



CLINICAL PROTEOMIC  
TECHNOLOGIES FOR CANCER



# Performance and Optimization of LC-MS/MS Platforms for Unbiased Discovery of Biomarker Candidates

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# A Functioning Pipeline for Cancer Biomarker Development Requires Both Discovery and Directed Assay Components

## Bio-Specimens

- Plasma
- Tissue
- Proximal fluids

## Discovery

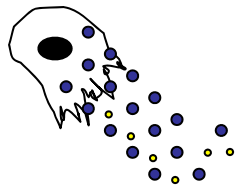
- Tissue
- Proximal fluids

## Verification

- Blood
- Population

## Clinical Validation

- Blood
- Population



- *untargeted proteomics*
- *genomics*

biomarker candidates

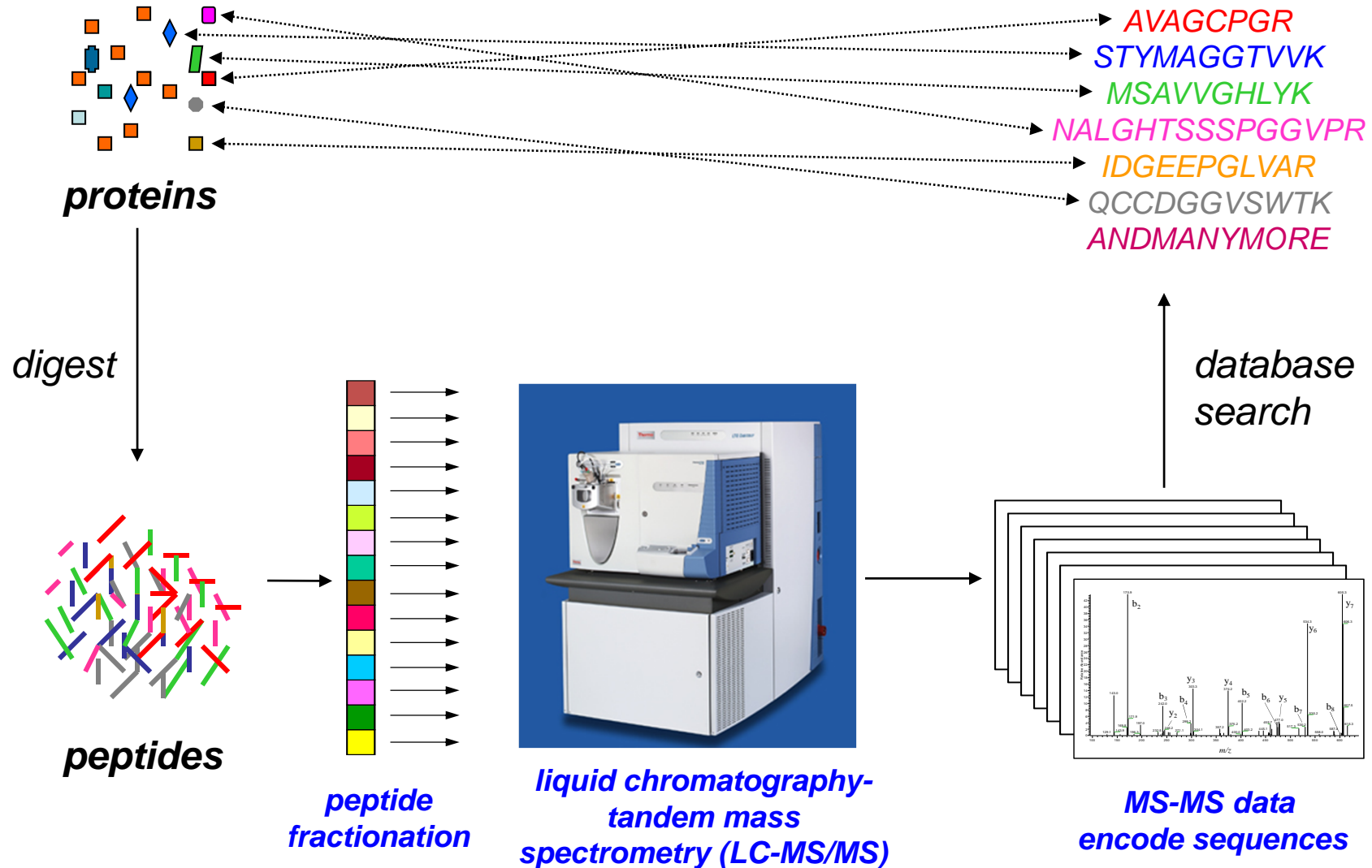
"hypotheses"

Found in blood?  
higher in cancer?

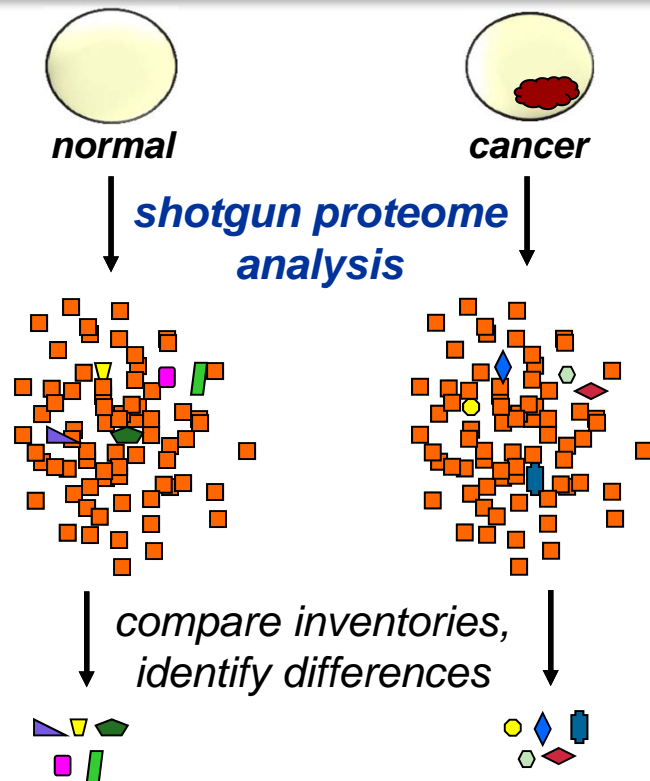
Biomarkers worth  
evaluating



# Overview of shotgun proteomics



# Shotgun proteomics for biomarker discovery



- few (<20) samples or sample pools
- low throughput
- Identify ~5,000+ proteins
- inventory differences ~50-500+ proteins

## Challenges

- $> 10^6$  range of protein concentrations in tissues, biofluids
- no technology yet capable of complete sampling of proteomes
- multiple instrument systems used
- variability in detection of proteins

***No systematic studies of variation in shotgun proteomics***  
***Impact of variation on performance for unbiased discovery unknown***

# HUPO Study

“A HUPO test sample study reveals common problems in mass spectrometry-based proteomics” *Bell et al. Nature Methods (2009) 6: 423-430*

20 protein mixture distributed to 27 labs; no standardized methods or data analysis

- only 7 labs correctly ID all 20 proteins

Coaching → reanalyses → common bioinformatics

- all 27 labs correctly ID “most” proteins

## Conclusions:

- Variable performance within and between labs
- better databases and search engines needed, as is training in their use

## ***Key questions not addressed:***

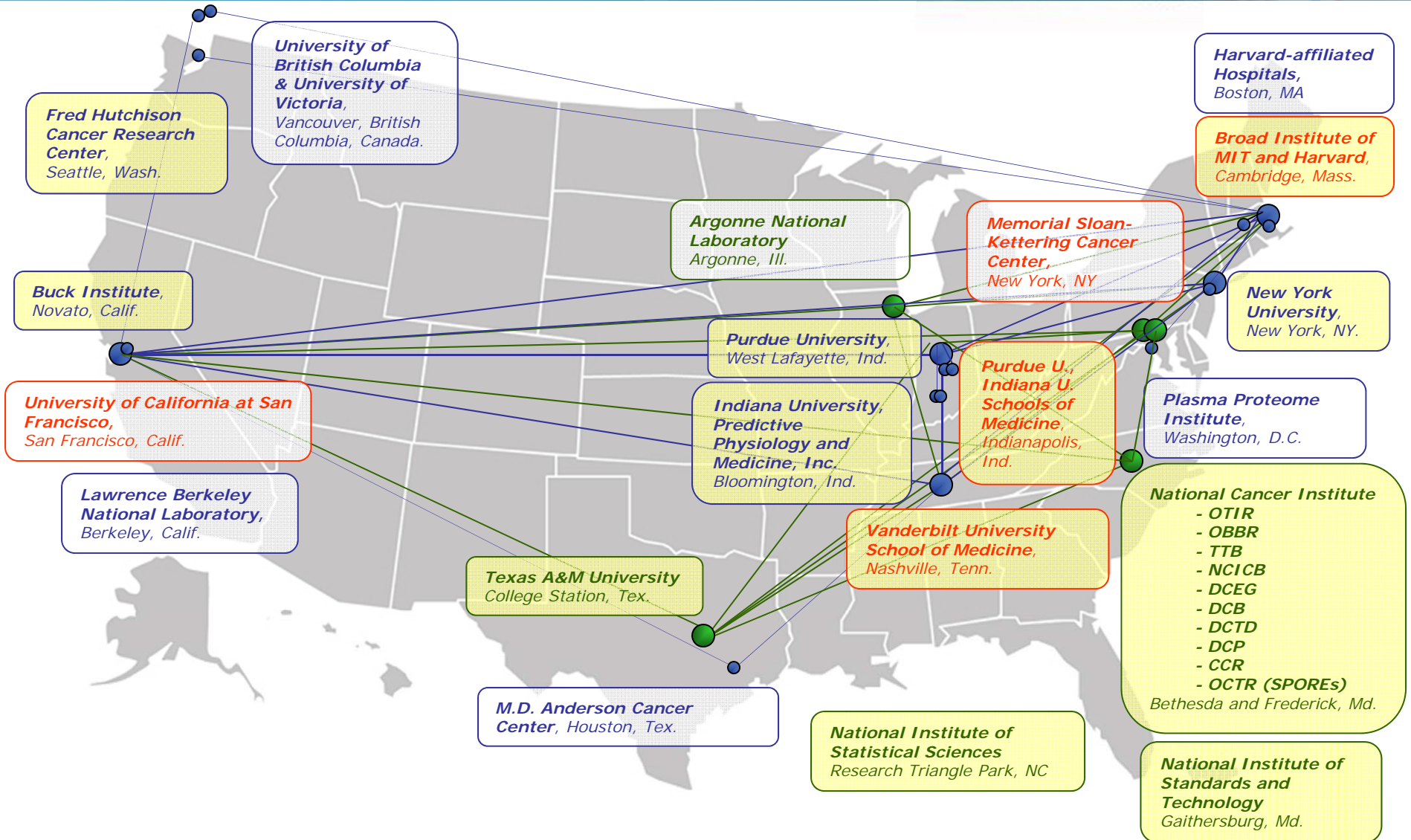
- ***Is the technology inherently variable?***
- ***What are the sources of variation?***
- ***How reproducible are analyses of complex biological proteomes?***

# CPTAC Unbiased Discovery Workgroup: Goals

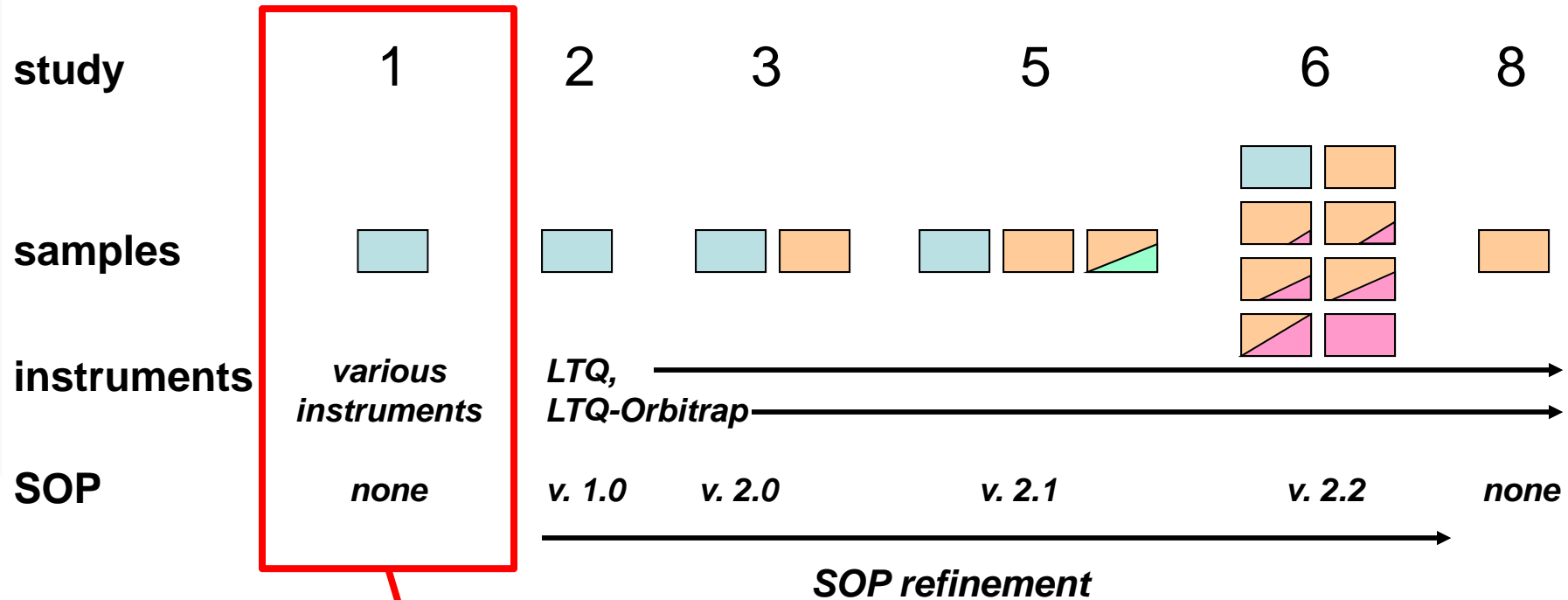
## **Evaluate and standardize performance of proteomic *discovery* platforms and standardize their use**

- **Identify and characterize sources of variation**
- **Develop quality control metrics**
- **Employ defined protein mixtures and biologically relevant proteomes**
- **Evaluate sensitivity for protein detection at defined levels of concentration**

# Discovery WG participants



# CPTAC Discovery WG studies: from simple to complex proteomes



**Equivalent to HUPO study**

yeast

- yeast w/ BSA spike
- yeast w/ Sigma UPS spikes

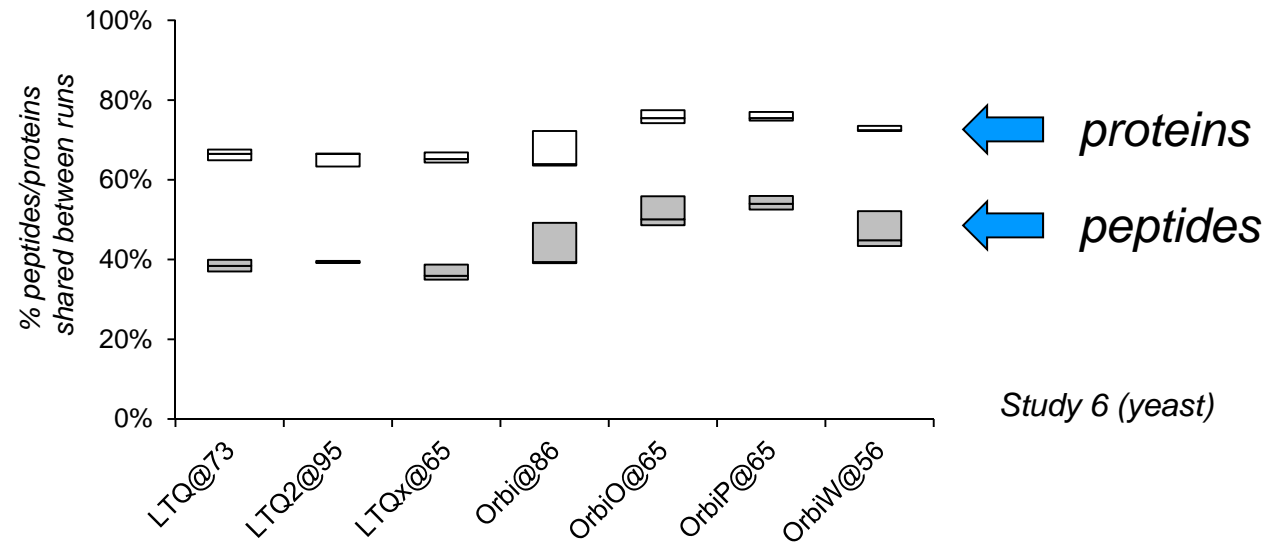
**Sample complexity**



# Repeatability and reproducibility are robust across laboratories

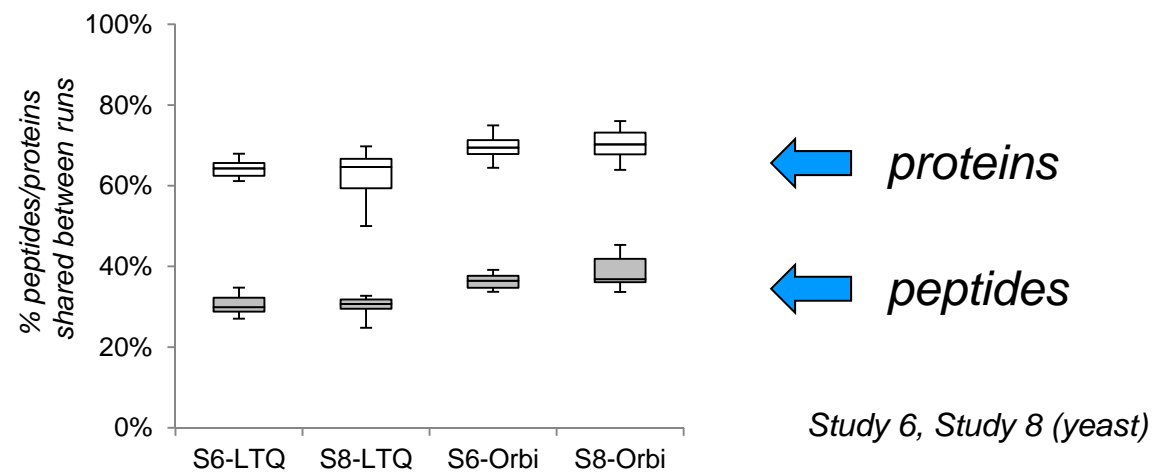
Run-to-run repeatability in analyses of yeast across 7 instruments/sites

**65-80% of protein IDs repeat between runs on individual instruments**



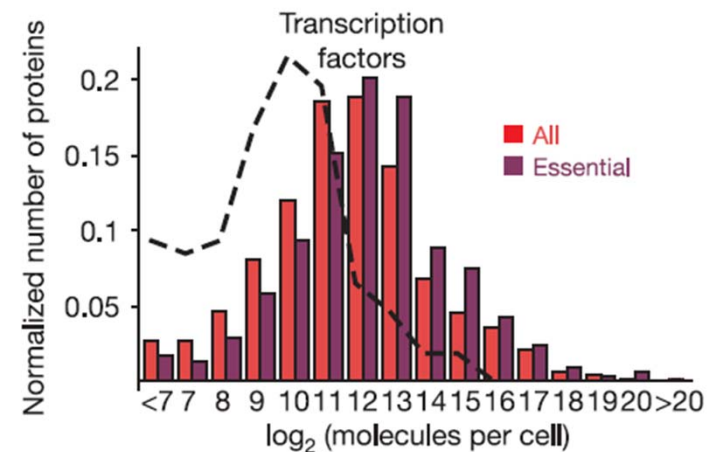
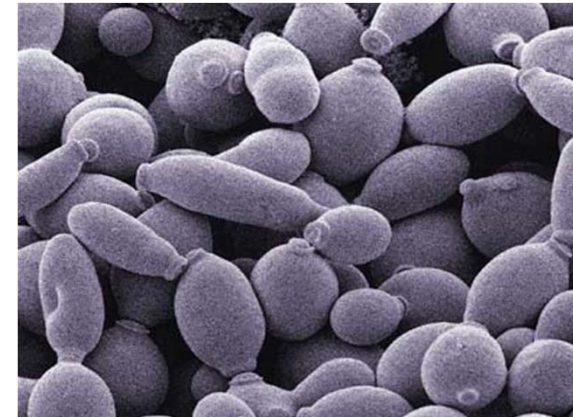
Interlaboratory reproducibility

**65-70% of protein IDs are reproduced across multiple instruments**



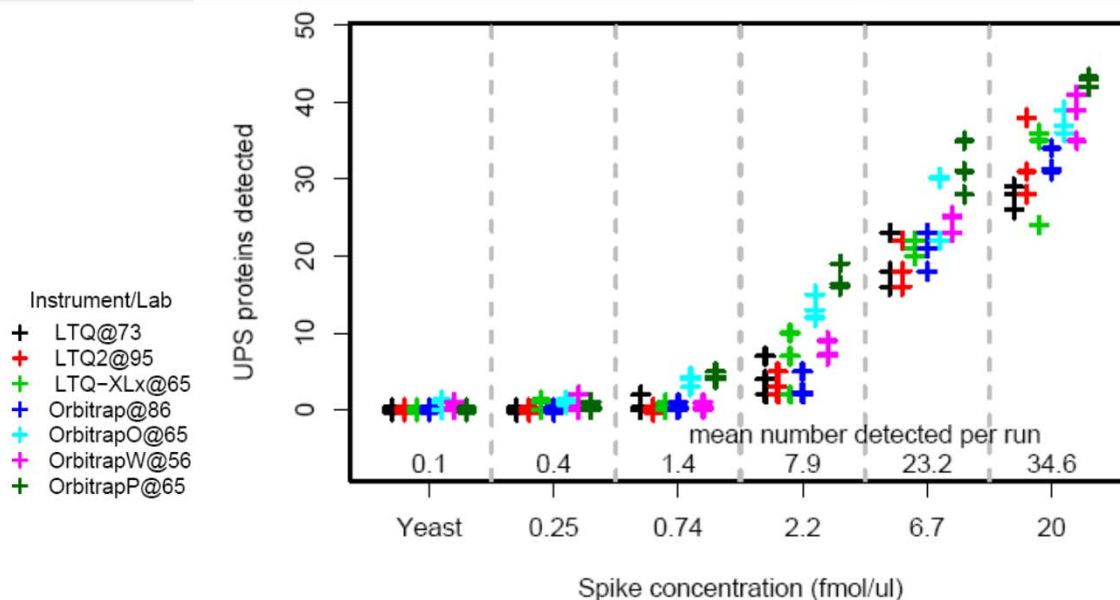
# *Saccharomyces cerevisiae* proteome reference material

- **Complex protein matrix (6,000 ORFs)**
- **Reproducible preparation possible**
- **Quantitative TAP tag studies (Ghaemmaghmi, S. et al. (2003) Nature 425, 737-741) provide calibration for expression levels**
- **Statistical power for modeling depth of coverage by proteomics platforms**
- **Use with human protein spikes enables modeling for biomarker discovery applications**
- **Made available to proteomics community (NIST)**



Ghaemmaghmi, S. et al. (2003) Nature 425, 737-741

# Modeling detection of human protein “biomarker” spikes in yeast matrix

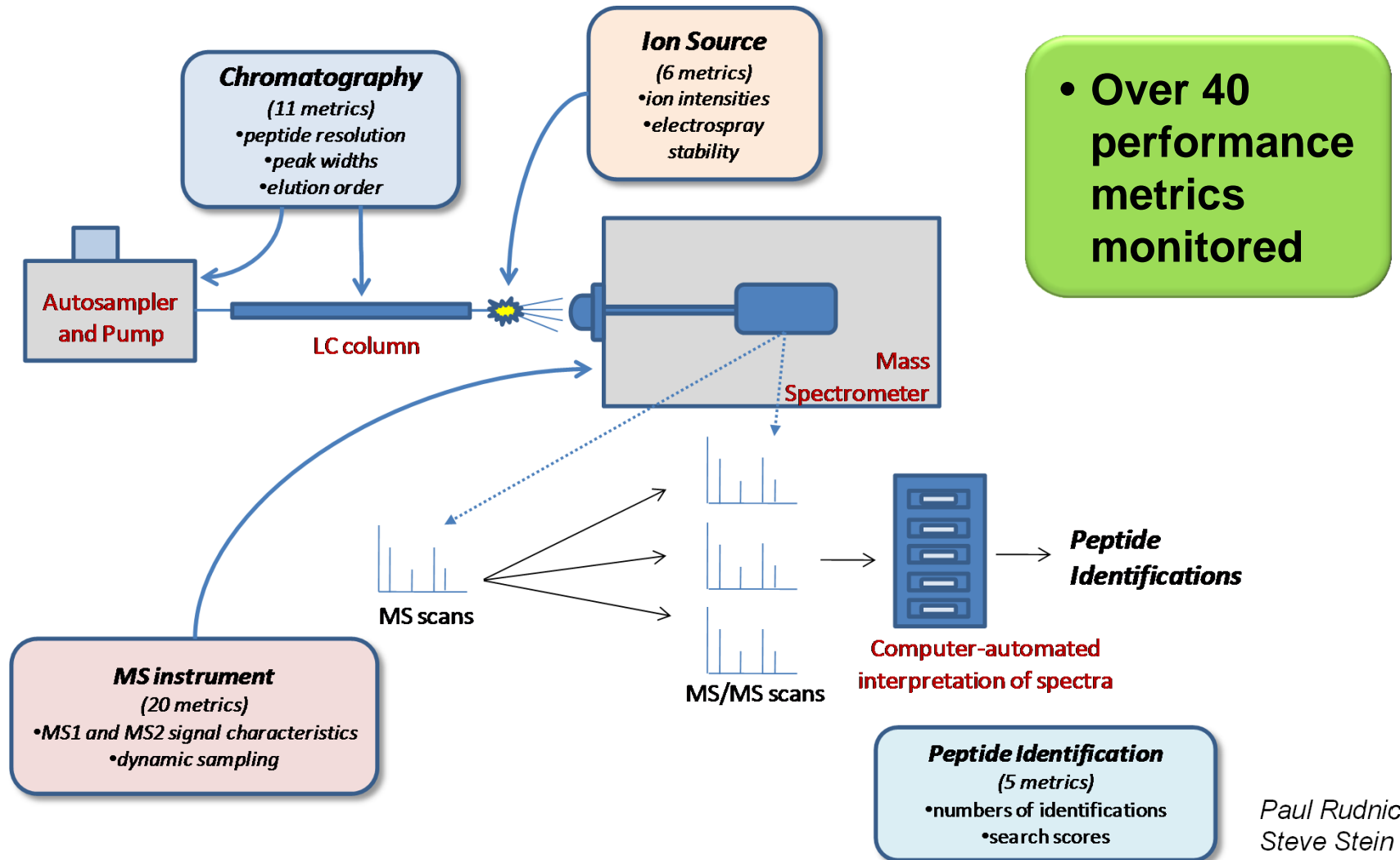


• 48 human protein (UPS) spikes in yeast proteome background

• “simple” discovery system distinguishes differences equivalent to 0.5 – 1.3% of proteome

Case Sample	# identified biomarkers <sup>b</sup>	# true positives <sup>c</sup>	# true negatives <sup>d</sup>	# false positives <sup>e</sup>	# false negatives <sup>f</sup>	Sensitivity <sup>g</sup>	Specificity <sup>h</sup>
Study 6 SOP (yeast+ 0.25 fmol / ul UPS)	0	0	2522	0	48	0.0	1.0
Study 6 SOP (yeast+ 0.74 fmol / ul UPS)	3	3	2522	0	45	0.1	1.0
Study 6 SOP (yeast+ 2.2 fmol / ul UPS)	17	17	2522	0	31	0.4	1.0
Study 6 SOP (yeast+ 6.7 fmol / ul UPS)	32	32	2522	0	16	0.7	1.0
Study 6 SOP (yeast+ 20 fmol / ul UPS)	43	41	2520	2	7	0.9	1.0

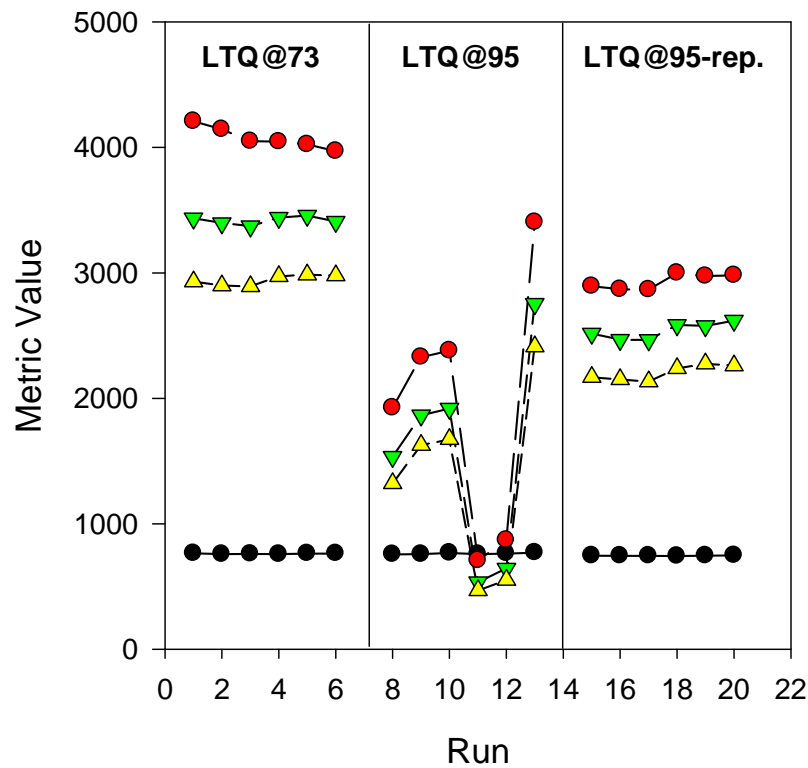
# System map of LC-MS performance metrics



Paul Rudnick  
Steve Stein  
(NIST)

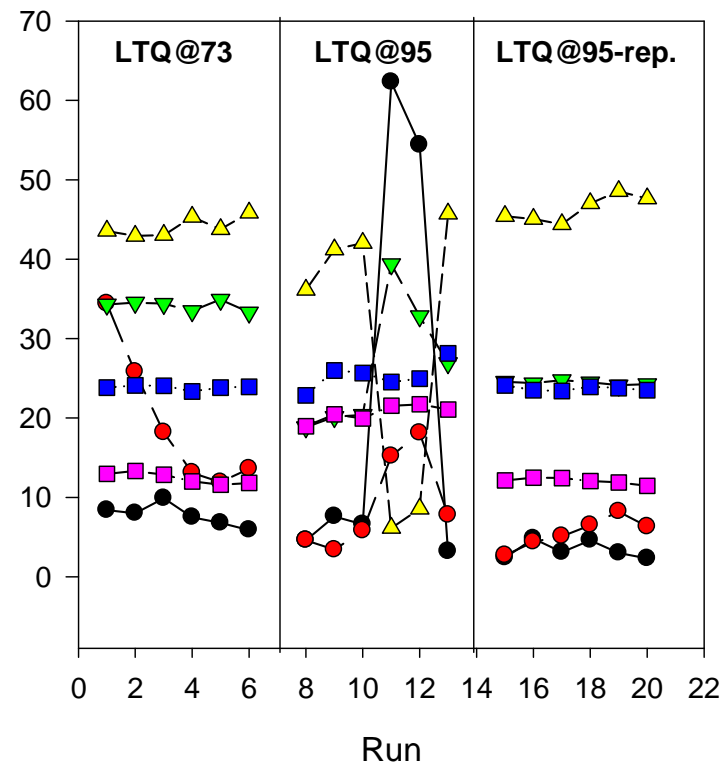
# Diagnosing and correcting system malfunction

## Peptide Identification



- P-1 (med. f-value score for IDs) \*1,000
- P-2A (total IDs)
- ▼ P-2B (unique ion IDs)
- ▲ P-2C (unique peptide IDs)

## Chromatography



- C-1A ('bleed' -4 min.) %\*100
- C-1B ('bleed' +4 min.) % \*100
- ▼ C-2A middle 50% pep RT period
- ▲ C-2B rate (peptides/min.) over C-2A
- C-3A med. peak width
- C-3B (dispersion for peak widths)

# CPTAC Unbiased Discovery Workgroup: Key Achievements

- 1. First systematic, SOP-driven study of LC-MS/MS analytical systems across multiple laboratories**
- 2. Quantitative assessment of repeatability and reproducibility in peptide vs. protein detection**
- 3. Yeast reference proteome standard and accompanying datasets**
- 4. Yeast reference proteome with spikes enables quantitative modeling of power to discover biomarker candidates**
- 5. Performance metrics and software (“toolkit”) to monitor and troubleshoot system performance**

# Next steps for Discovery WG

## Evaluate performance of platforms to discriminate between cancer-relevant phenotypes

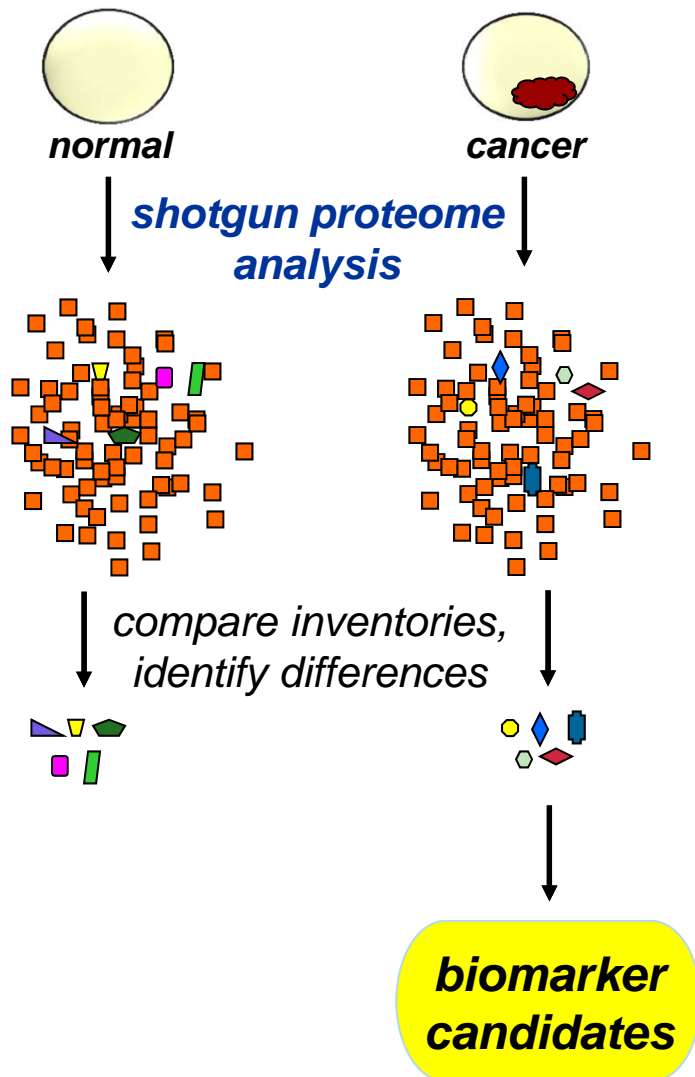
- Phase II Studies
  - Human breast cancer cell model; responses to TKI
  - Compare commonly employed quantitative methods for survey of differences
- Phase III studies
  - Human tumor tissue specimens corresponding to defined clinical phenotypes
    - Evaluate phenotype discrimination
    - Implement methods, metrics and approaches developed in Phase I, Phase II studies

# Backups





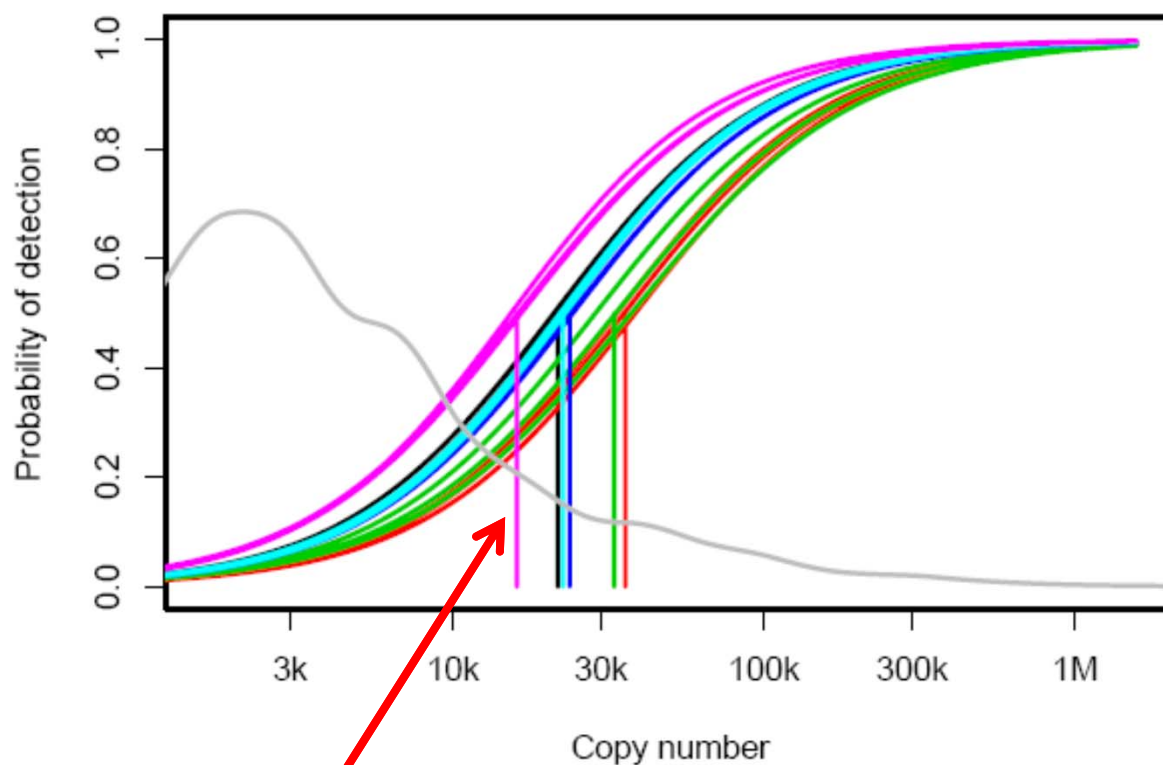
# Why care about reproducibility in discovery proteomics?



1. Biomarker candidates come from comparing proteomes from different phenotypes
2. Need to know whether observed differences are due to biology or to variability in the analytical system.

# Yeast proteome enables calibration and comparison of detection efficiency

a. Study 8 high load



***CN<sub>50</sub> = copy number with  
50% detection probability***

- Instrument/Lab
- LTQ@73
  - LTQ2@95
  - LTQ-XLx@65
  - Orbitrap@86
  - OrbitrapO@65
  - OrbitrapW@56
  - OrbitrapP@65

# Metrics identify the greatest sources of variability

## CPTAC Study5 Intralaboratory Variability 3LTQs, 3 Orbitraps, 6 replicates each

