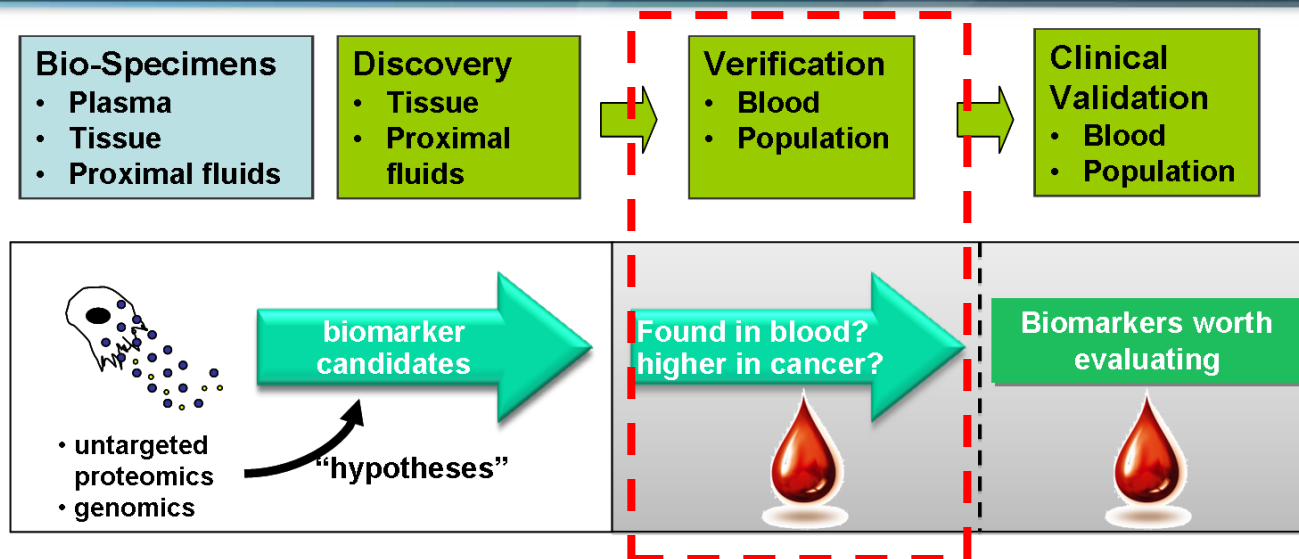


Meeting the Design, Development and Implementation Challenges of >100-Plex Quantitative Assays for Proteins in Plasma: A Large-Scale, NCI-CPTAC Interlaboratory Study

Susan E. Abbatiello, Birgit Schilling, Lisa Zimmerman, Corbin Whitwell, Brendan MacLean, Daniela Tomazela, Pawel Sadowski, Angela Jackson, Mousumi Ghosh, Hasmik Keshishian, Terri A. Addona, Jeffrey R. Whiteaker, Simon Allen, Michael Burgess, Xingdong Feng, Nell Sedransk, D.R. Mani, Steven C. Hall, Steven A. Carr, CPTAC Network

CPTAC – Clinical Proteomic Technologies Assessment for Cancer



NCI established CPTC October 2006 to Support Biomarker Development

- Evaluate and standardize proteomic validation platforms for analysis of cancer-relevant proteomic changes in human clinical specimens.

Is SID-MRM-MS Technology Reproducible, Transferrable, and Sensitive? Yes!

Candidate Protein Biomarkers

Define "Signature peptides" for candidate biomarkers

Synthesize $^{13}\text{C}_6$ -labeled versions of signature peptides for use as internal standards

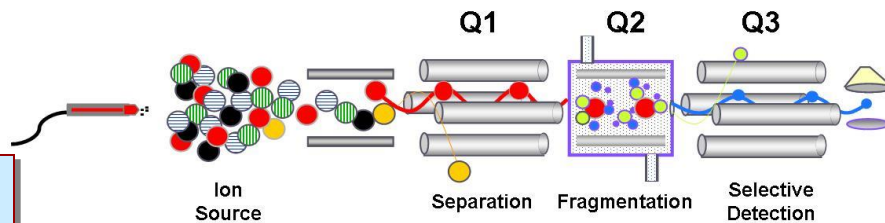
- Observed ratio gives precise, relative quantitation across samples
- 10's to 100's peptides can be simultaneously quantified

Whiteaker, et al, JPR 2007.....Breast cancer
Keshishian et al, MCP, 2007 and 2009....Cardiovascular markers
Hoofnagle et al, Clin. Chem. 2008.....Thyroglobulin
Addona et al, Nat. Biotech. 2009.....Interlab study
Kuhn et al, Clin Chem 2009.....IL-33, Troponin I
Williams et al, JPR 2009.....C-Reactive Protein
Ossola et al, Methods Mol. Bio., 2011....Glycated peptides
Selevsek et al, Proteomics, 2011.....Urine proteins

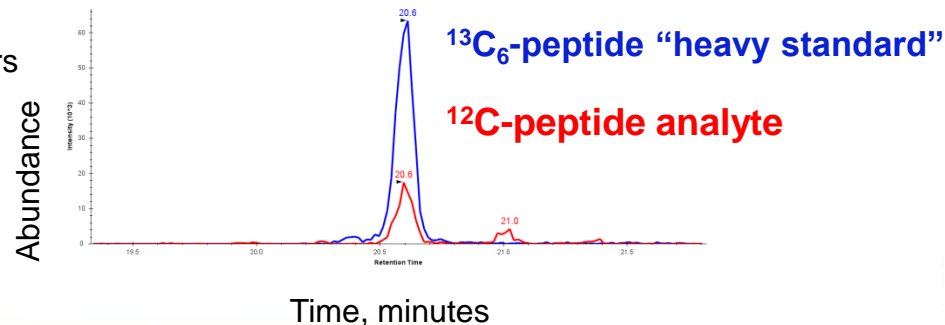
Spike heavy ($^{13}\text{C}_6$)-labeled peptides



MRM-MS



Ratio ^{13}C -peptide to ^{12}C -peptide by SID-MRM-MS



Pushing the Envelope in SID-MRM-MS Technology

Reproducibility:

Steady retention times and peak areas

Transferability:

Easy method transfer between laboratories

Throughput:

Rapid analysis time or larger number of targets per assay

Sensitivity:

Low ng/mL quantitation limits in plasma

Accuracy:

Getting as close to absolute quantification as possible

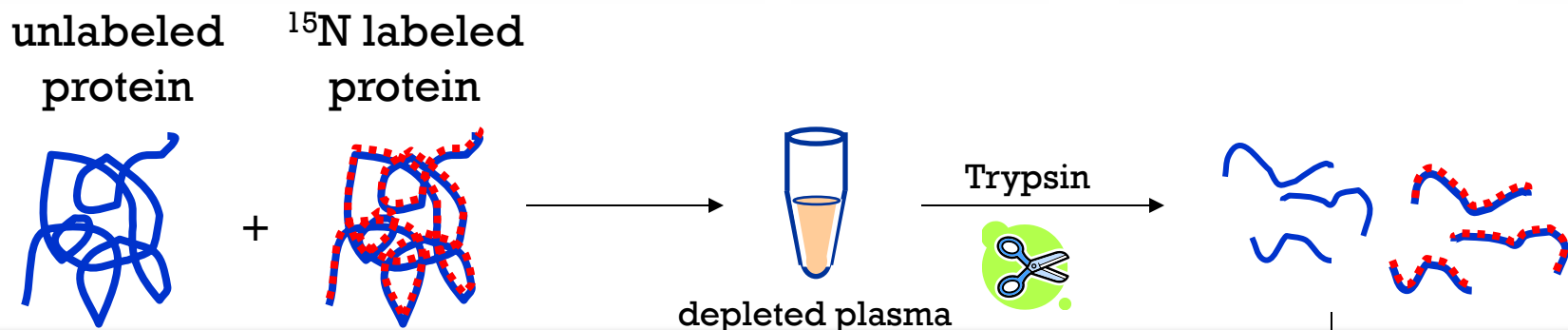
Minimizing Subjectivity and Manual Intervention:

Automated data quality filtering and interference detection

Statistical Pipeline:

Streamlined data processing/analysis for LOD/LOQ, variability, figures of merit

CPTAC VWG Study 9 – Targeting 35 Proteins in Depleted Plasma, 123 Peptide Targets



Goals:

- Demonstrate cancer relevancy
- Prove feasibility of > 100-plex (34 proteins) assays in plasma
- Improve LOD and LOQ by depleting abundant proteins
- Demonstrate true quantitative accuracy and evaluate depletion/digestion recovery using heavy labeled proteins
- Conduct blinded verification study to assess accuracy, precision and reproducibility across multiple sites and instrument platforms
- Evaluate system suitability test in context of this large-scale inter-lab study

35 proteins, 10 participating sites, 15 instruments, 4 Vendors

From 10's of Peptides to 100's of Peptides: It's a Different Game

- **^{15}N Protein Characterization**
- **Automated transition selection**
- **Autointerference**
- **Retention time shift**
- **Digestion**
- **Calculating LOD/LOQ – how many points in curve?**
- **Automated data processing**

Protein Targets

- | | |
|--------------------------------------------|--------------------------------------|
| (5) Aldolase C | (5) Heat Shock 27 kDa Protein 1 |
| (5) Annexin A1 | (5) Interleukin 18 |
| (5) Annexin A4 | (5) PDZ and LIM/ELFIN/CLIM1/CLP36 |
| (5) Annexin A7 | (4) Peroxiredoxin 2 |
| (5) Calreticulin | (4) Peroxiredoxin 4 |
| (5) Chloride Intracellular Channel 1 | (1) Protein S100-A1 |
| (5) Ezrin | (2) Protein S100-A2 |
| (5) Fascin Homolog 1 | (2) Protein S100-B |
| (2) Ferritin Light Chain | (3) RAD23 Homolog B |
| (5) Flap structure-specific endonuclease I | (4) Synuclein, gamma |
| (5) Galectin | (4) Tropomyosin 1 |
| (5) Glutathione S-transferase pi | (5) Ubiquitin conjugating enzyme E2C |
| (5) Glyoxalase I | (4) Ubiquitin conjugating enzyme E2I |
| (5) Growth Factor Receptor Bound Protein 2 | |

Control Proteins

- | | |
|----------------------------|--------------------------|
| (1) Aprotinin | (1) Leptin |
| (2) C-reactive protein | (2) Myelin basic protein |
| (1) Horseradish peroxidase | (1) Myoglobin |

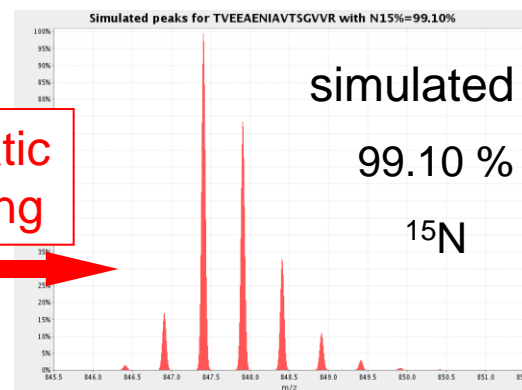
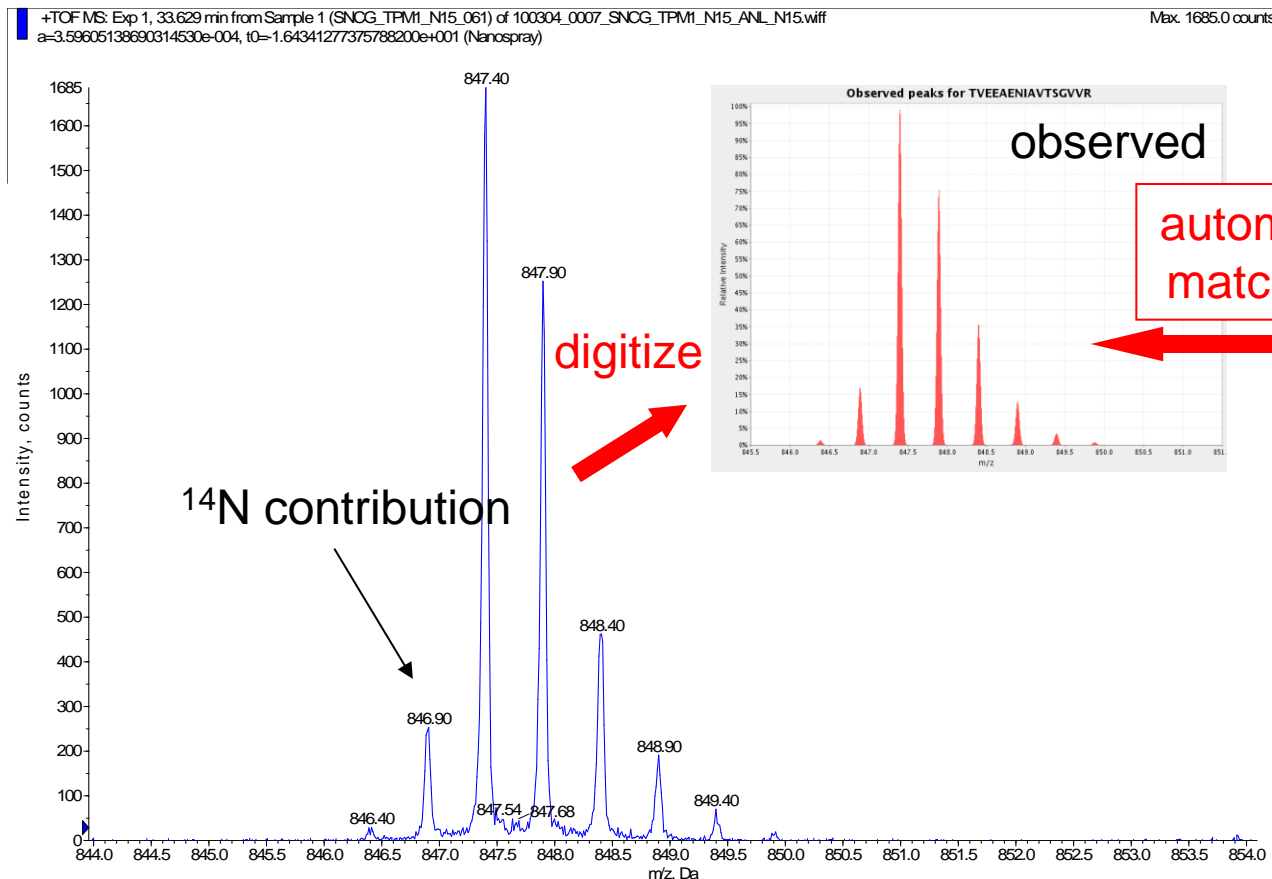
Protein Standard Characterization

Data-dependent MS experiments searched against a database

15N Distinct Peptides (#)	14N Distinct Peptides (#)	Protein Name
30	29	Annexin A1 OS=Homo sapiens GN=ANXA1 PE=1 SV=2
36	29	Annexin A4 OS=Homo sapiens GN=ANXA4 PE=1 SV=4
18	17	Chloride intracellular channel protein 1 OS=Homo sapiens GN=CLIC1 PE=1 SV=4
	33	Ezrin OS=Homo sapiens GN=EZR PE=1 SV=4
25	32	Fascin OS=Homo sapiens GN=FSCN1 PE=1 SV=3
28	27	Fructose-bisphosphate aldolase C OS=Homo sapiens GN=ALDOC PE=1 SV=2
11	9	Galectin-1 OS=Homo sapiens GN=LGALS1 PE=1 SV=2
16	14	Gamma-synuclein OS=Homo sapiens GN=SNCG PE=1 SV=2
18	18	Growth factor receptor-bound protein 2 OS=Homo sapiens GN=GRB2 PE=1 SV=1
14	17	Heat shock protein beta-1 OS=Homo sapiens GN=HSPB1 PE=1 SV=2
16	11	Interleukin-18 OS=Homo sapiens GN=IL18 PE=1 SV=1
18	15	Peroxiredoxin-2 OS=Homo sapiens GN=PRDX2 PE=1 SV=5
15	16	Peroxiredoxin-4 OS=Homo sapiens GN=PRDX4 PE=1 SV=1
7	9	SUMO-conjugating enzyme UBC9 OS=Homo sapiens GN=UBE2I PE=1 SV=1
28	25	Tropomyosin alpha-1 chain OS=Homo sapiens GN=TPM1 PE=1 SV=2
11	12	Ubiquitin-conjugating enzyme E2 C OS=Homo sapiens GN=UBE2C PE=1 SV=1
16	15	UV excision repair protein RAD23 homolog B OS=Homo sapiens GN=RAD23B PE=1 SV=1

^{15}N Incorporation in Labeled Proteins

Determined ^{15}N incorporation is 99.10 % for synuclein gamma peptide
TVEEAENIAVTSGVVR



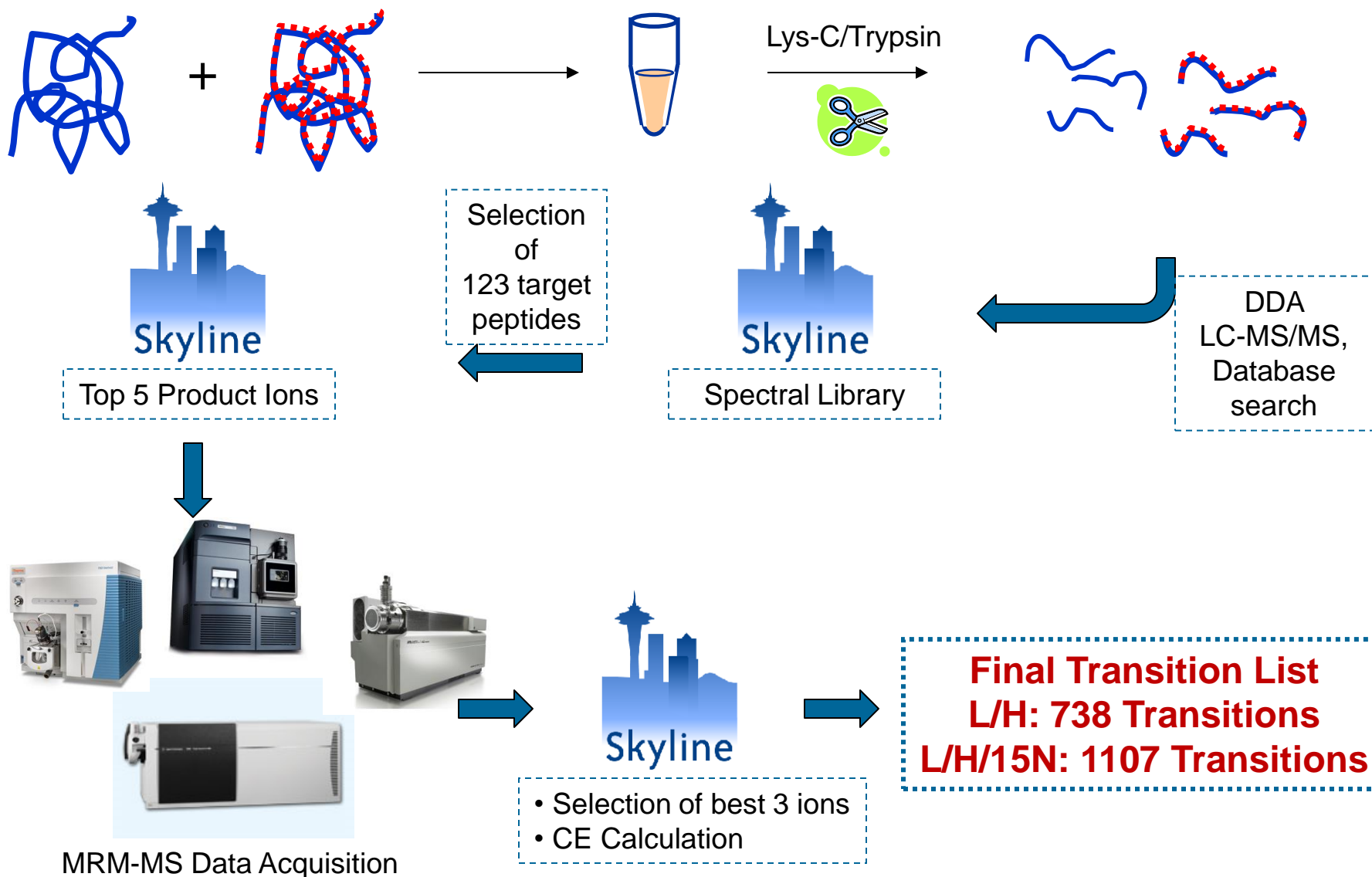
Data from Qstar Elite,
Buck Institute

Selected ^{15}N Stable Isotope Incorporation Efficiency

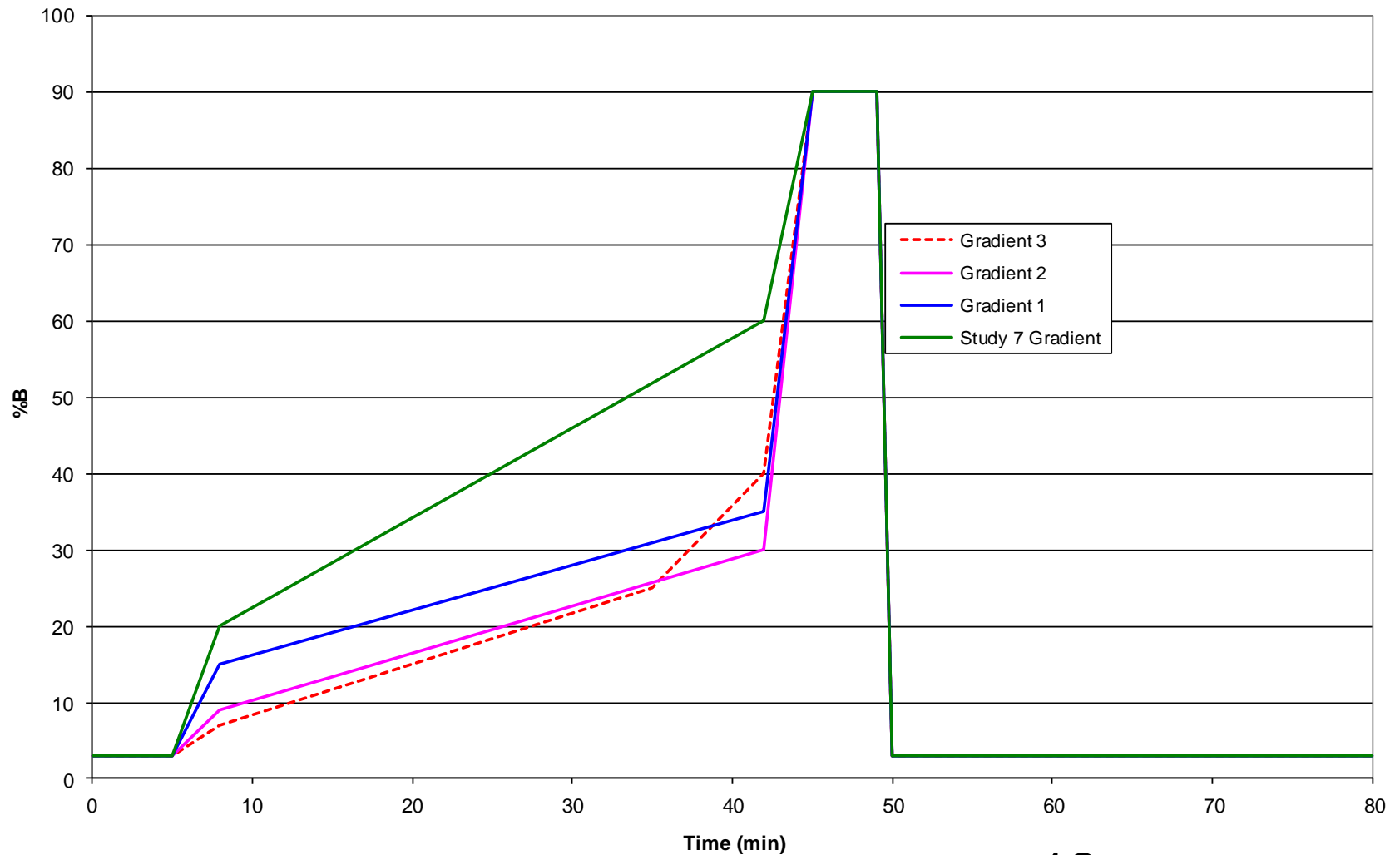
Gamma Synuclein	99.10 % ^{15}N
Tropomyosin 1 (alpha)	99.13 % ^{15}N
Ubiquitin-conjugating enzyme E2I (UBC9)	99.28 % ^{15}N
Ubiquitin-conjugating enzyme E2C	99.03 % ^{15}N
Growth factor receptor-bound protein 2	99.53 % ^{15}N
Heat shock 27kDa protein 1	99.18 % ^{15}N
Chloride intracellular channel 1	99.13 % ^{15}N
Annexin A1	99.55 % ^{15}N
Annexin A4	99.18 % ^{15}N
RAD23 homolog B	98.95 % ^{15}N
Interleukin 18 (interferon-gamma-inducing factor)	99.20 % ^{15}N
Lectin, galactoside-binding, soluble, 1 (galectin 1)	98.98 % ^{15}N
Fascin homolog 1, actin-bundling protein	99.10 % ^{15}N
Peroxisredoxin 4	98.95 % ^{15}N
Peroxisredoxin 2	99.10 % ^{15}N
Aldolase C	99.13 % ^{15}N

2 tryptic peptides for each ^{15}N labeled protein were analyzed
for isotopic purity (QSTAR Elite, Buck Institute)

Peptide and Transition Selection is Streamlined using Skyline

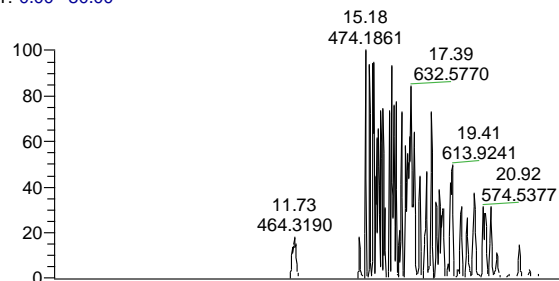


Gradient Development



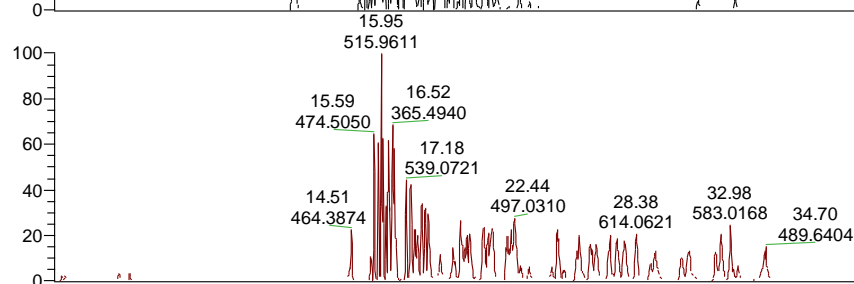
Gradient Optimization – Separate those Peptides!

RT: 0.00 - 80.00



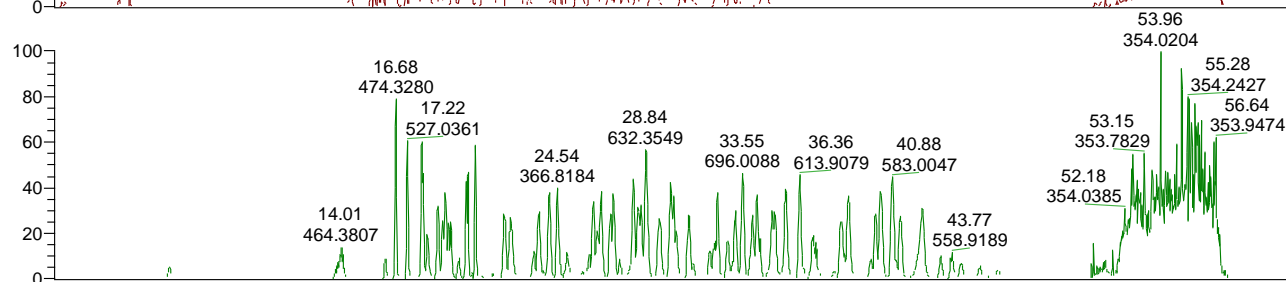
Study X
Gradient

NL: 1.86E6
Base Peak F: ITMS +
c NSIE Full ms
[300.00-1500.00]
MS
E051110_Pool_Study
7grad_03



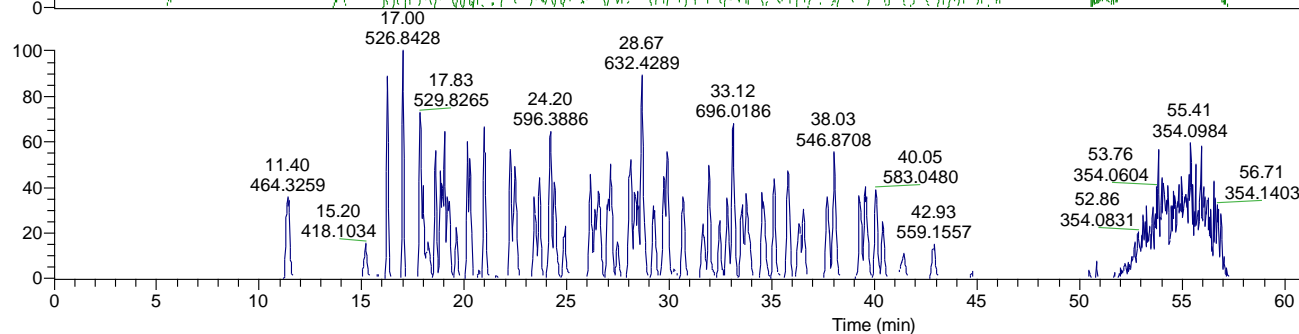
Gradient 1

NL: 1.64E6
Base Peak F: ITMS +
c NSIE Full ms
[300.00-1500.00]
MS
E0506010_Pool_Gra
d1_R2_03



Gradient 2

NL: 4.65E5
Base Peak F: ITMS +
c NSIE Full ms
[300.00-1500.00]
MS
E0507010_Pool_Gra
d2_R2_03



Gradient 3

NL: 1.09E6
Base Peak F: ITMS +
c NSIE Full ms
[300.00-1500.00]
MS
E051110_Pool_Grad
3_07

Preparation Time

RT: 9.88 - 50.04

Duty cycle

(out of 90 min inject-to-inject)

11 min

12%

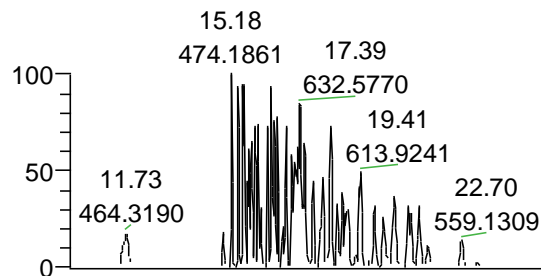
NL: 1.86E6

Base Peak F: ITMS + c

NSI E Full ms

[300.00-1500.00] MS

E051110_Pool_Study7gra
d 03



NL: 1.64E6

Base Peak F: ITMS + c

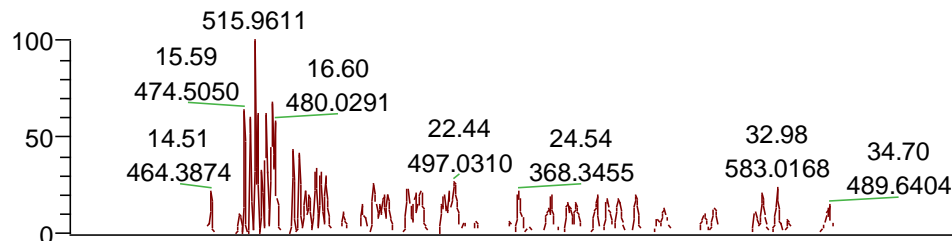
NSI E Full ms

[300.00-1500.00] MS

E0506010_Pool_Grad1_R
2 03

20 min

22%



NL: 3.67E5

Base Peak F: ITMS + c

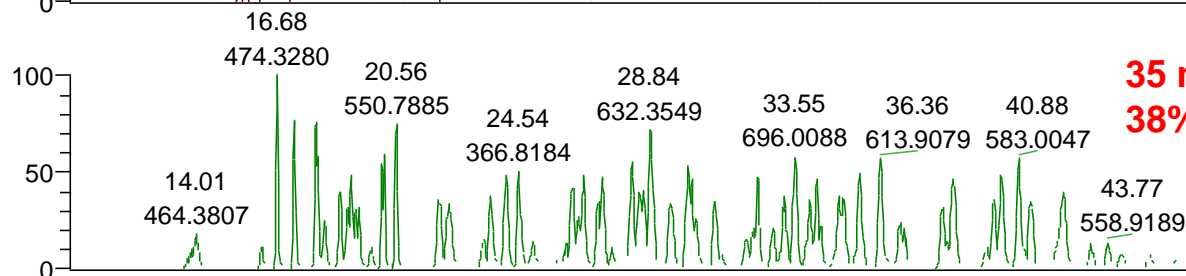
NSI E Full ms

[300.00-1500.00] MS

E0507010_Pool_Grad2_R
2 03

35 min

38%



NL: 1.09E6

Base Peak F: ITMS + c

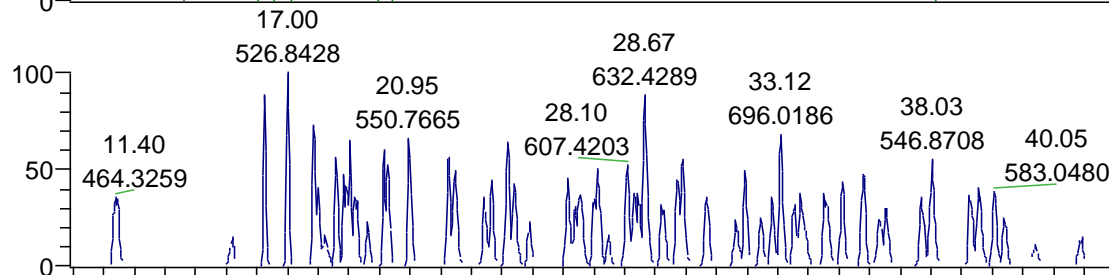
NSI E Full ms

[300.00-1500.00] MS

E051110 Pool Grad3 07

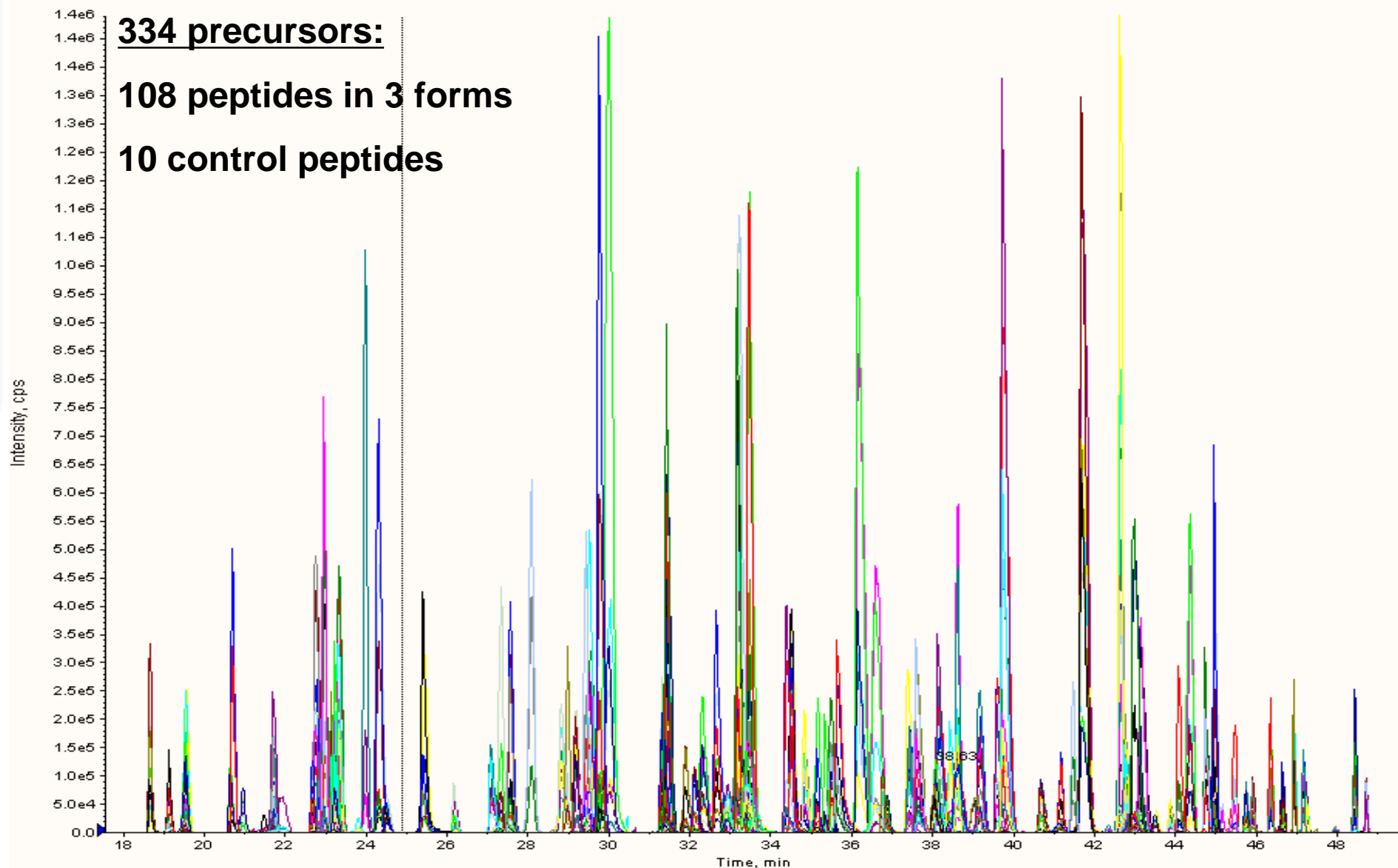
34 min

38%



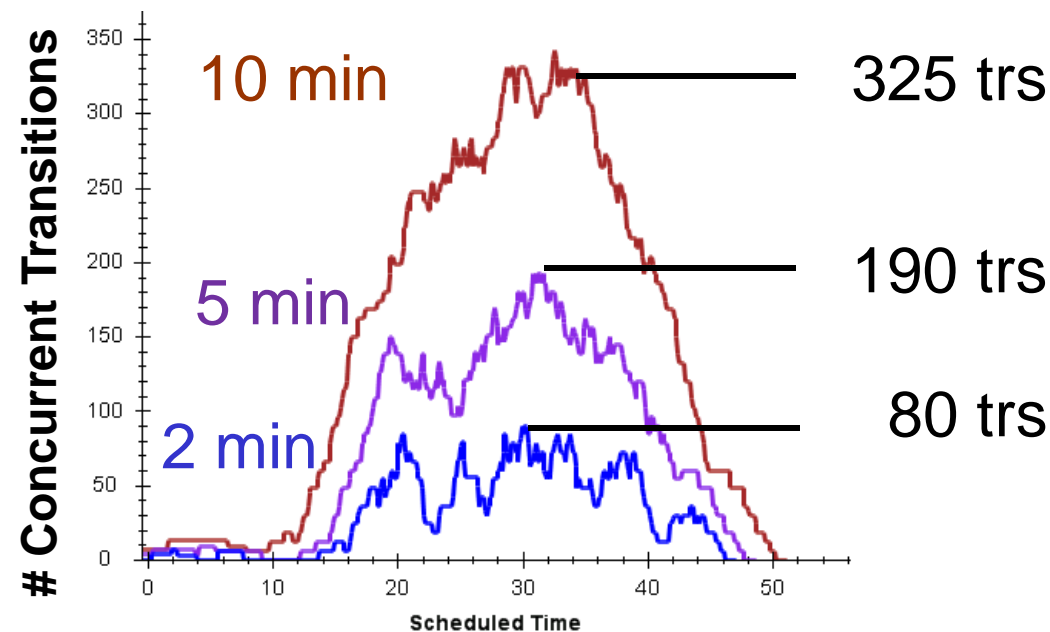
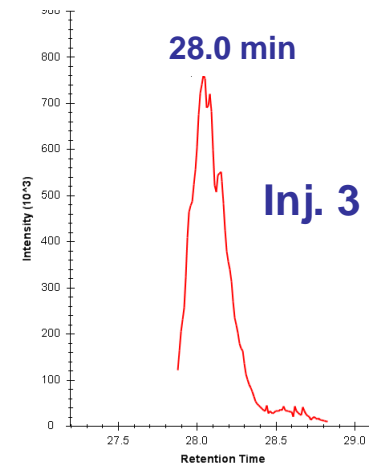
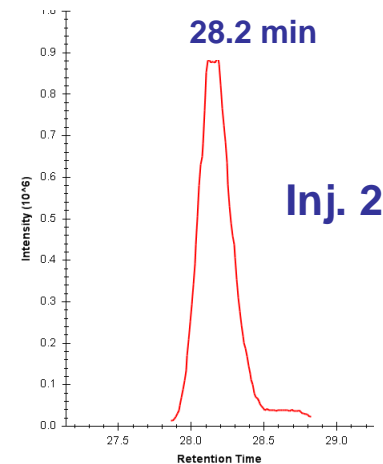
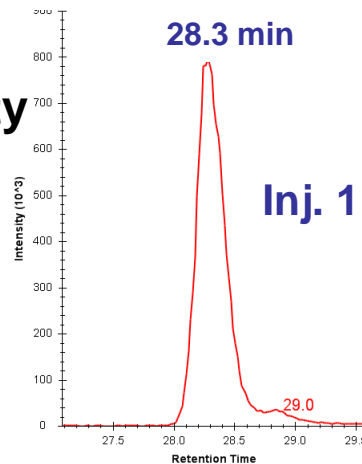
Time (min)

1000 Q1/Q3 Pairs – AB Sciex 4000 QTRAP



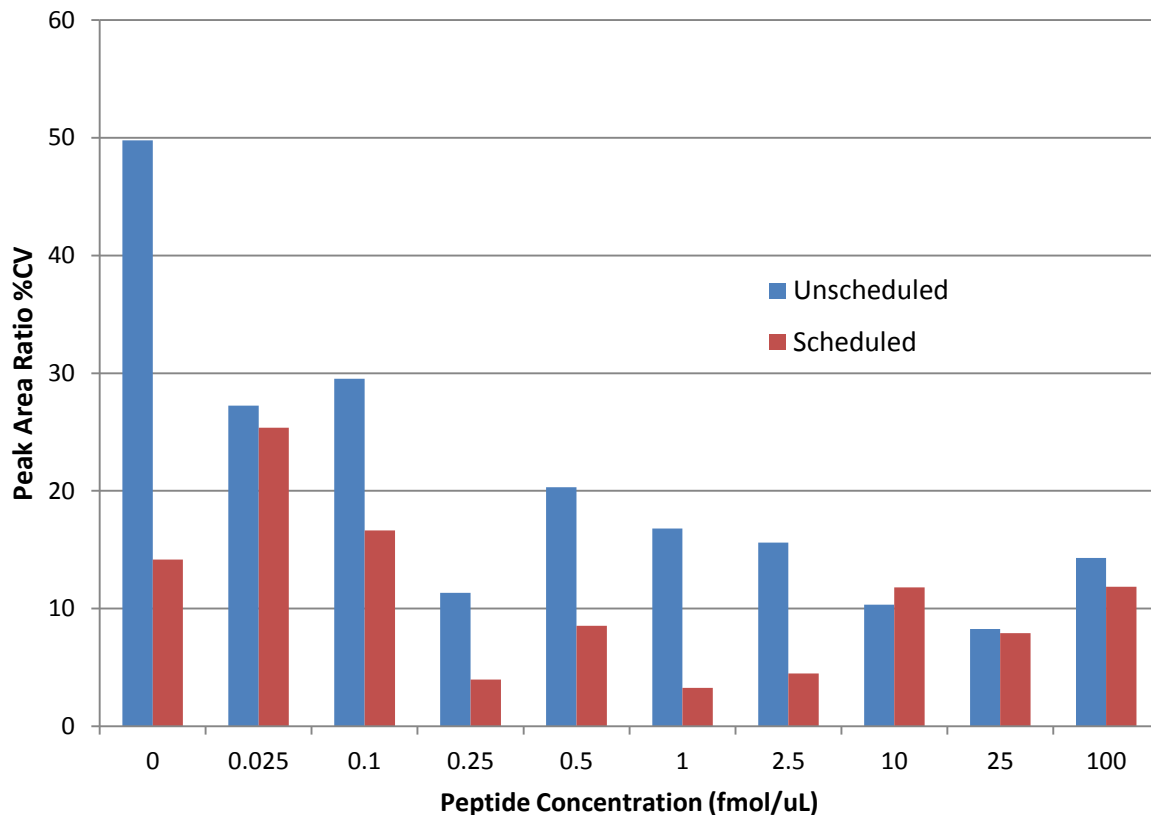
Retention Time Scheduling: The best way to acquire data?

- Scheduling puts rigorous demands on RT reproducibility
- Peak width and RT drift are often limiting factors
- Different peptides shift to various degrees.



- Large numbers of transitions require narrow RT windows or longer cycle times
- Cycle times may be governed by chromatographic peak width
- Scheduled runs with narrow RT windows require BABYSITTING

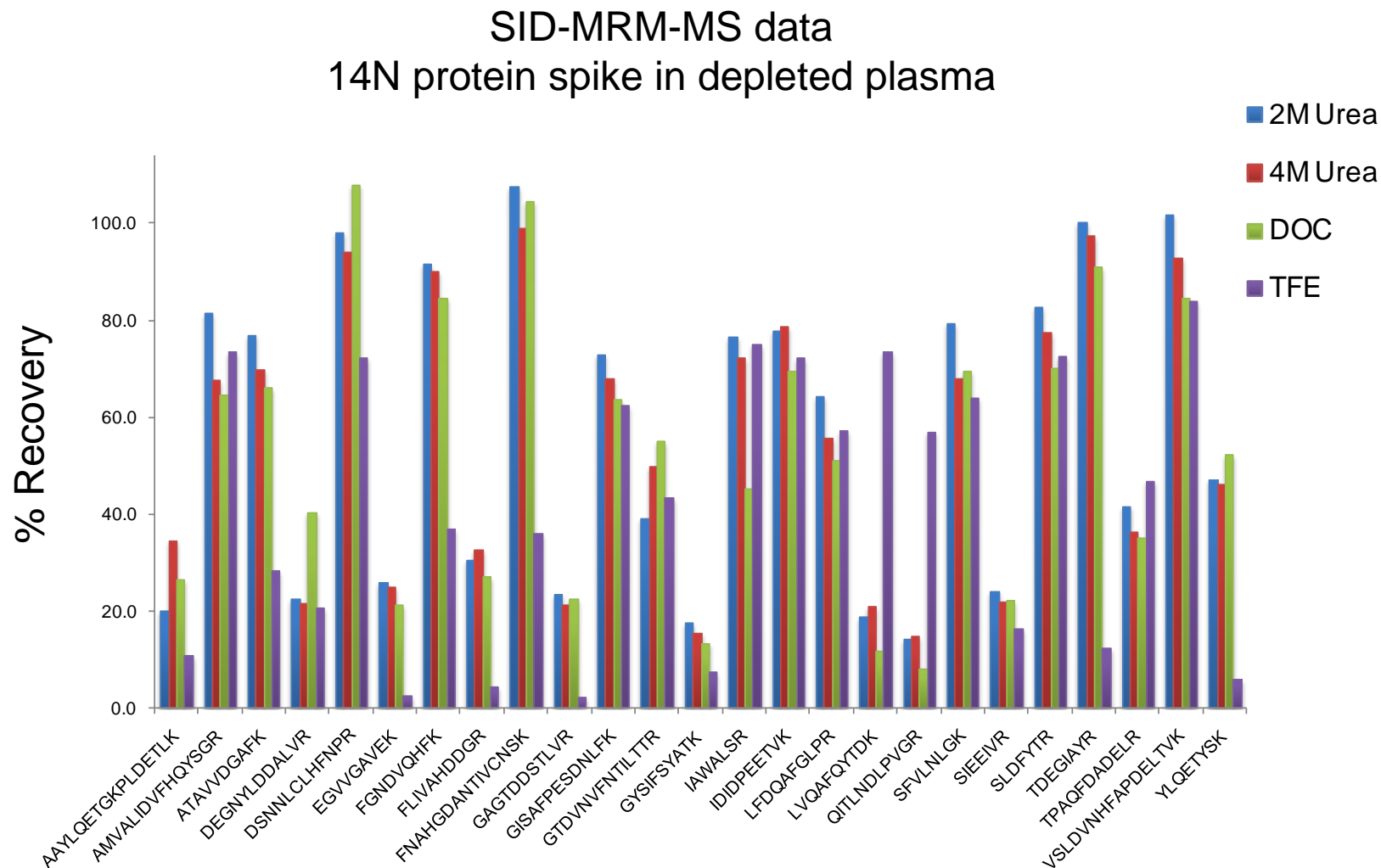
The positive effect of scheduling!



- Same Cycle Time = 1.8 sec
- Unscheduled Dwell Time
 - ~2 msec
- Scheduled Dwell Time
 - 19-70 msec

✓ Longer Dwell times allow better signal measurement and better reproducibility!

Recovery and Reproducibility of Four Digestion Methods Evaluated are Similar



LOD/LOQ Calculations: How Many Points in the Curve are Needed?

What is the ideal concentration range?

$$\text{LOD} = \bar{s}_{\text{blank}} + t_{0.95} \times (\sigma_{\text{blank}} + \sigma_{\text{low}})/\sqrt{n}$$

(fmol/ μL)

250

113

51

23

10

4.6

2.0

0.9

0.42

0.19

0.09

0.04

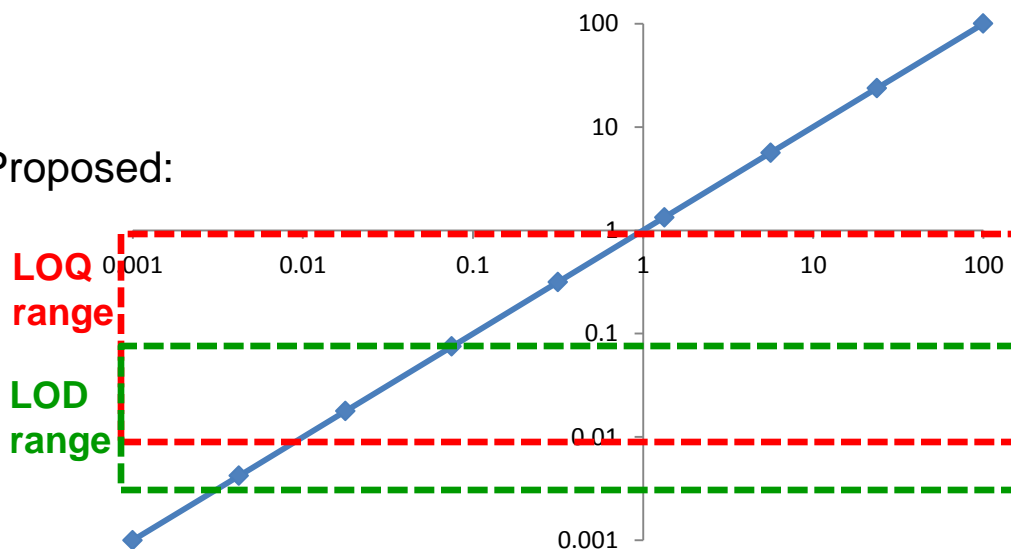
0.017

0.008

0.004

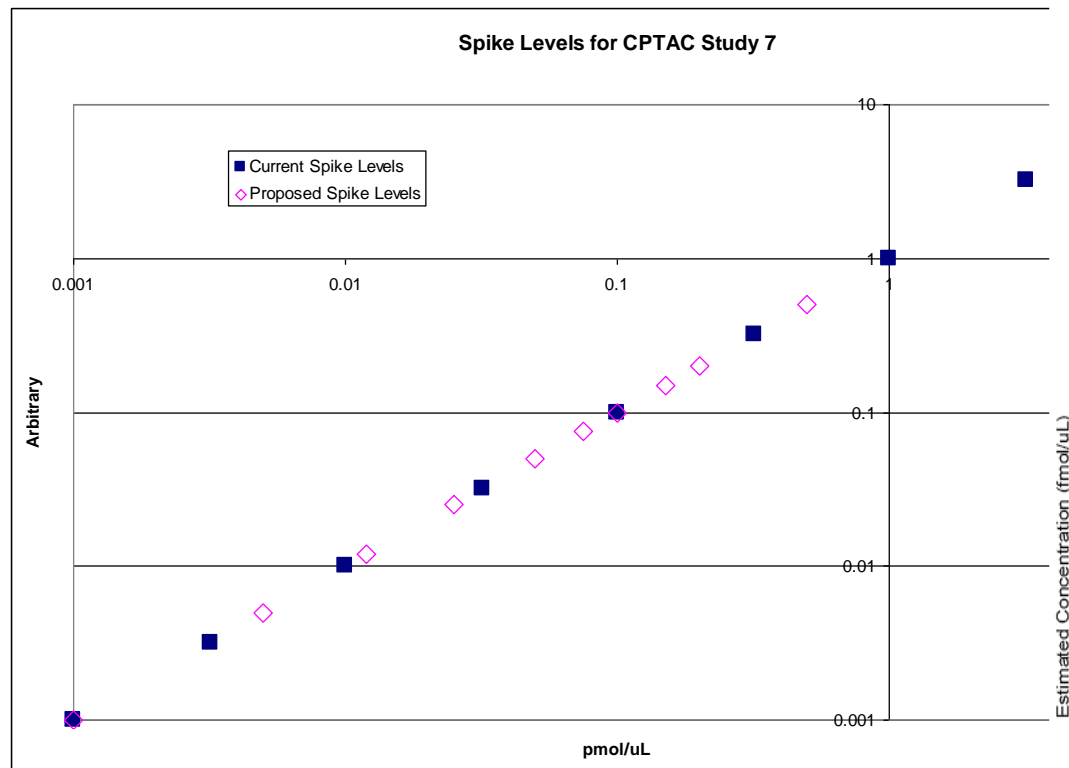
0.002

Proposed:

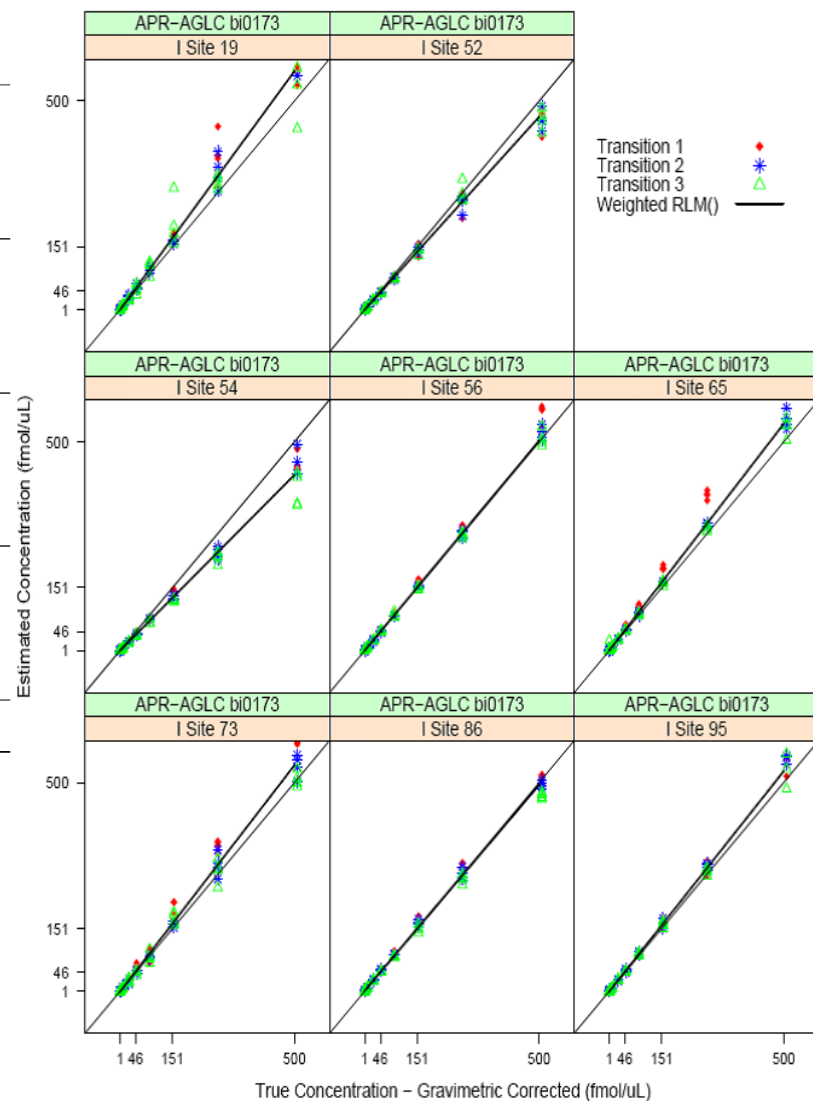


- Generate preliminary curves (16 pts)
- Pick a range and number of points to cover most peptides

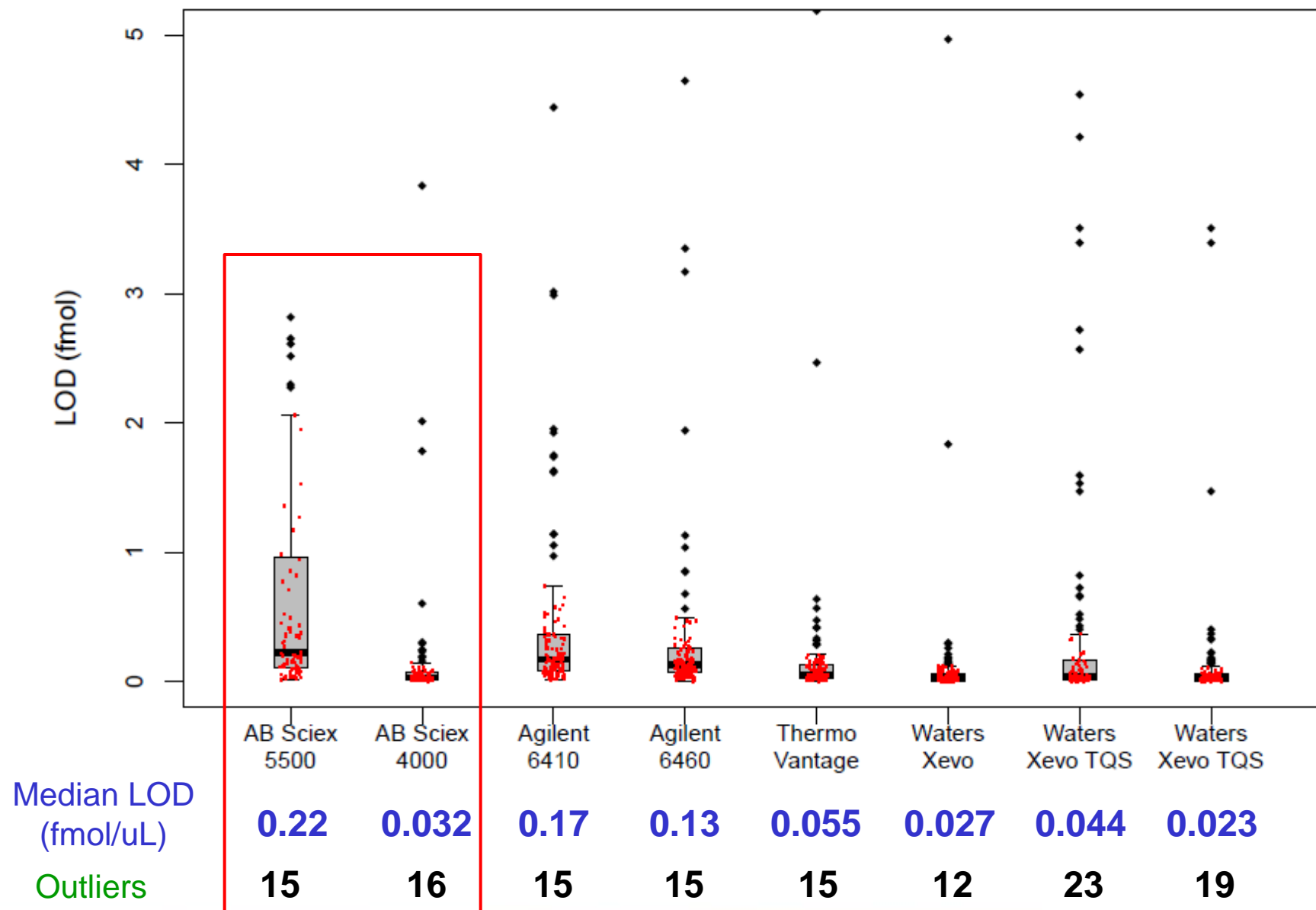
Mistakes from Study 9 (Addona *et al*, 2009 Nat. Biotech)



Spike levels didn't go low enough
to detect LOD empirically



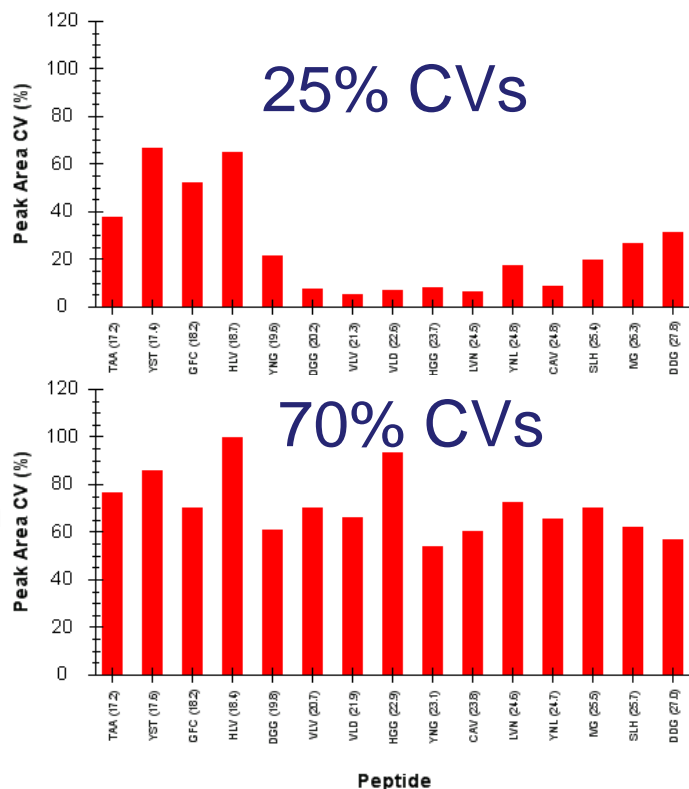
16 Point Curve at Selected CPTAC Sites Shows Good Reproducibility and Sensitivity



LOD is Highly Dependent Upon System Performance: Chromatography and Ionization

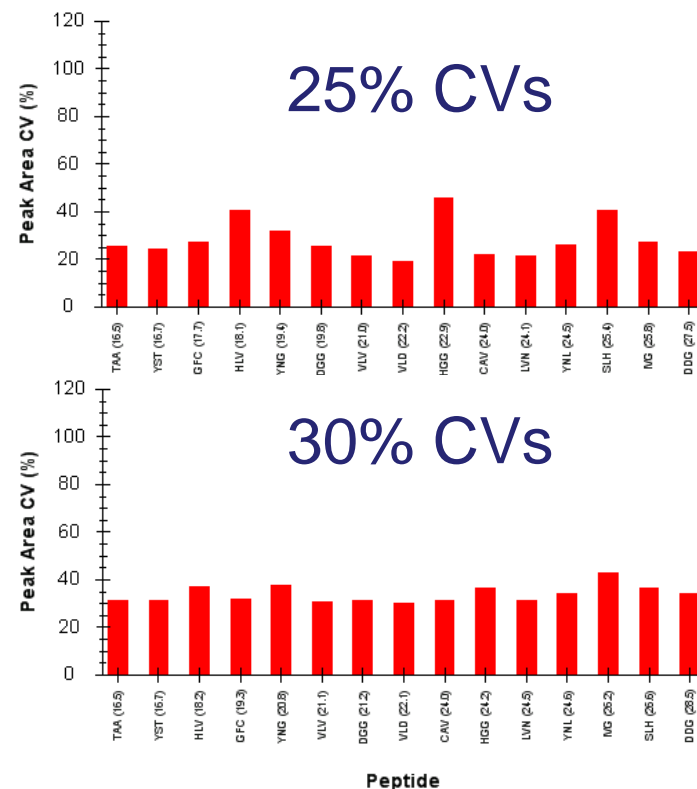
QTRAP 5500
Median LOD: 220 amol

**Pre-Assay
System
Suitability
Runs (5)**



4000 QTRAP
Median LOD: 32 amol

**Throughout
Assay System
Suitability
Runs (24)**



Unstable ESI was a major factor in poor detection and reproducibility
System Suitability assessment detects poor system performance

Data Quality Filtering and Custom Annotation by Operators for Data Sets Improves LOD

Results Grid						
	Total Area	signal quality	RT scheduling problem	general remarks	do not use	
	110472	peak tailing / poor peak shape	▼	▼	▼	<input checked="" type="checkbox"/>
	125381		▼	▼	▼	<input type="checkbox"/>
	127262	peak outside scheduling window	▼	▼	▼	<input checked="" type="checkbox"/>
▶	138775		▼	▼	▼	<input type="checkbox"/>
	138484		▲	▼		
	170053	very weak signal		▼		
	174726	peak tailing / poor peak shape		▼		
	192156	interference		▼		
	203884	shoulder		▼		
	210323	transition missing		▼		
		poor spray		▼		
		narrow peak (not enough points)		▼		



Automated version = “AuDIT”

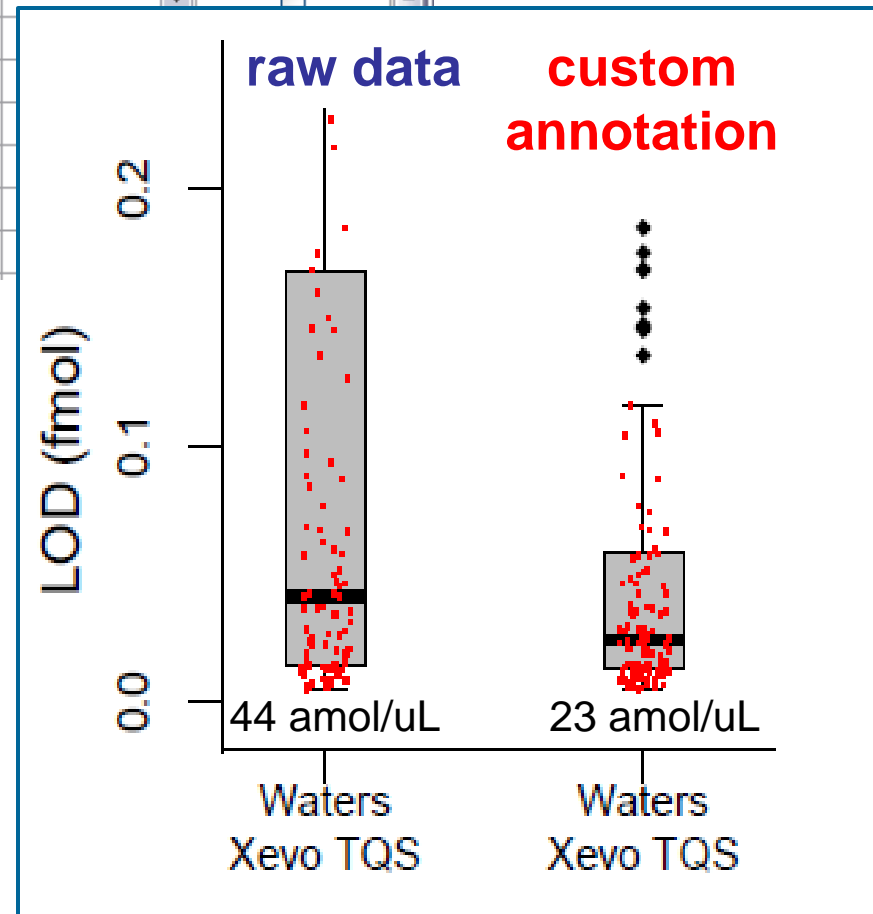
Flags potentially bad transitions

- poor peak shape
- interferences
- missing data

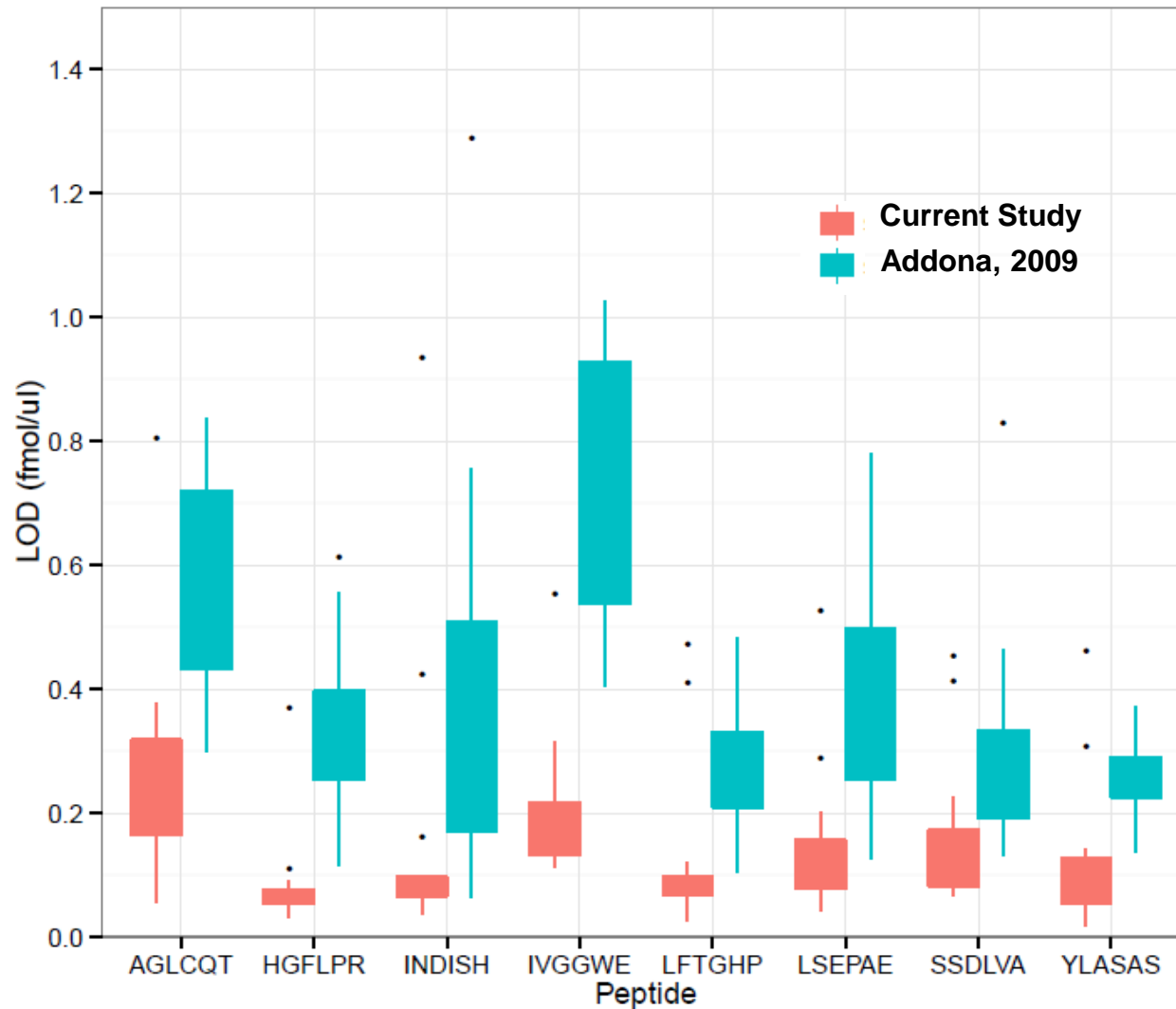
Reduces manual inspection to questionable data

Reduces subjectivity in data analysis

(Abbatiello, Mani et al. Clin. Chem. 2010)



Sensitivity Improvement due to Multiple Factors



- Sample enrichment
- Lower load amount
- Optimized gradient
- Experience!

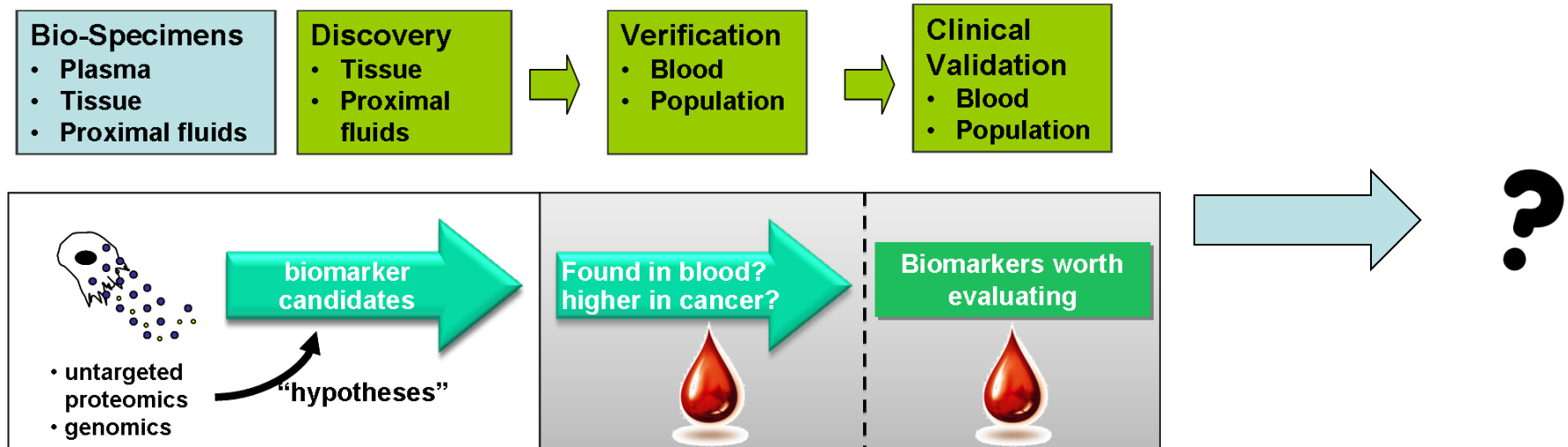
Summary

- **First large-scale interlab study to include ^{15}N protein reagents and >100 peptide targets (>350 peptide forms) on 13 different instruments**
- **Sensitivity improvement from previous study by using depleted plasma**
- **Retention time scheduling improves reproducibility**
- **Software and computational methods need to catch up with instrument capabilities and assay development throughput**
- **Data quality filtering helps remove subjectivity of data evaluation and increases data analysis throughput**

Request To Vendors

- ✓ **Data-dependent MRM-MS (to eliminate “night watch” of scheduled runs)**
- ✓ **RT Updating or prediction of systematic drift**
- ✓ **Column heaters for nanoflow columns**
- **Interference and Autointerference detection for data analysis and method development**

What is the end goal of peptide quantitation?



- ✗ **Biopsies**
- ✗ **Invasive sample acquisition**
- ✓ **Evolution of method to point-of-care or at-home tests**
- ✓ **Earlier detection**
- ✓ **Better control**
- ✓ **Improved quality of life**

A Fluid Based Biomarker Success Story...

Blood Glucose Monitoring for Diabetes



What was once a test run only at hospitals (1970's)...

Is now available for <\$1/test at home

And now capable of real-time monitoring every 5 min

www.minimed.com

CPTAC VWG Participants & Acknowledgements

Broad Institute: Susan Abbatiello,
Terri Addona, Steven A. Carr, Hasmik
Keshishian, D.R. Mani, Michael Burgess,
James Markell

Buck Institute for Age Research:
Michael P. Cusack, Bradford W. Gibson.
Jason M. Held, **Birgit Schilling**

Fred Hutchinson Cancer Research Center:
Amanda G. Paulovich, Jeffrey R. Whiteaker,
Shucha Zhang

Indiana University: Mu Wang, Jong-Won
Kim, Jimsan You

Massachusetts General Hospital:
Steven J. Skates

Memorial Sloan-Kettering Cancer Center:
Paul Tempst, Mousumi Ghosh

National Cancer Institute: Emily Boja
Tara Hiltke, Christopher Kinsinger,
Mehdi Mesri, Henry Rodriguez, Robert Rivers

NISS: Xingdong Feng, Nell Sedransk,
Jessie Xia

NIST: Paul Rudnick

New York University: Thomas A. Neubert,
Åsa Wahlander, Sofia Waldemarson, Pawel
Sadowski

Plasma Proteome Institute:
N. Leigh Anderson

Purdue University: Charles Buck, Fred
Regnier, Dorota Inerowicz, Vicki Hedrick

University of California, San Francisco:
Simon Allen, Susan J. Fisher, **Steven C. Hall**,
University of North Carolina: David Ransohof
University of Victoria: Christoph H. Borchers,
Angela Jackson, Derek Smith

University of Washington: Michael MacCoss,
Brendan MacLean, Daniela Tomazela

Vanderbilt University: Daniel Liebler, Kent
Shaddox, Corbin Whitwell, Lisa Zimmerman

Funding: National Cancer Institute