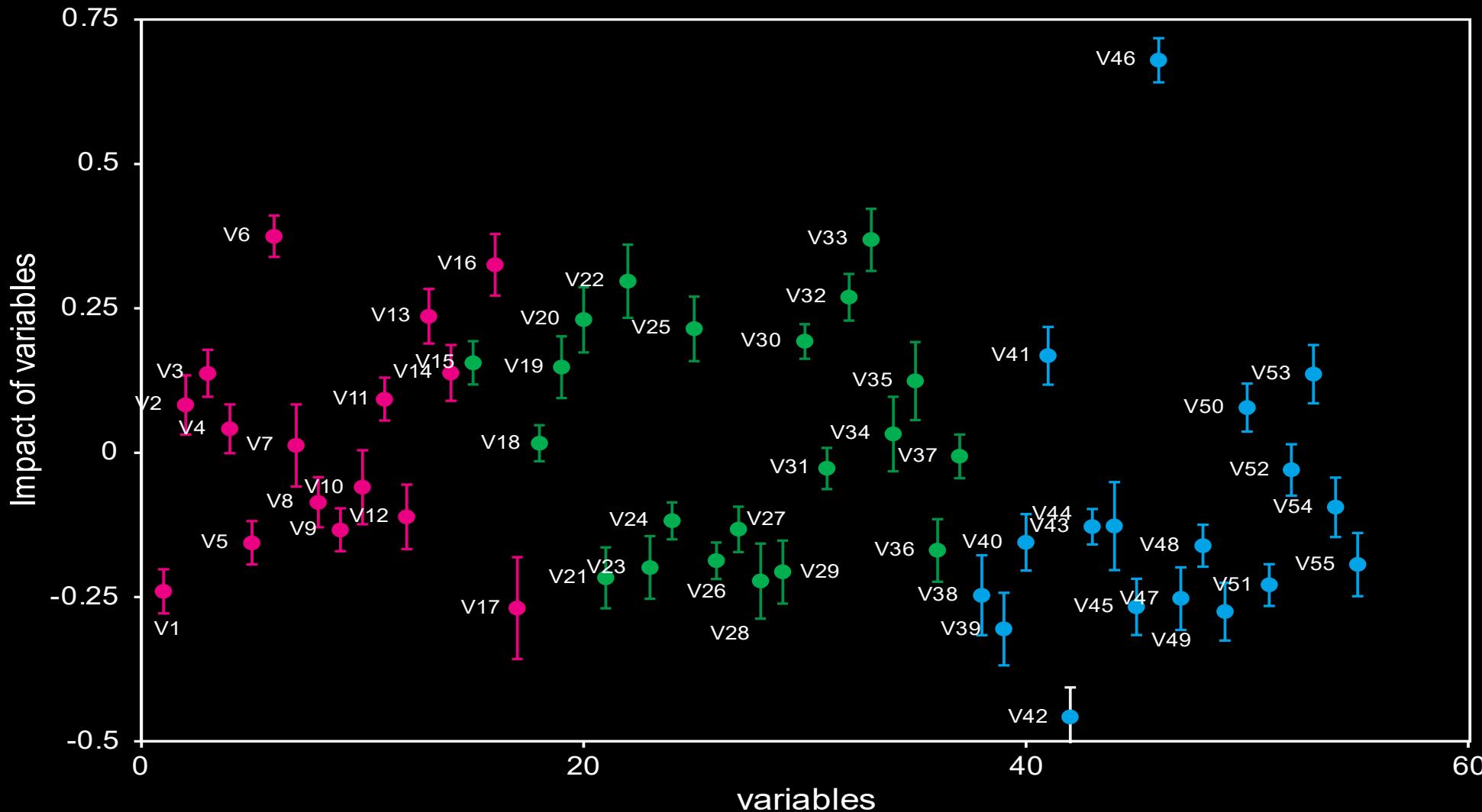


# Machine learning models



- Consensus Models from several algorithms
- Models for every measured attribute
- Models on fitness functions
- Cross-validated leaving 15% out
- ~96 variants per round

# Mapping variable impact



Quantifies  
impact of  
substitutions

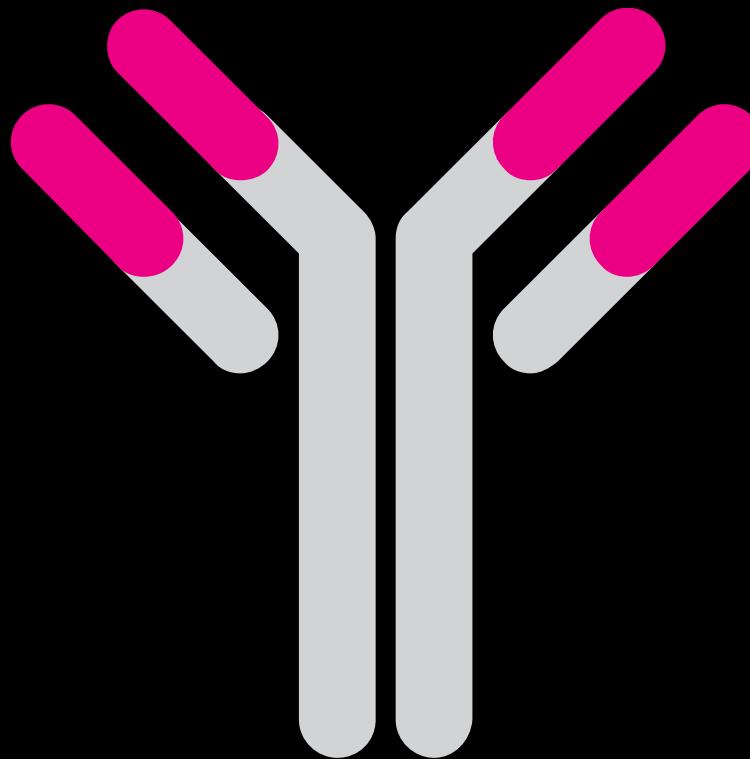
# Antibody case study

Explored space:

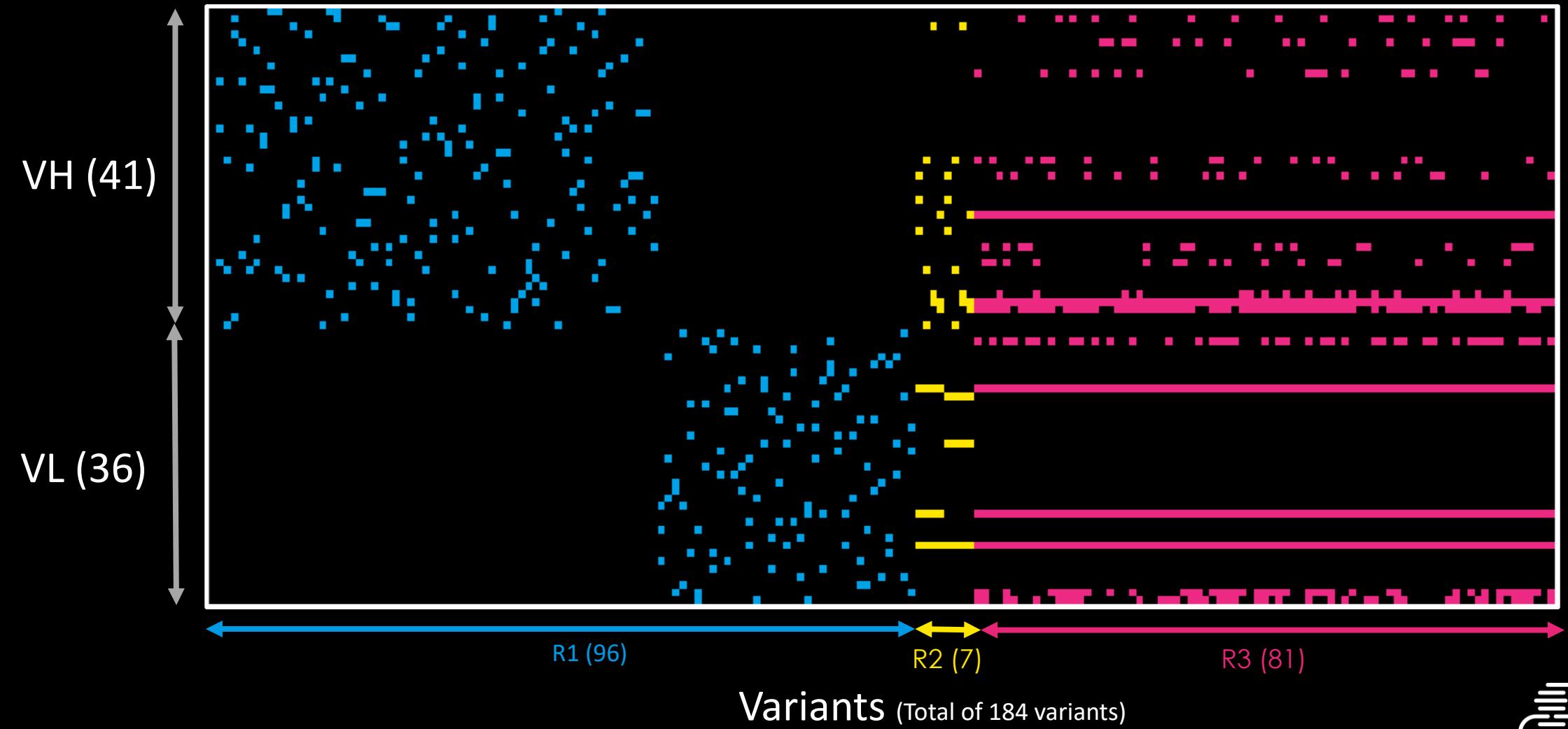
$VH = \sim 10^{12}$

$VL = \sim 10^{10}$

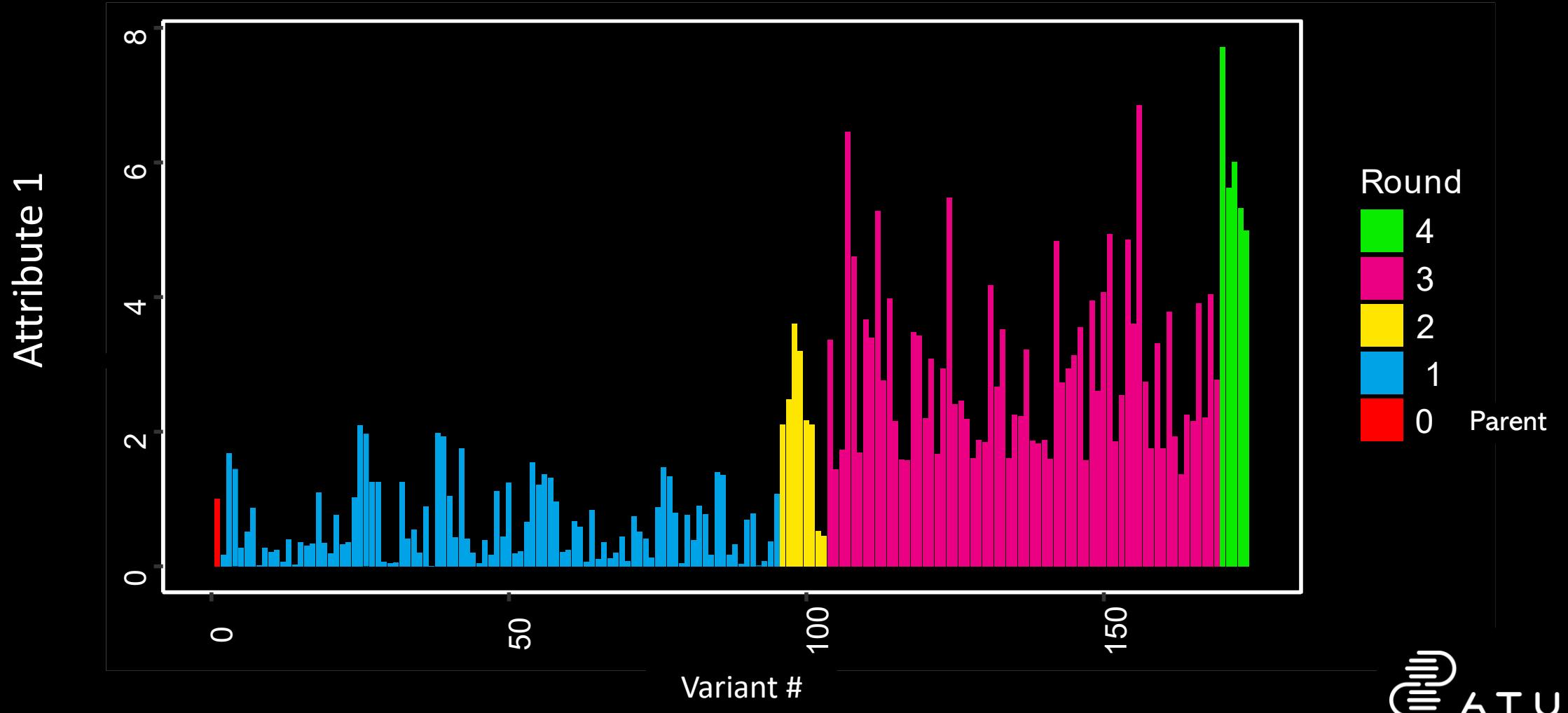
Total:  $10^{22}$



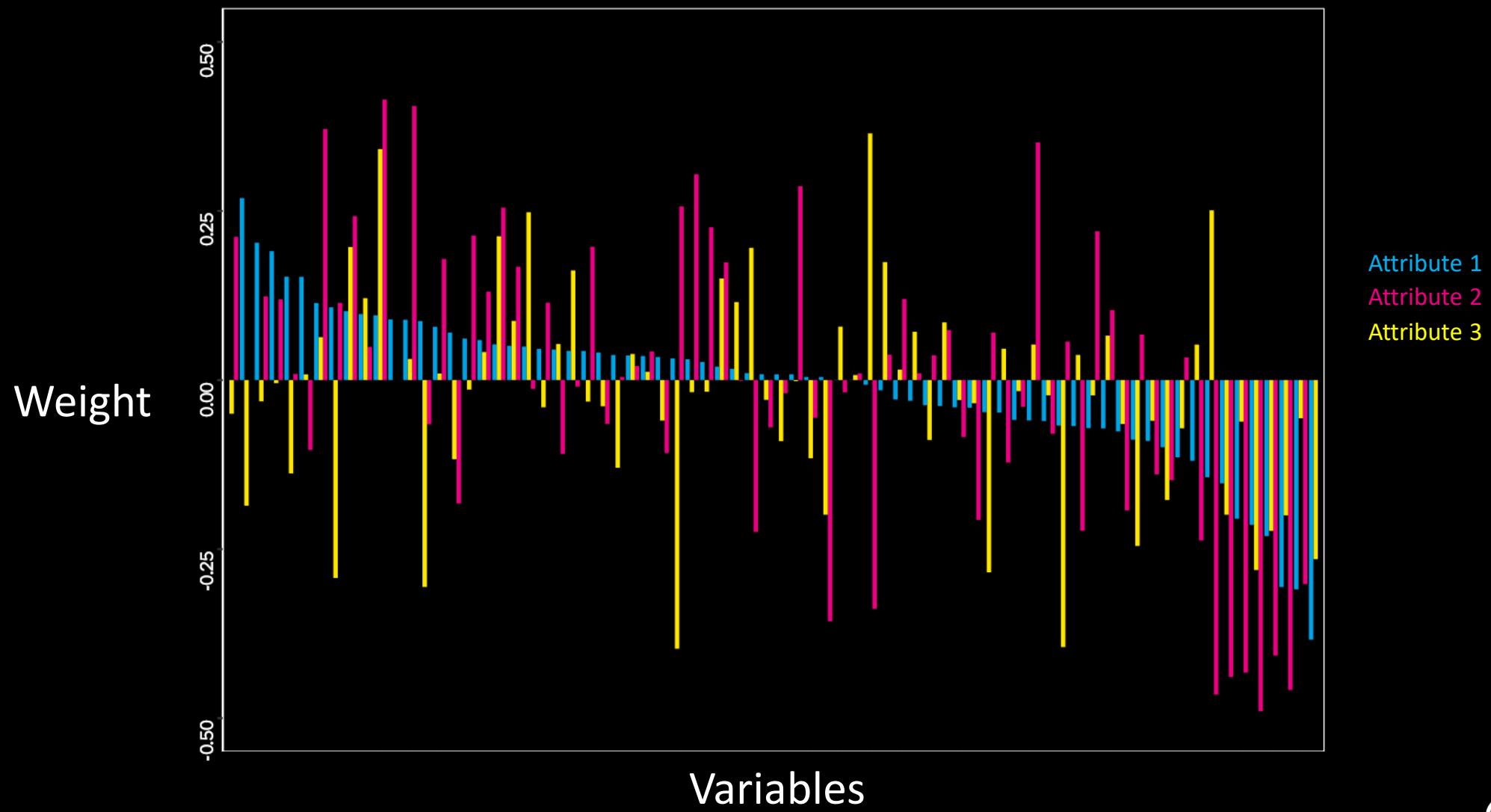
# Variable matrix



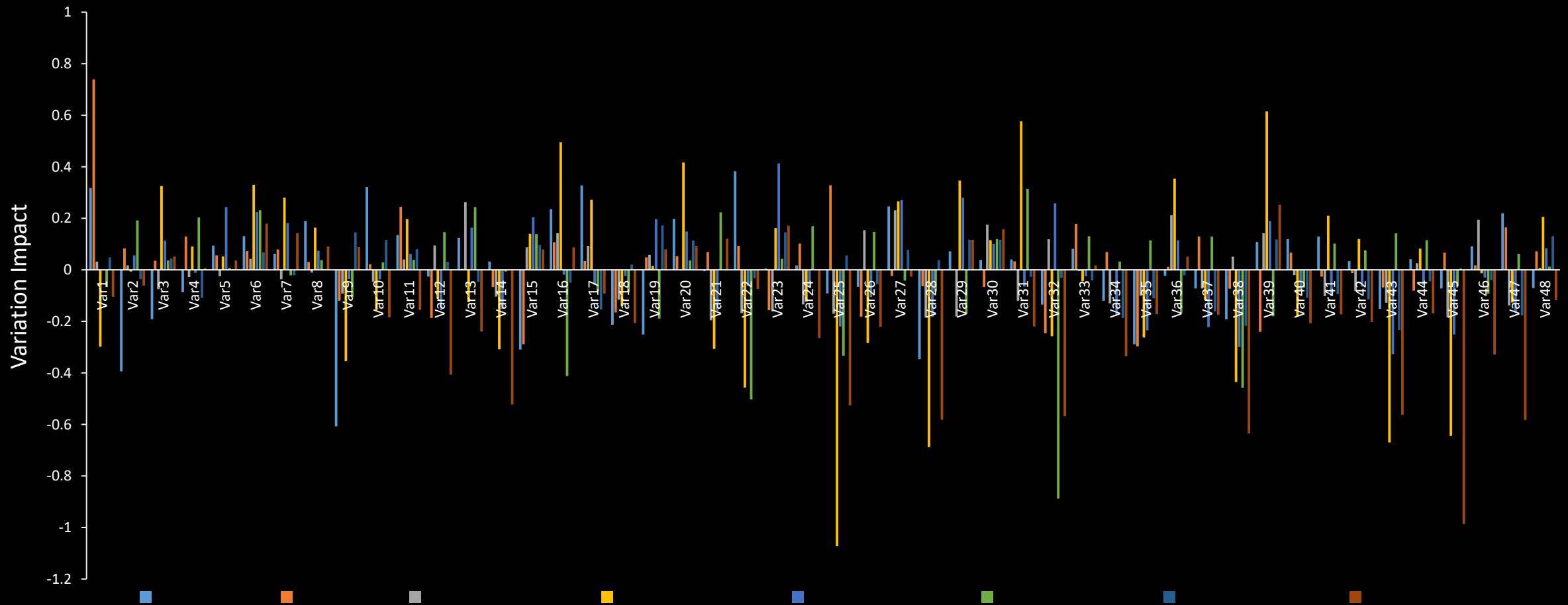
# Improvement by round



# Multi-dimensional variable weight plot



# Multi-dimensional variable weight plot

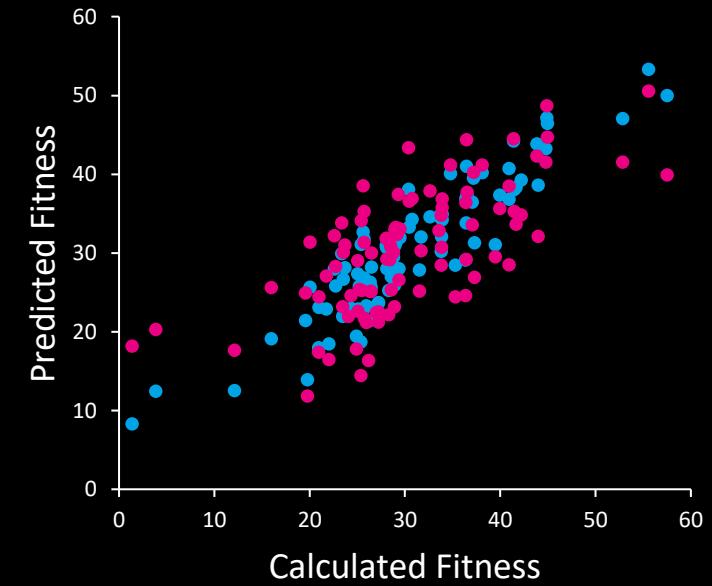
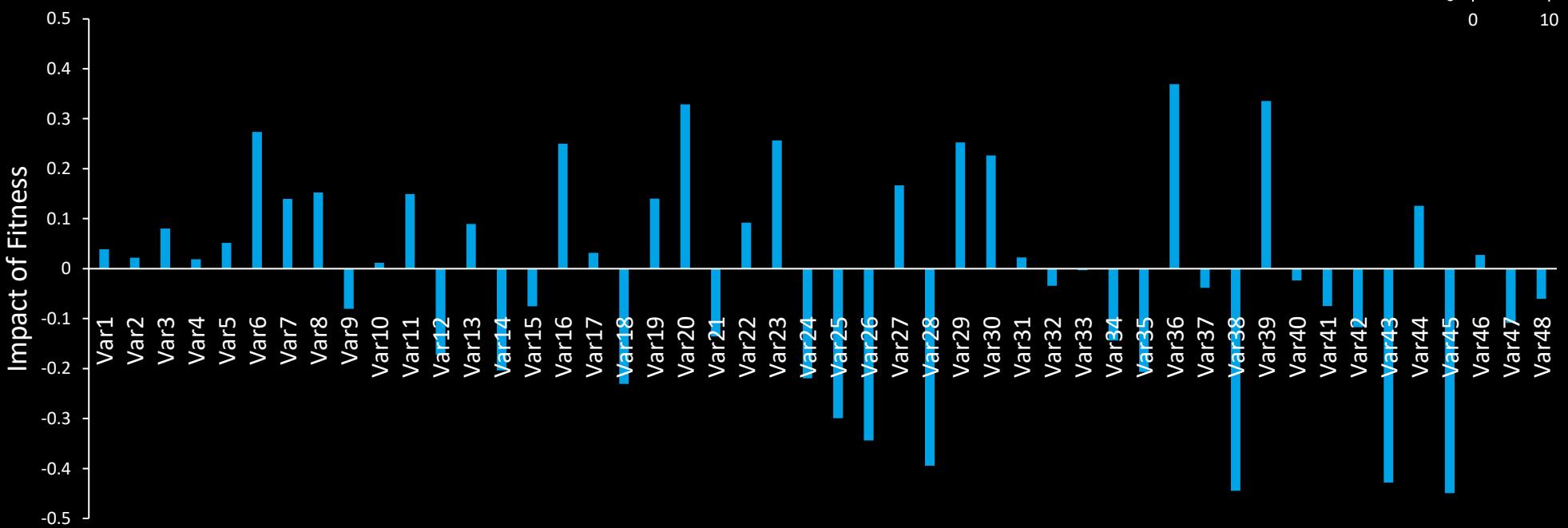


8 unique attributes / assay measurements

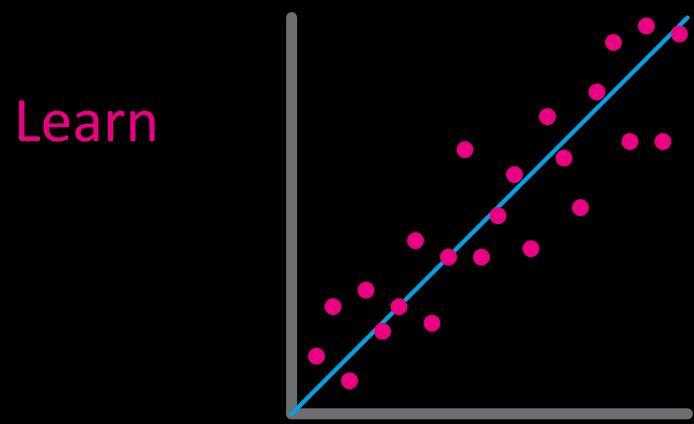
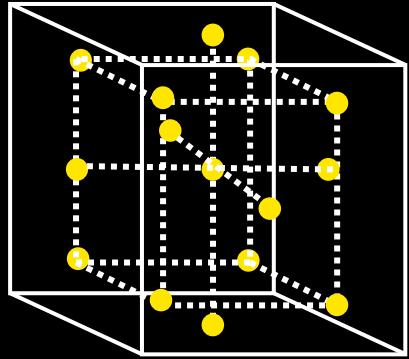
# Multi-dimensional Fitness

Fitness = 6x Function A  
1x Function B  
3x Function C  
5x Function D

2x Function E  
2x Function F  
5x Function G  
5x Function H



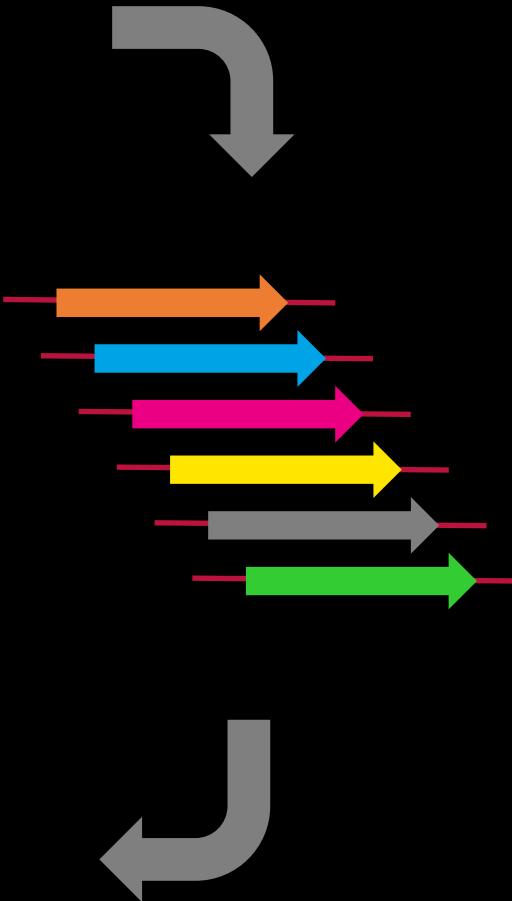
# Design of Experiment



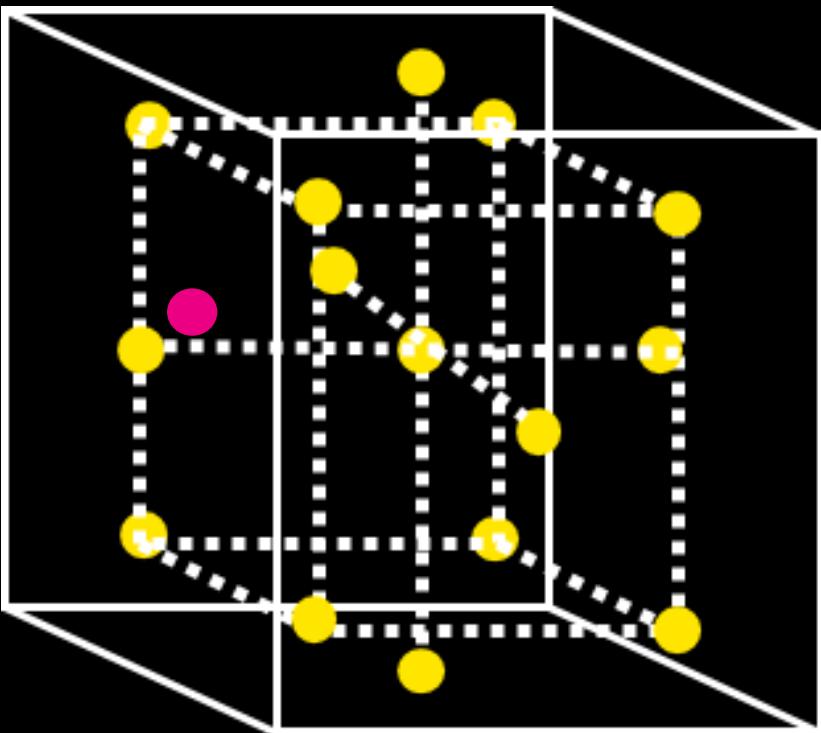
GPS  
platform



Test



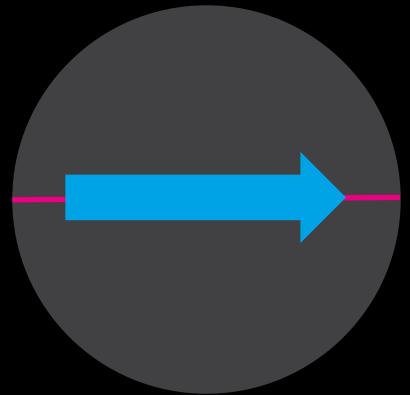
# Life is multi-dimensional



## Winner

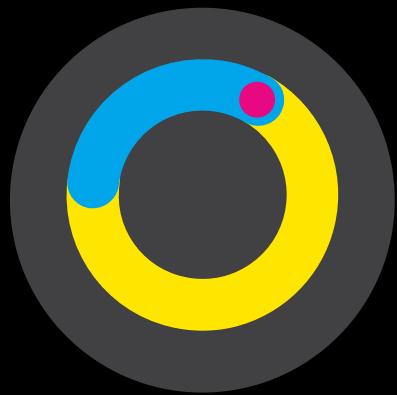
- ✓ Cell based assay
- ✓ Antigen binding
- ✓ Cross reactivity
- ✓ Aggregation
- ✓ Thermostability
- ✓ Humanized
- ✓ Solubility
- ✓ IP
- ✓ ...And more

# The GPS Platform



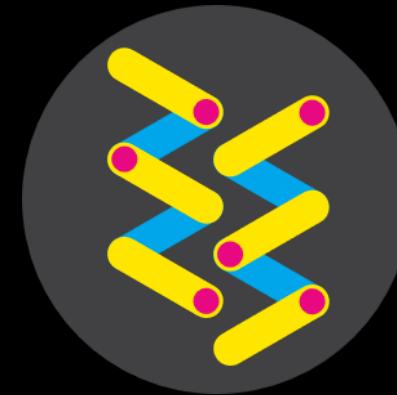
gene GPS

ORF codon optimization



vector GPS

Expression vector element  
optimization



protein GPS

Protein attribute  
optimization

# ATUM

- Gene synthesis, vectors
  - Large, complex, routine
  - Host optimized
- Protein production
  - 96-well to 100's of grams
  - mAbs to others
  - Mammalian, e. coli, other
- Protein analytics
  - MS, HPLC, CE, other
  - Developability
- Cell based assays
  - FACS, signaling, other
  - Primary immune cells
- **Cell Line Development**



# Thank You



Technology presented is protected by issued US patents 11162102, 11060109, 11060098, 11060086, 10435696, 10435696, 10344285, 10287590, 10253321, 10233454, 10041077, 9771402, 9580697, 9574209, 9534234, 9493521, 9428767, 9290552, 9206433, 9102944, 8975042, 8825411, 8635029, 8412461, 8401798, 8323930, 8158391, 8126653, 8005620, 7805252, 7561973, 7561972 and pending applications

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