

## Protein Bioinformatics (260.655)

### **Lecture 9: Quantitative Proteomics** Tuesday, April 27, 2010

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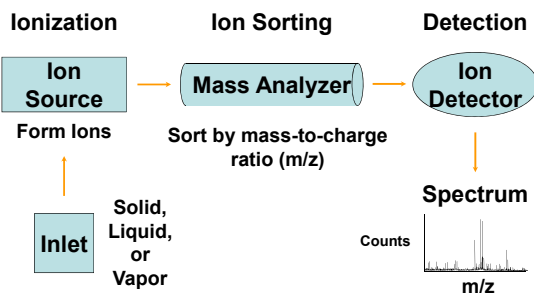
## Topics

Protein identification by mass spectrometry

Relative quantification of proteins

Applications

## How a Mass Spectrometers Measure Mass



## Identifying Proteins by Mass Spectrometry

### Three Methods

**Bottom Up:** Proteins identified from **a few peptides**  
*Know cleavage site, peptide mass and sequence*  
*Do not know proteins actual size and modifications*  
*Problems: Sequence homology, seeing all peptides*

**Top Down:** Proteins identified from **the intact protein**  
*Know protein's size and whether it is modified*  
*Sequence usually from ends of protein*  
*Problems: Size limitations, Internal sequences*

**Middle Down:** Proteins identified from **large sections of protein**

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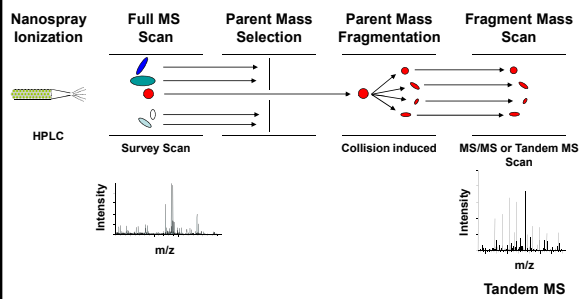
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## Identifying Proteins from Peptide Sequence

(Many proteins in solution, gel bands or spots)




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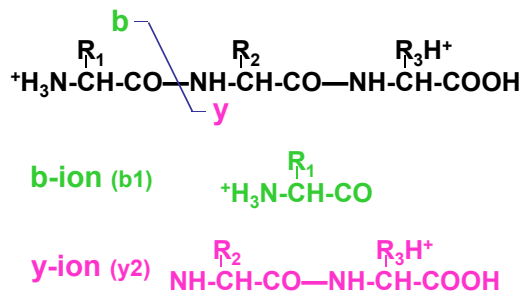
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## Sequencing Peptides by Fragmentation




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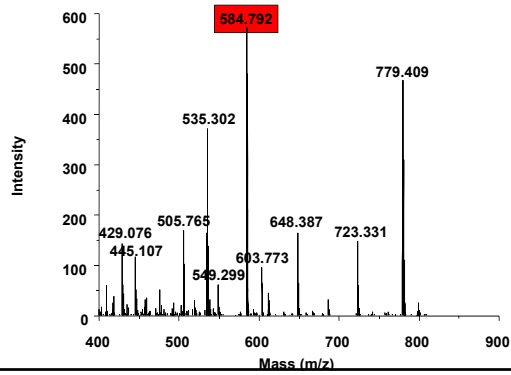
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Survey (Full MS or MS1) Scan of Peptides




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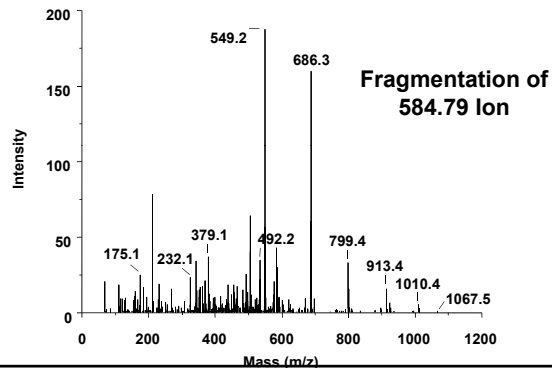
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MS/MS (MS2) Scan of Peptide Fragments showing Amino Acid Sequence




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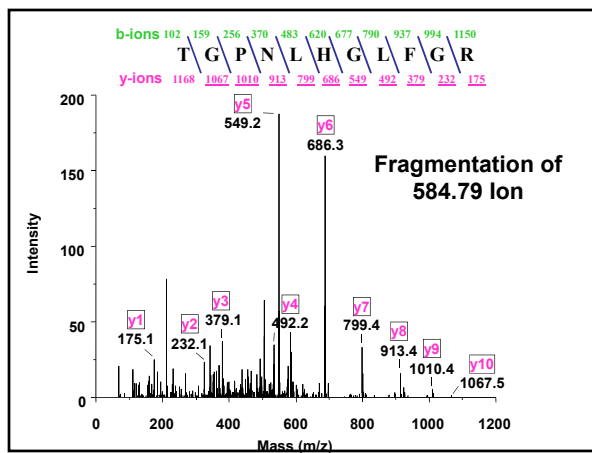
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### Tandem MS (MS/MS)

Uses Peptide Mass and Sequence Tag

Need Only One Peptide Mass with >3 Amino Acids Masses in Sequence (at least two preferred)

High Sample Complexity Tolerated

Protein modifications identified and mapped to an amino acid

High mass accuracy nice, but not required

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### Search Engines for Protein Identification from MS Data

#### Summary of Programs

Proteome Software	<a href="http://www.proteomesoftware.com/">www.proteomesoftware.com/</a>
ExPASy	<a href="http://expasy.proteome.org.au">expasy.proteome.org.au</a>

#### Free Programs

ProteinProspector	<a href="http://prospector.ucsf.edu">prospector.ucsf.edu</a>
XProteo	<a href="http://xproteo.com:2698">xproteo.com:2698</a>
Prowl	<a href="http://prowl.rockefeller.edu">prowl.rockefeller.edu</a>
Mascot	<a href="http://www.matrixscience.com">www.matrixscience.com</a> (Free < 300 ions)

#### Open Source Programs

OMSSA	<a href="http://pubchem.ncbi.nlm.nih.gov/omssa/">pubchem.ncbi.nlm.nih.gov/omssa/</a>
X! Tandem	<a href="http://www.thegpm.org/">www.thegpm.org/</a>

#### Commercial Programs

Mascot	<a href="http://www.matrixscience.com">www.matrixscience.com</a>
Sequest	<a href="http://fields.scripps.edu/sequest/">fields.scripps.edu/sequest/</a>
Spectrum Mill	<a href="http://www.chem.agilent.com/">www.chem.agilent.com/</a>
Proteolynx	<a href="http://www.waters.com/WatersDivision/">www.waters.com/WatersDivision/</a>

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### Quantitative Proteomics

Quantifying Individual Proteins in Complex Mixtures  
(Functional Proteomics)

#### Quantifying a Proteome Reveals

Changes in protein levels  
(*biomarkers, pathways, binding partners*)

Changes in protein modifications  
(*structure/function*)

Changes in subcellular localization  
(*trafficking*)

Kinetics  
(*protein turnover, modification dynamics*)

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Quantitative Proteomics Methods	
Approach	Methods (Gel or MS based)
Non-Labeling	Gel matching, Densitometry, Spectral Counting, Peak Intensity, Multiple Reaction Monitoring ( <b>MRM</b> )
Labeling	
Chemical	Difference Gel Electrophoresis ( <b>DIGE</b> ) Isobaric Tags for Relative and Absolute Quantitation ( <b>ITRAQ</b> ) Isotope-Coded Affinity Tags ( <b>ICAT</b> )
Metabolic	Radiolabeling Stable Isotope Labeling of Amino Acids in Cell Culture ( <b>SILAC</b> )
Enzymatic	$^{18}\text{O}$ -Labeling
Spiking	Absolute Quantification ( <b>AQUA</b> ) Multiple Reaction Monitoring ( <b>MRM</b> ) Quantification Concatamers ( <b>QconCAT</b> )

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Best Approach?	
There is <u>NO</u> one best approach.	
All approaches are:	
Complementary	different separation techniques different sets of proteins identified
Technically challenging	sample preparation data acquisition data analysis
Require fractionation to dig deeper into proteome	limited by dynamic range

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Best Quantitative Proteomic Experiments	
Defined question (i.e. hypothesis driven)	
Defined system	
Independently measurable phenotype	
Sample preparation	Reproducible Scalable Compatible buffer system

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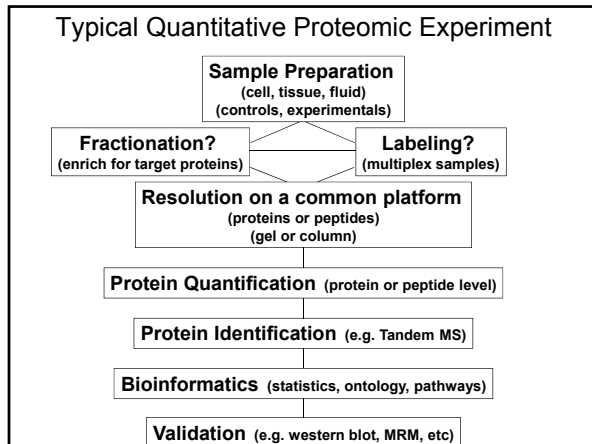
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### Sample Preparation (Most Important Step!)

Reproducibility

Protein Amount and Complexity

Buffer Composition Compatibility

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### Sample Preparation Must Be Reproducible and Standardized!

Biological Replicates

Initial Protocol

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Standardized Protocol

**Reduce Sources of Variability:**

Technical: "good" < "bad hands"  
few < many steps

Biological: cells < tissue < body fluids  
yeast < nematode < human

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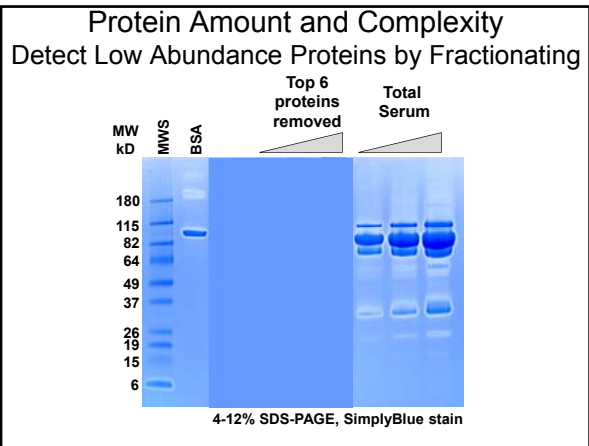
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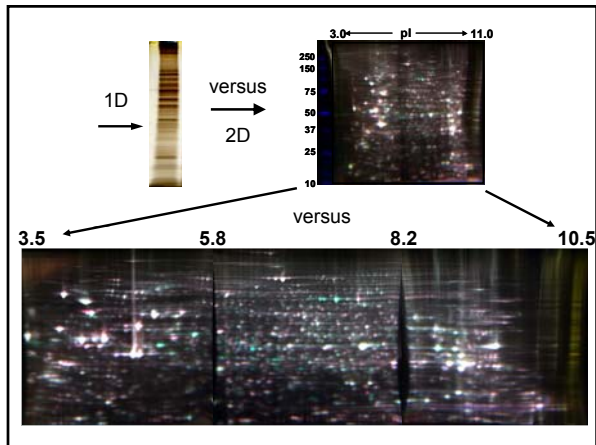
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**Quantitative Proteomics Methods**

**Non-Labeling Methods**

- No additions to analysis
- Separate analysis of Each sample
- Biological Variability
- Technical Variability (Sample Prep and MS analysis)

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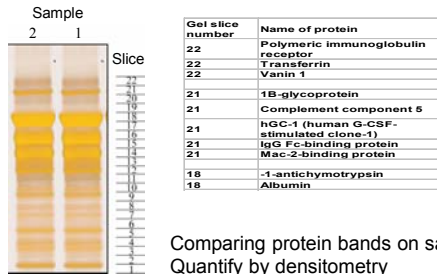
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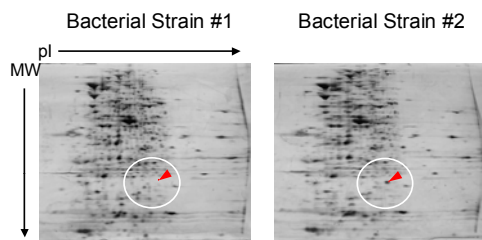
## Non-Labeling – Densitometry -1D Gel



Comparing protein bands on same gel  
Quantify by densitometry  
Often more than one protein per band

Kristiansen et al. Molec Cell Proteomics 3:715–728, 2004.

## No Labeling – Densitometry - 2D Gels

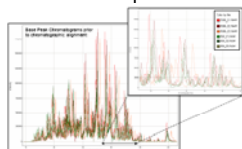


Compare spots from different gels  
Quantify by relative spot volume  
Gel reproducibility and spot matching critical  
Gel warping for matching spots can warp out modification  
Often more than one protein per spot

## No Labeling – MS Methods

### Spectral Counting

Each sample separate LCMS/MS experiment



Compares multiple LCMS/MS experiments

Quantify each protein from:  
number of peptides from protein  
number of spectra for each peptide

Sample	Protein	Peptide	Sequence	Score	Decomposition	Protein
1	1	1	1	1	1	1
2	2	2	2	2	2	2
3	3	3	3	3	3	3
4	4	4	4	4	4	4
5	5	5	5	5	5	5
6	6	6	6	6	6	6
7	7	7	7	7	7	7
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100	100	100	100	100	100	100

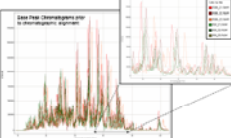
Reproducibility of LCMS/MS system critical



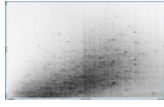
## No Labeling – MS Methods

### Peak Intensity

Each sample separate LCMS/MS experiment      Quantify each protein from: intensity of 3 most intense peptides averaged from 3 technical replicates

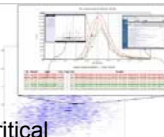


Compares multiple LCMS/MS experiments



3D Peak Intensity Map

Annotate "Spots"



Reproducibility of LCMS/MS system critical

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## Quantitative Proteomics Methods

### Non-Labeling Methods

No additions to analysis

Separate analysis of Each sample

Biological and Technical Variability

### Labeling Methods

Typically adds steps to analysis

Simultaneous analysis of Many samples (Multiplexing)

Biological Variability, Reduces Technical Variability

Cuts instrument time (data collection) by 50-75%

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## Difference Gel Electrophoresis (DIGE)

Control Protein Extract

Label with fluor 1

Disease Protein Extract

Label with fluor 2

Mix labeled proteins from both samples

Separate proteins on one 2-D gel

Excitation wavelength 1


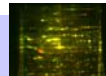
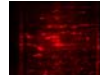


Image gel



Excitation wavelength 2



Protein comparison in a single gel!

Unlu et al. Electrophoresis 18:2071-2077, 1997

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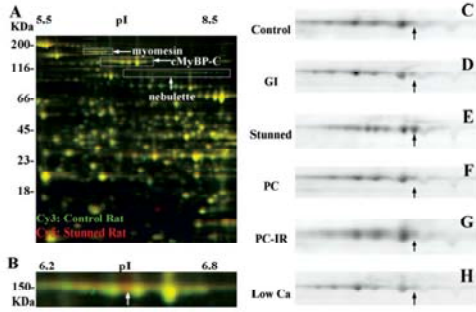
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## Novel Phosphorylation of Myofilament Protein Correlates with Myocardial Stunning



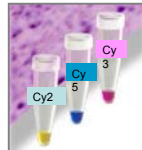
Yuan et al. Proteomics 6:4176-4186, 2006

## Three Fluorescent Cy Dyes

Cy2, Cy3, Cy5

$\epsilon$ -amino group of lysine

Matched for Charge and MW



Third Cy Dye used as an Internal Standard

All possible protein spots overlaid on every gel.

Simplifies gel to gel matching.

Each spot has it's own internal standard spot for normalizing across gels.

Reduces experimental variations.

Accounts for differences in sample load.

## DIGE Analysis

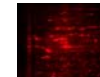
Pooled Samples labeled with Cy2  
(on all gels to compare one gel to another)

Control Protein Extract Label with Cy3  
Disease Protein Extract Label with Cy5

Mix samples

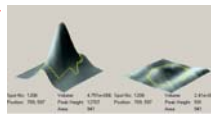
Separate proteins on one 2-D gel

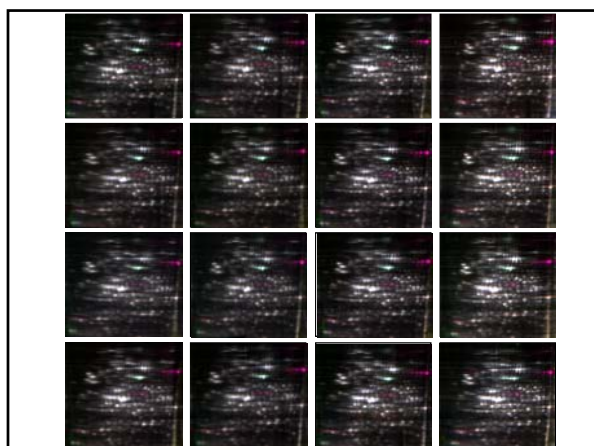
Excitation wavelength 1



Excitation wavelength 2

Quantify intact proteins  
Cells, tissue, fluids  
One additional step  
Reduced technical variability






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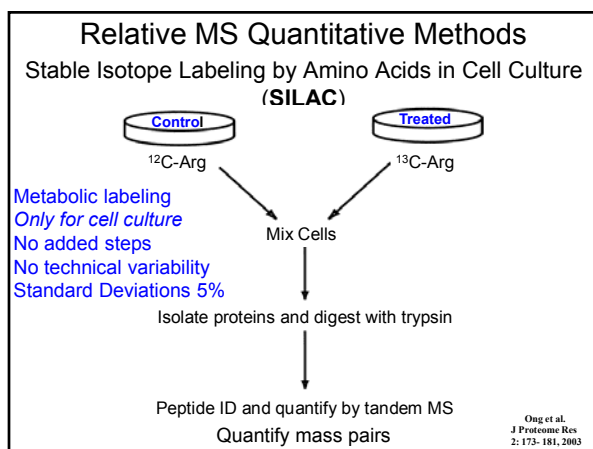
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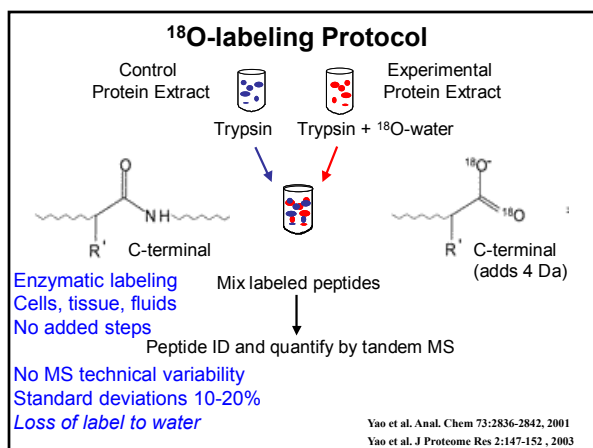
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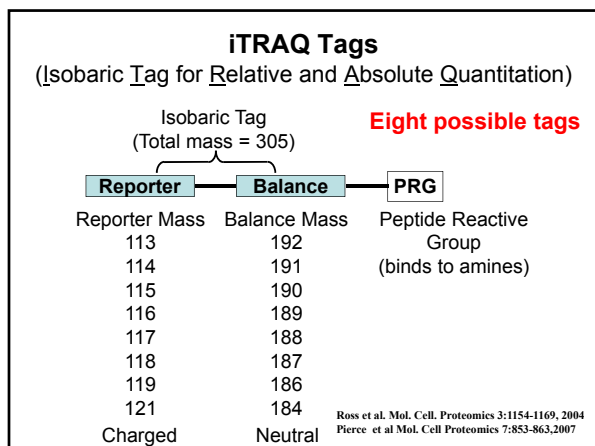
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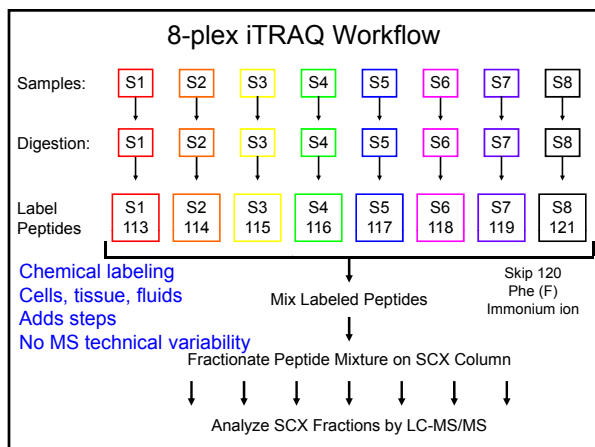
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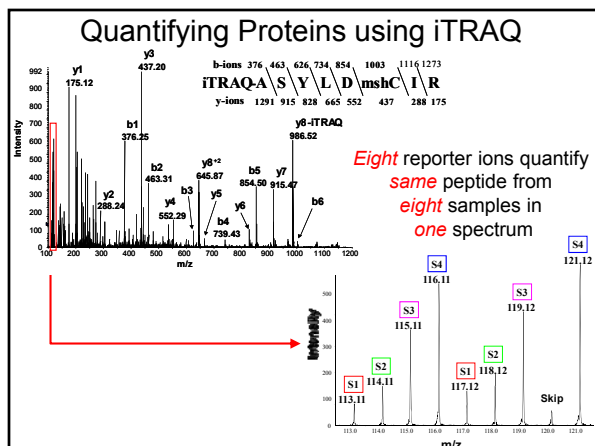
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## Changes in Protein Levels (*biomarkers and pathways*)

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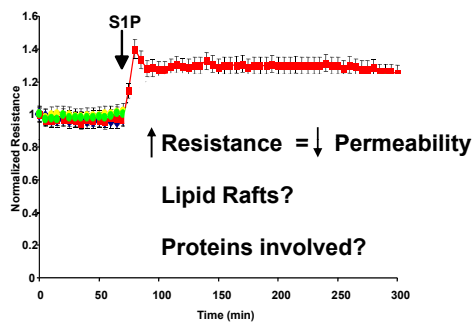
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### Phospholipid Growth Factor (S1P) on Pulmonary Endothelial Permeability



Guo Y et al (2007) Mol Cell Proteomics 6:689-696

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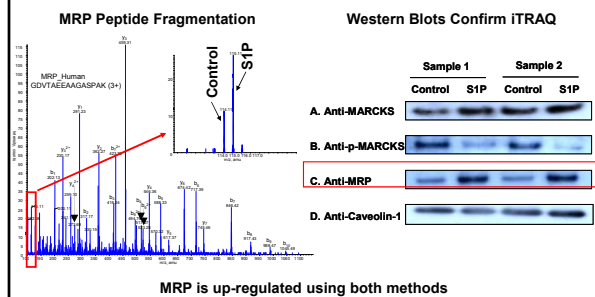
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### iTRAQ Revealed Proteins More Abundant in S1P Stimulated Lipid Rafts



Guo Y et al (2007) Mol Cell Proteomics 6:689-696

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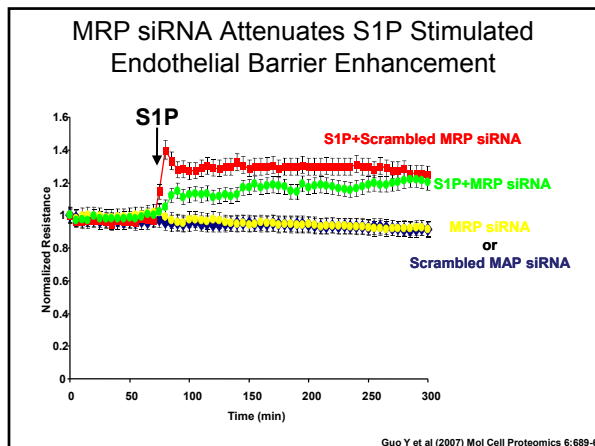
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Can more than 8 samples be analyzed using 8-plex iTRAQ?

**Yes!**

**Experimental Design**

Pool of all samples: Standard in all iTRAQ experiments

Repeat labeling of at least 1 sample in all iTRAQ experiments

Completely randomize labeling

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### Expected Result

$$\frac{\text{iTRAQ 1 - Sample 1}}{\text{iTRAQ 1 - Pool}} = \frac{\text{iTRAQ 2 - Sample 1}}{\text{iTRAQ 2 - Pool}}$$
  

$$\frac{\text{iTRAQ 1 - Sample 2}}{\text{iTRAQ 1 - Pool}} = \frac{\text{iTRAQ 2 - Sample 2}}{\text{iTRAQ 2 - Pool}}$$


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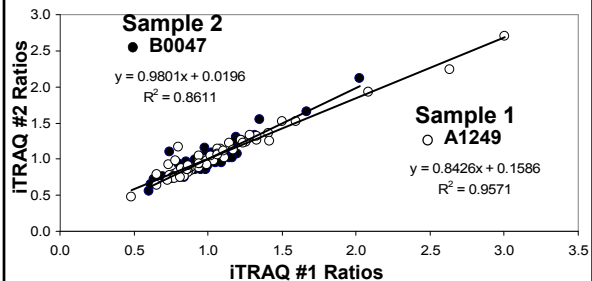
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Ratios for All Proteins in Sample 1 or Sample 2  
Relative to Pool are the Same in iTRAQ 1 and iTRAQ 2




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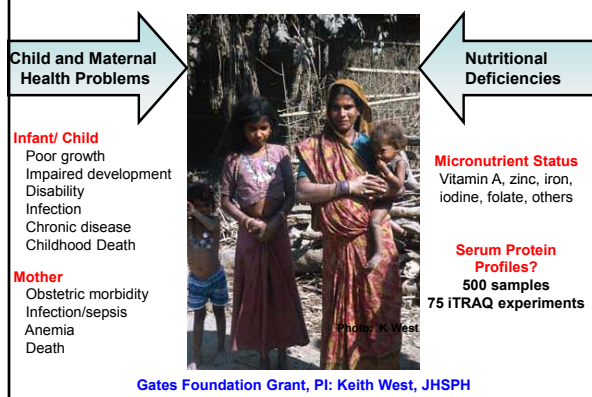
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# Micronutrient Deficiencies and Health of Undernourished




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Changes in Protein **M**odifications  
(*structure/function*)

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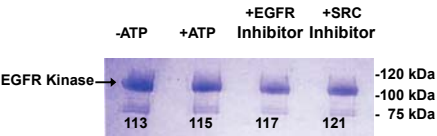
Using iTRAQ to Quantify Site Specific  
Auto-Phosphorylation of the EGF Receptor Kinase

1 MRPSGTAGALLALLAALCPASRALEEKKVQCTSKLITQLCTFEDHFLS  
51 LQRMFNCEVVLGNLETTYVQRNYDLSFLKTIQEVAGVYLIALNTVERIP  
101 LENLQIIRGNMYYSYALAVLSNYDANKTKELPMRNQLQELHGAVERF  
151 SNNPALCNVESIQWRDIVSSDFLSNMMDQNLGSCQKCDPSCFNGSCW  
201 GAGEENQKLTIIICAQQCSGRCRGKSPDCCHNQCAAGCTGPRESDCLV  
251 CRKFRDEATCKDTCPLMLYNPTTYQMDVNEGKYSGATCVKCKPRNYV  
301 VTDHSCVACGADSYEMEDGVKCKCEGPKRVNCGIGIGIFKDSLS  
351 INATWIKKFNCTSIISGLILILPVAFGDSFTTHPDLQDELILKTVKE  
401 ITGFLIQAWPENRTDLHAFENLEIIRGRKTQHGQFSLAVVSLNTSLGL  
451 RSLKEISDGDVLIISGNKLCYANTINNKKLFGTSGQKTKIISNRGENSCK  
501 ATGQVCHALCSPEGCGWPEPRDCVSCRNVSGRECVDKCNLLEGEPREFV  
551 ENSECIQHPECLPQAMNITCTGRGPDNCIQCAHYIDGPHCVKTCFAGVM  
601 GENNTLVKRYADAGHVCHLCHPNCYTGCTGGLEGCTNGPKIPSIATGM  
651 VGALLLLLVVALGILFMRRRHIVRKRTRLRLQLQERLVEPLTPSGEAPN  
701 QALLRLIETEFKIKVLSGAFQVTVGLWIPGGEVRIQVATKELREA  
751 TSPFAMKILDEAYMASVDNHFVCRLLGICLSTFVLITQAMFECLLD  
801 YVREHKDNGSYLLNWCQVIAGMNYLEDRLVHRDLAARNVLVTKTPQR  
Tyr<sup>989</sup>  
851 VKITDFGLAKLLGAEEKYHAEGGKVPFKMMALESILHRIYTHQSDVWSY  
901 GVTYWEIMTFGSKPYDGIPIASEIISILEKGERLPQFPICITIDVYIMVVK  
951 WMIDADSRKPFRELLIEFSKMARDPQRYLVIGQDERMHLPSPTDSNFYK Tyr<sup>998</sup>

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Experimental Design

Expressed EGFR Kinase  
Incubated +/- ATP and +/- kinase inhibitors  
Isolated EGFR Kinase  
Resolved EGFR Kinase by SDS-PAGE  
In gel digest, iTRAQ label, SCX, LCMS/MS



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EGFR Top Hit  
>35 peptide IDs with at least 95% confidence  
Same amount of EGRF in all gel bands  
(Ratios relative to No ATP sample labeled with 113)

Rank	Score	%Cov	Name	Species	+ATP		
					115:113	117:113	121:113
1	70	65	Epidermal growth factor receptor precursor - Homo sapiens (Human)	HUMAN	1.10	1.15	1.32
2	9	49	Keratin, type II cytoskeletal 1 - Homo sapiens (Human)	HUMAN	0.76	1.00	1.20
3	8	43	Exportin-2 - Homo sapiens (Human)	HUMAN	0.98	0.89	1.31
4	5	36	Exportin-4 - Homo sapiens (Human)	HUMAN	0.98	0.98	1.25
5	4	39	Exportin-1 - Homo sapiens (Human)	HUMAN	0.94	1.00	1.29
6	2	46	Exportin-T - Homo sapiens (Human)	HUMAN	1.07	1.19	1.56
7	2	34	Keratin, type I cytoskeletal 10 - Homo sapiens (Human)	HUMAN	0.70	0.75	1.21
8	2	71	Uncharacterized protein C14orf139 - Homo sapiens (Human)	HUMAN	1.15	0.87	1.12

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Phosphothreonines:	No change
Phosphoserines:	No change

	+EGFR Kinase Inhibitor	+Scr Kinase Inhibitor
+ATP Alone	+	+

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(protein turnover, modification dynamics)

### Experimental Design:

**Two time courses (one for each peptide)**

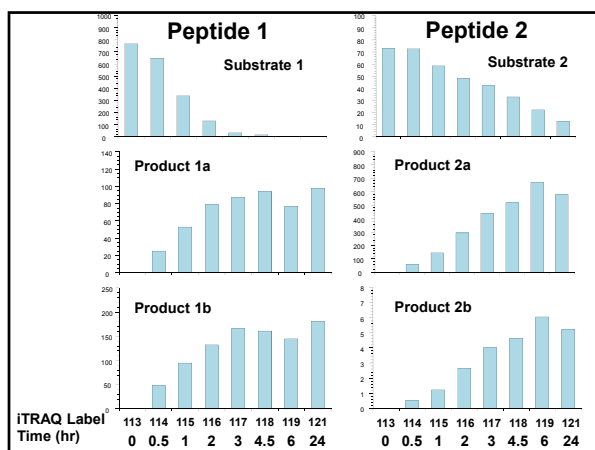
### Two iTRAQ experiments (one for each time course)

Substrate and products labeled with same iTRAQ tag  
at each time point reagent

**Different iTRAQ label for *different* time points**

Mix *all* iTRAQ labeled  
substrates and proteins  
from *all* time points

Run *one* MS analysis (LCMS/MS)  
for *each* time course




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**Software for  
Identifying and Quantifying Proteins**

**Label Free**

<b>Sieve</b>	<a href="http://www.thermo.com">www.thermo.com</a>
<b>MSQuant</b>	<a href="http://msquant.alwaysdata.net">msquant.alwaysdata.net</a>

**Labeling**

<b>ProteinPilot</b>	<a href="http://www.absciex.com">www.absciex.com</a>
<b>Mascot</b>	<a href="http://www.matrixscience.com">www.matrixscience.com</a>
<b>Scaffold Q+</b>	<a href="http://www.proteomesoftware.com">www.proteomesoftware.com</a>
<b>Protein Discoverer</b>	<a href="http://www.thermo.com">www.thermo.com</a>

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