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**ONLINE WORKSHOP | FEBRUARY 26, 2021**

# SINGLE CELL METABOLOMICS WORKSHOP

**ORGANIZED BY:**  
 Rima Kaddurah-Daouk, *Duke University*  
 Jennifer Kirwan, *Berlin Institute of Health*  
 Andrew N. Lane, *University of Kentucky*  
 Mioara Larion, *National Cancer Institute*

**PROGRAM**

**10:00 Welcome and Introduction** Rima Kaddurah-Daouk, *Duke University*

**Session I** Chair: Mioara Larion, *National Cancer Institute*

**10:05 "Single cell metabolomics for biomedical and drug research"**  
 Thomas Hankemeier & Ahmed Ali, *University of Leiden*

**10:35 "High throughput metabolomics of individual cells in the brain"**  
 Jonathan Sweedler, *University of Illinois Urbana-Champaign*

**11:05 "Optical methodologies to characterize the metabolic underpinnings of breast cancer"**  
 Nimmi Ramanujam, *Duke University*

**11:35 Break**


**Session II** Chair: Jennifer Kirwan, *Berlin Institute of Health*


**11:55 "Towards super-resolution metabolic imaging using mass spectrometry imaging"**  
 Ian Gilmore, *National Physical Laboratory, London*


**12:25 "Integrative approaches to study cancer and immune cell metabolism"**  
 Shawn Davidson, *Princeton University*

**General Discussion** Chair: Jonathan Sweedler, *University of Illinois Urbana-Champaign*

**12:55 Discussants:** S. Davidson, I. Gilmore, T. Hankemeier, I. Lanekoff, L-I. McCall, N. Ramanujam, J. Sweedler

**Sponsored by:**  


**Metabolomics Association of North America**  


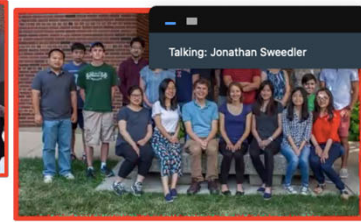


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**Jonathan Sweedler**  
 UIUC

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## Acknowledgements



The Sweedler group  
(2014 - 2021)

## Collaborators

Rohit Bhargava	Junhyong Kim
Paul Bohn	Jean Pierre Mothet
Charles Lee Cox	Leonid Moroz
Jim Eberwine	Phil Newmark
Martha Gillette	Amynah Pradhan
Rhanor Gillette	Justin Rhodes
Jian Jing	Sandra L. Rodriguez-Zas
Neil Kelleher	Joshua Shrout

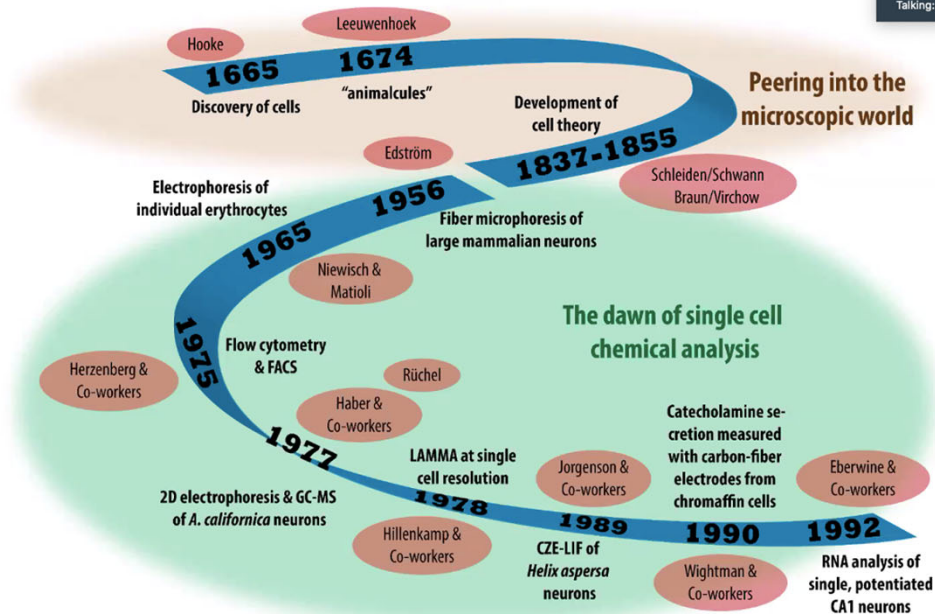
## Funding from:

The UIUC / NIDA Neuropoteomics  
Center on Cell to Cell Signaling  
NIH, NSF, DOE  
American Diabetes Association

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## Moving to single cell measurements: a timeline



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## Molecular Portrait of a single characterized neuron Single-cell analysis from RNAs to proteins

Talking: Jonathan Sweedler

### RNAs

There are about >20,000 distinct lipids, >50,000 metabolites and 200,000 proteoforms reported to be in the brain! Many are not known



### Proteins

### Metabolites, Lipids, Signaling molecules

While mapping is advanced, the chemical characterization of the brain has lagged behind...

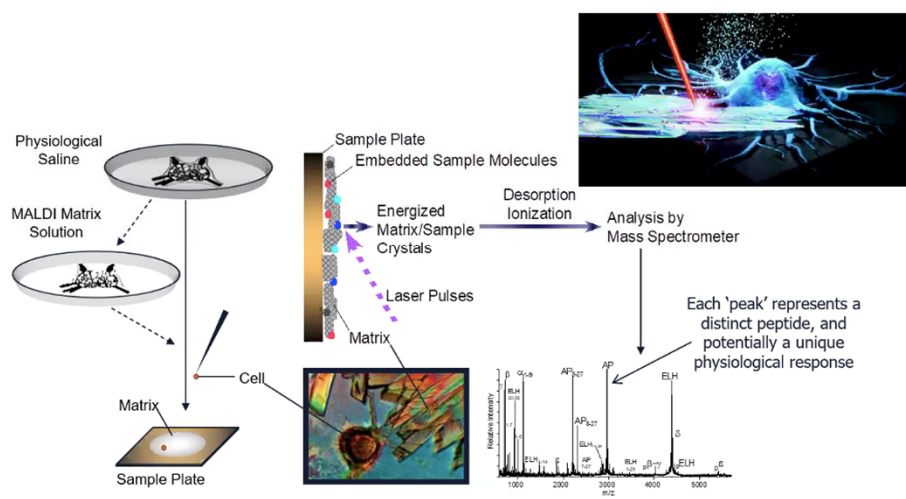
Image from Leonid Moroz, University of Florida

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## Using mass spectrometry (MS) for peptide (cytokines, neuropeptides, hormones)

Talking: Jonathan Sweedler



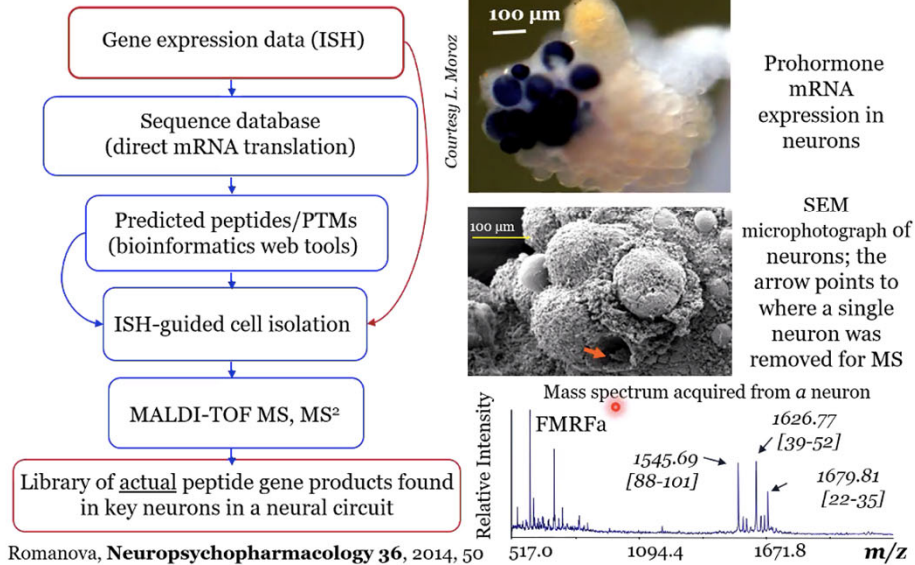
Li et al, Trends Biotechnol. 2000, 18, 151.

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## Identification and mapping novel peptides in defined neuronal circuits

Talking: Jonathan Sweedler

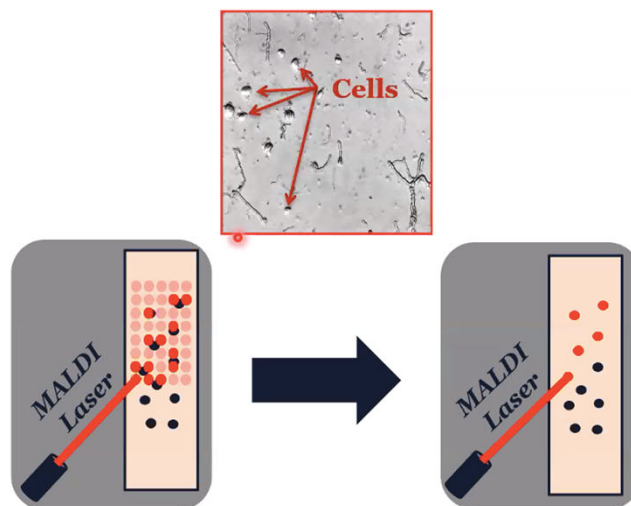


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## A new approach for high throughput single cell mass spectrometry

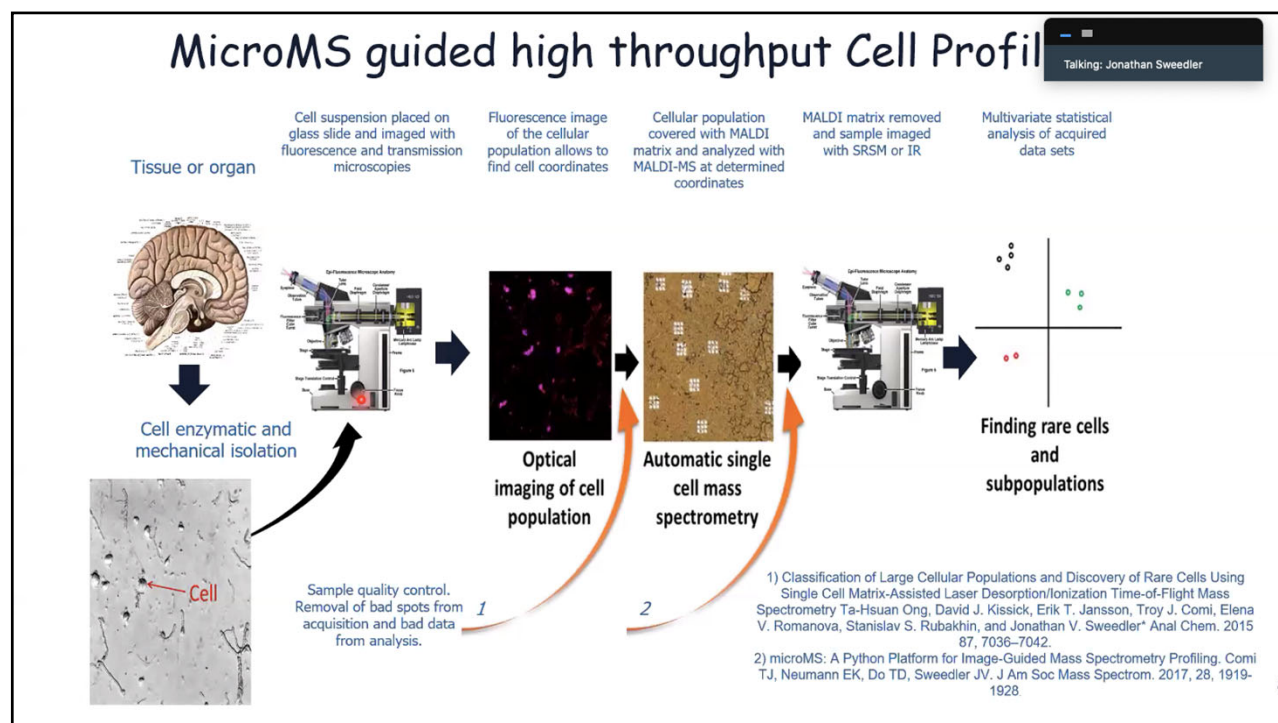
Talking: Jonathan Sweedler



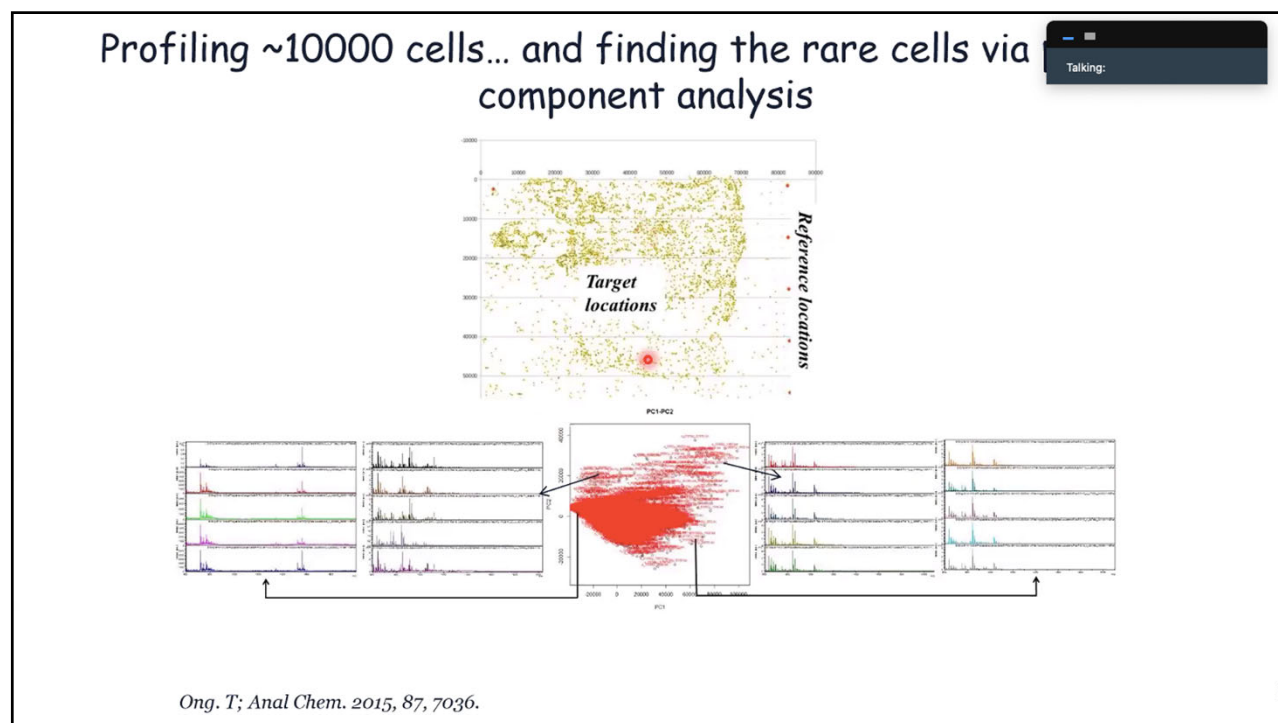
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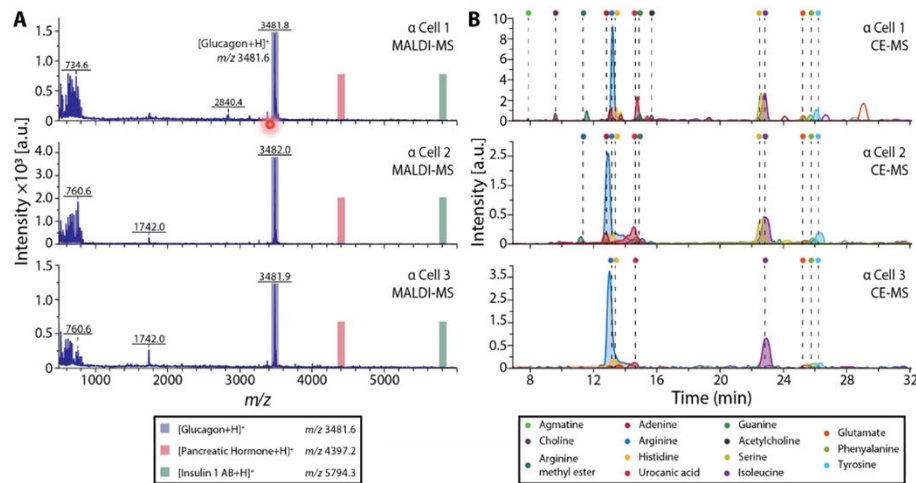


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## Probing the metabolites via capillary electrophoresis mass spectrometry

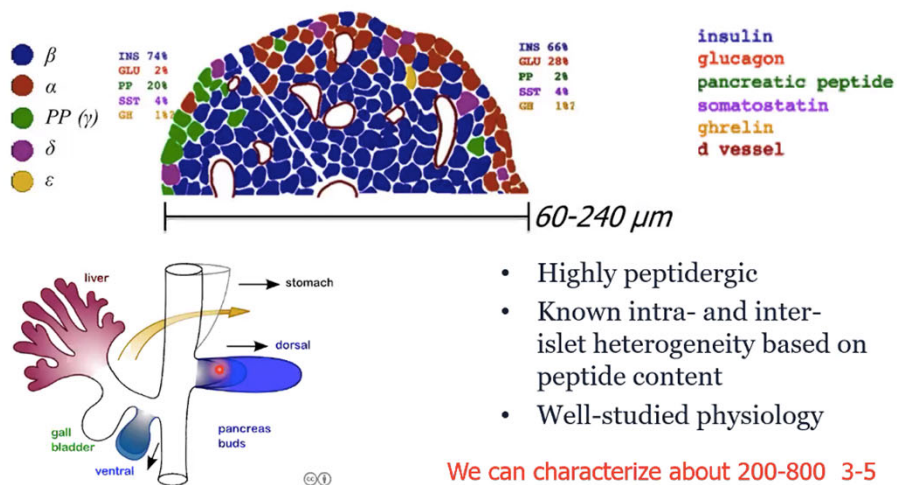


Comi, T. J., Makurath, M. A., Philip, M. C., Rubakhin, S. S., & Sweedler, J. V. *Analyt. Chem* 2017, 89 7765.

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## Pancreatic islets of Langerhans are an attractive system for developing single cell analysis



Suckale, J.; Solimena, M. *Front. Biosci* 2008, 13, 7156.

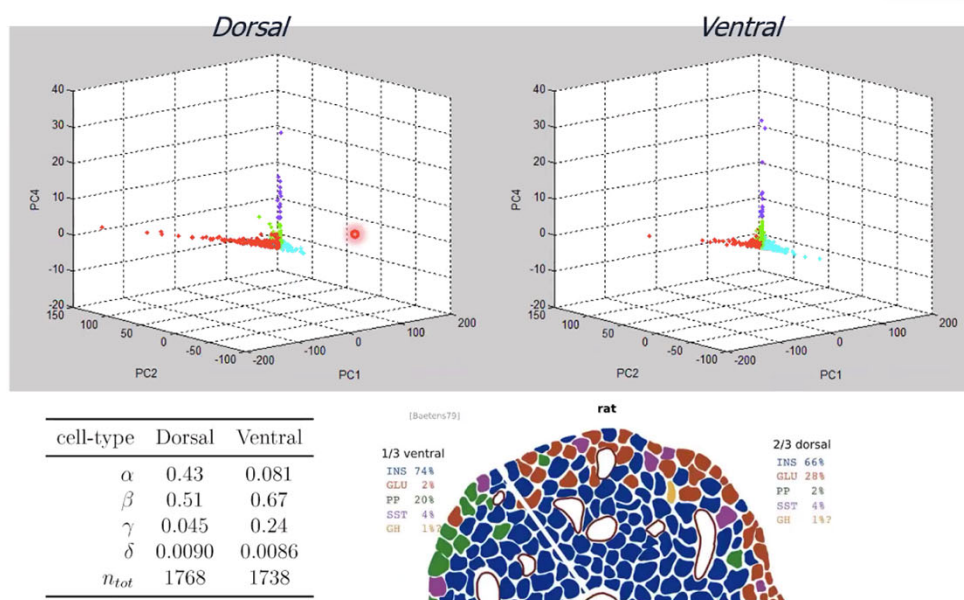
We can characterize about 200-800 3-5 micron cells in an individual islet

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## Cell populations between dorsal and ventral lobes agree with previous histological reports

Talking: Jonathan Sweedler

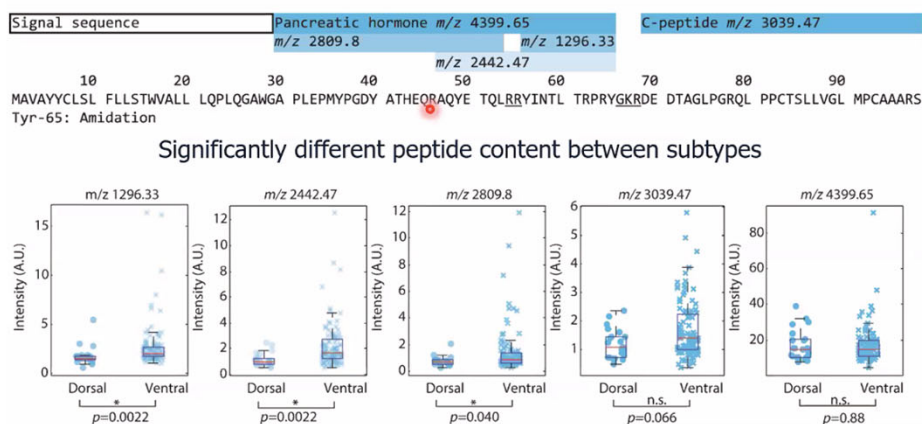


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## Analysis of single cell spectra: differences between cell types

Talking: Jonathan Sweedler



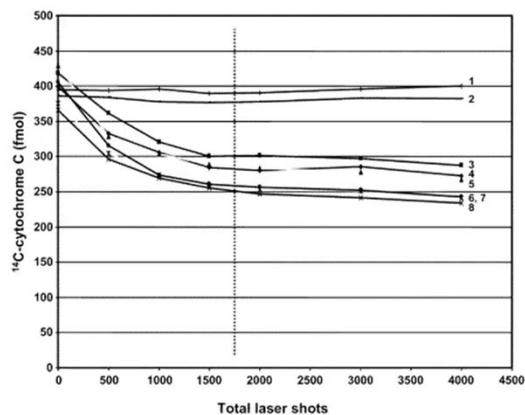
Jansson et al, ACS Chem Biol. 2016,11, 2588.

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## Interlude: MALDI MS can be "non-destructive"

Talking: Jonathan Sweedler



Amount of [ $^{14}\text{C}$ ]-cytochrome c in deposited spots detected by a phosphor-imaging detector after a series of MALDI mass spectral acquisitions. Six different samples are shown, spots 3–8, to illustrate the consistency of the depletion. The two samples in which no mass spectra were acquired, spots 1 and 2, demonstrate that the depletion is a result of laser desorption/ionization. The vertical dashed line indicates the point in the depletion study that the analyte was no longer detected by MALDI MS.

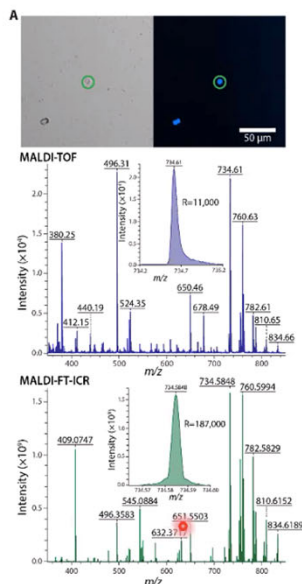
*Anal. Chem.*, 2002, 74 (24), pp 6200

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## microMS architecture supports facile follow-up analyses

Talking: Jonathan Sweedler



Comi, T. J., Neumann, E. K., Do, T. D., & Sweedler, J.V. *J Am Soc Mass Spectrom.* 2017. doi: 10.1007/s13361-017-1704-1.

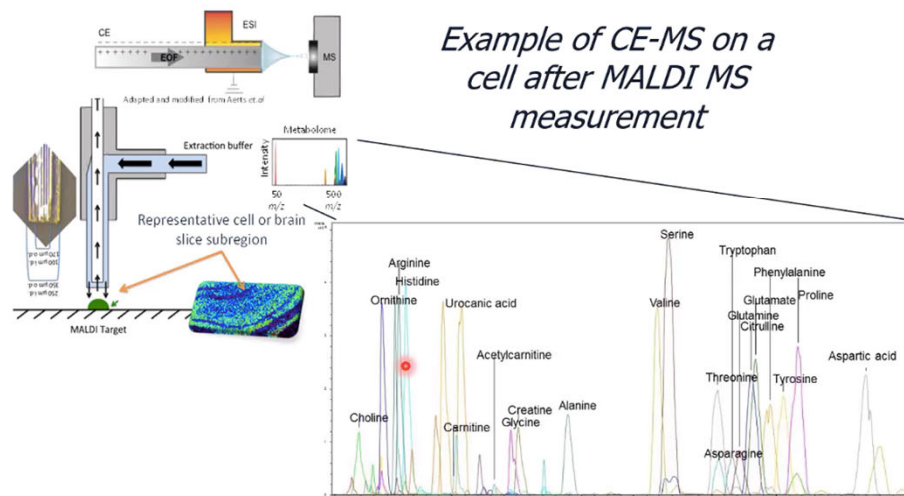
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## Probing the metabolites via capillary electrophoresis mass spectrometry

Talking: Jonathan Sweedler

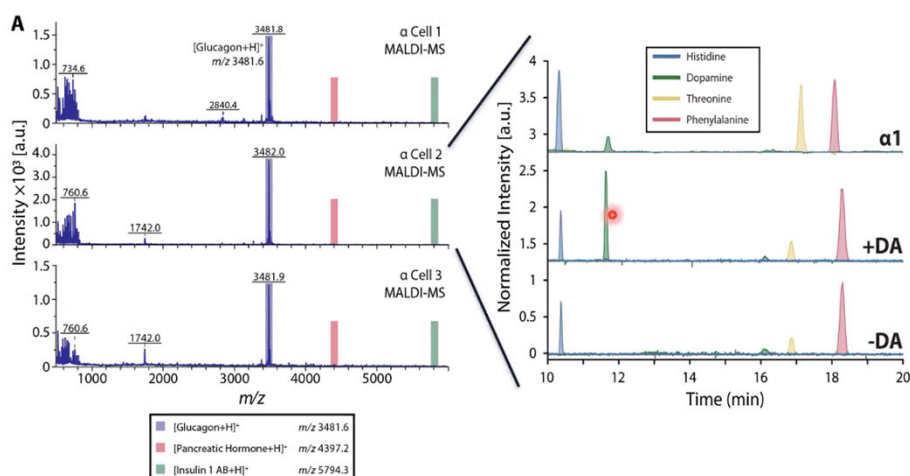
Comi, T. J., Makurath, M. A., Philip, M. C., Rubakhin, S. S., & Sweedler, J.V. *Analyt. Chem* 2017, 89 7765.

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## Probing the metabolites via capillary electrophoresis mass spectrometry

Talking:

Comi, T. J., Makurath, M. A., Philip, M. C., Rubakhin, S. S., & Sweedler, J.V. *Analyt. Chem* 2017, 89 7765.

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Human islet of Langerhans: Are these structures chemically heterogeneous in a patient and how does this heterogeneity change during the development of diabetes?

Talking: Jonathan Sweedler



Individual islets of varying sizes



Individual cells

Samples are kindly provided by Dr. Chengyang Liu and Dr. Ali Naji, Human Pancreas Analysis Program (HPAP, UPENN)

*Sweedler group unpublished*

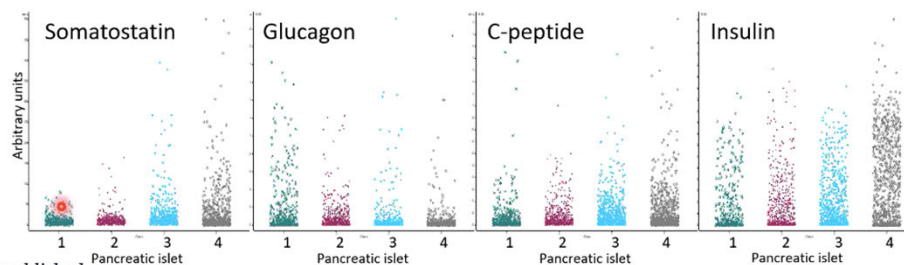
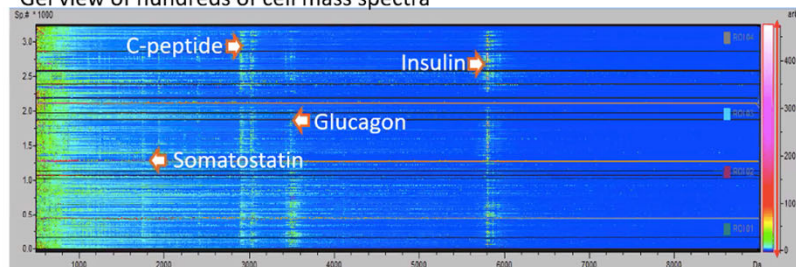
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Comparison of chemical profiles of high density populations of four individual pancreatic islets

Talking: Jonathan Sweedler

Gel view of hundreds of cell mass spectra

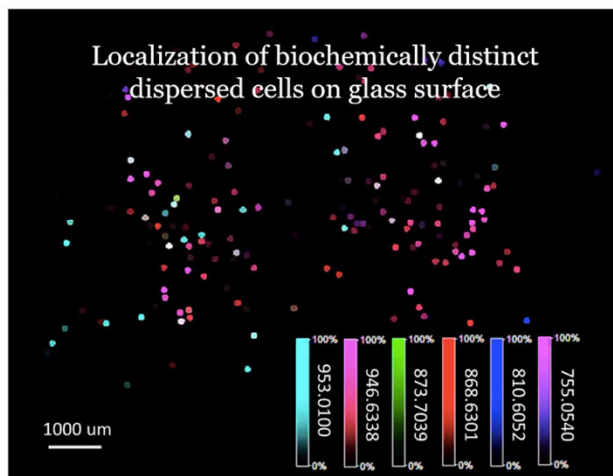


*Sweedler group unpublished*

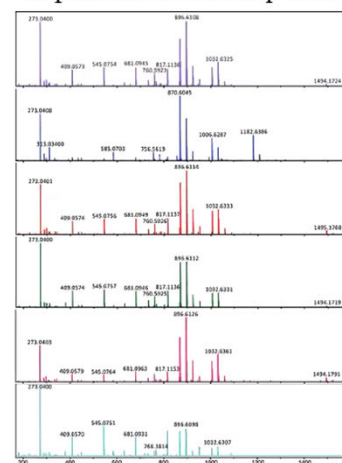
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## High throughput single cell MALDI MS reveals cellular heterogeneity of the cerebellum



### Representative mass spectra



We can see large differences in lipids and other molecules, even from so-called “identical” cells...

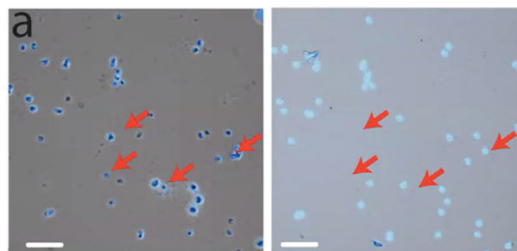
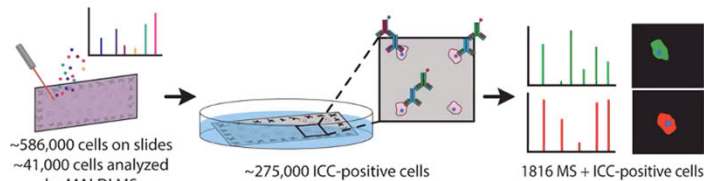
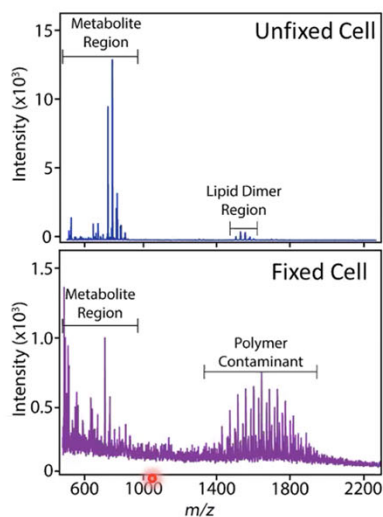
Neumann et al, Anal Chem. 2019, 91, 7871.

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## What are the cells?

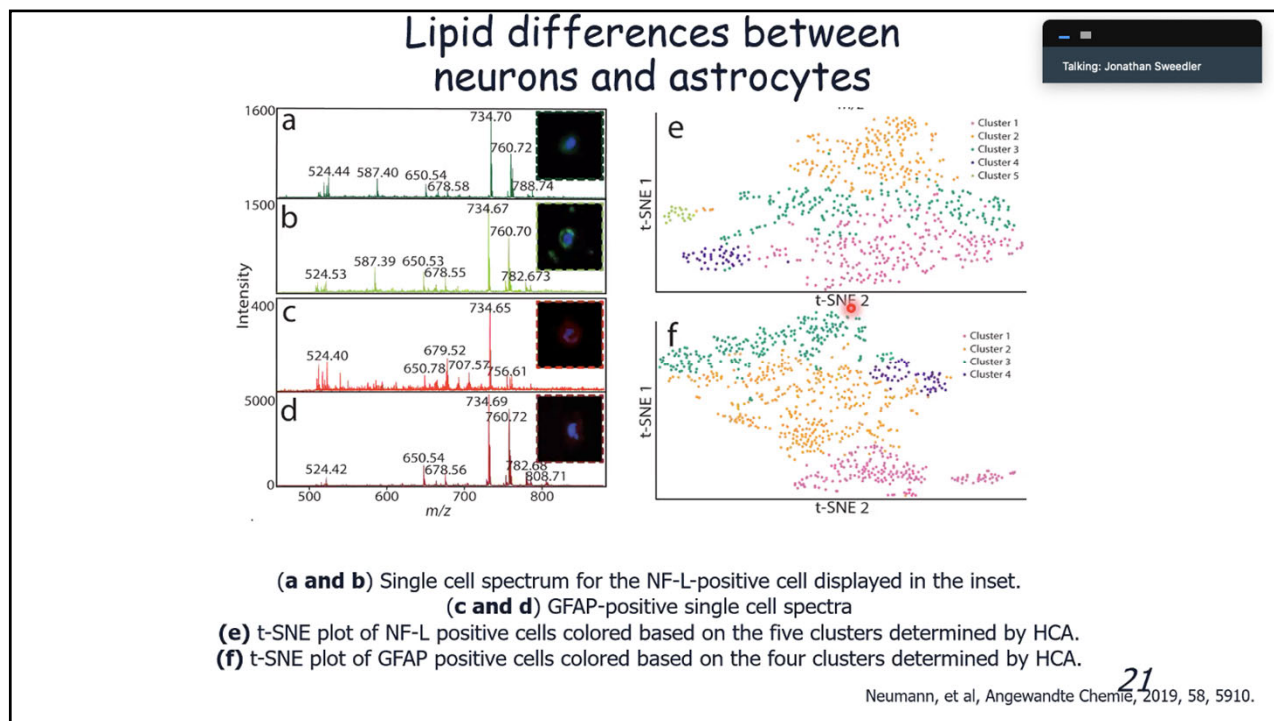
Adding immunocytochemistry to our MS workflow



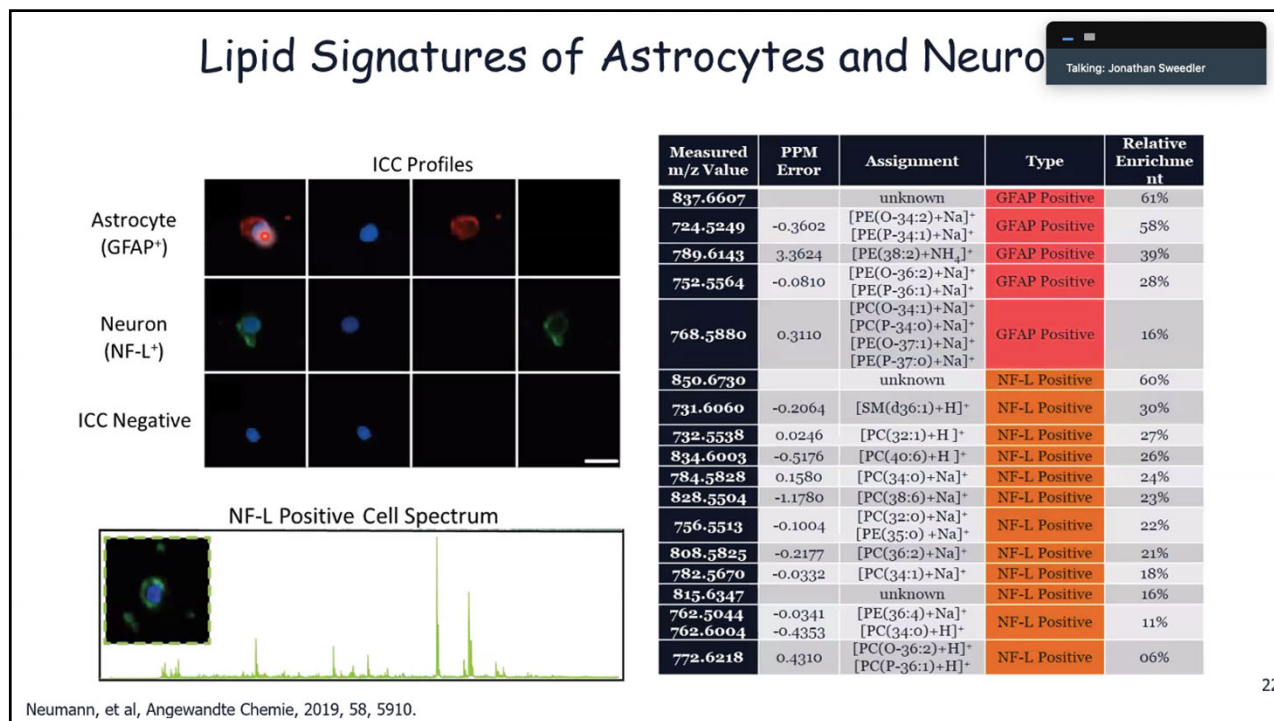
Neumann, et al, Angewandte Chemie, 2019, 58, 5910.

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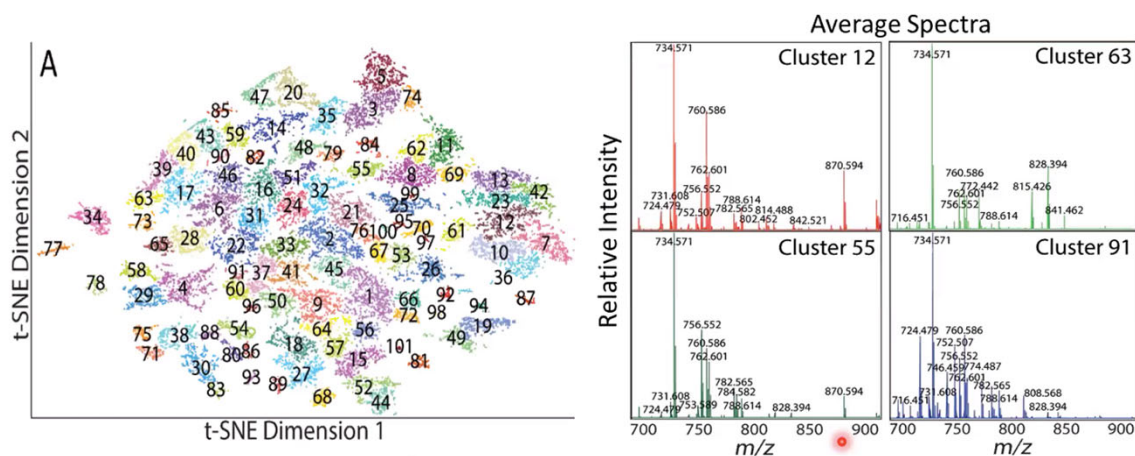
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## Characterizing the lipids in 30,000 individual cells with MALDI-FT-ICR MS

Individual isolated adult rat cerebellum cells from 6 animals

Talking: Jonathan Sweedler



Separates into 101 Clusters based on Lipid Features

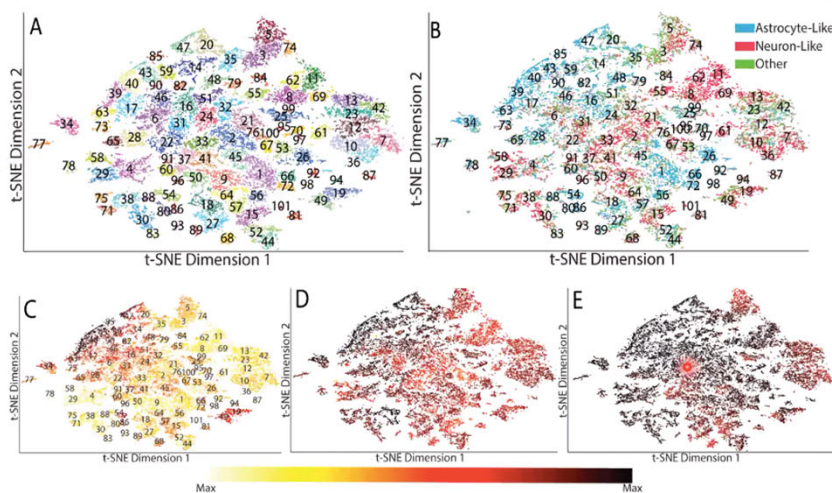
Neumann et al, Anal Chem. 2019, 91, 7871.

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## Characterizing the lipids in 30,000 cells with single cell MALDI-FT-ICR MS

Talking: Jonathan Sweedler



t-SNE recolored by relative amount of (C) phosphatidylcholine, (D) sphingomyelin and (E) phosphatidylglycerol lipid species to visualize the localizations of lipid classes.

Neumann et al, Anal Chem. 2019, 91, 7871.

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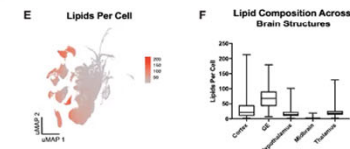
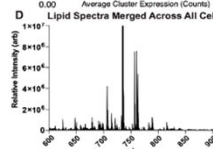
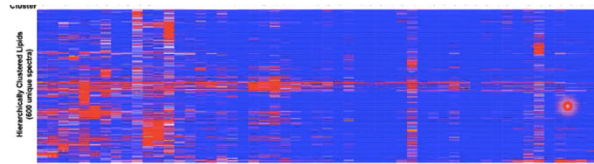
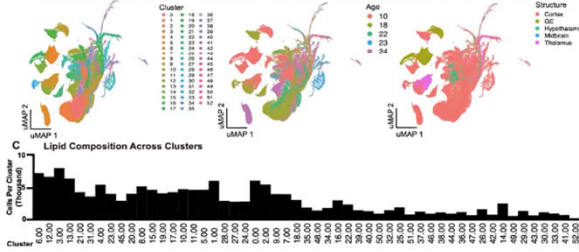
# Creating an atlas of single cell lipid profiles of the developing human brain

Talking: Jonathan Sweedler

## A Workflow of Single-cell Lipidomics on Developing Human Brain



## B Single-cell Lipidomics of 154,910 Cells Identifies Diversity and Heterogeneity Across Human Brain Development



With Kriegstein UCSF and Bhaduri UCLA (unpublished)

Single-cell lipidomics of the cortex, ganglionic eminences (GE), hypothalamus, midbrain, thalamus of the developing human brain between gestational weeks (GW) 10 – 23 with more than 150,000 cells assayed; 53 unique lipidomic clusters (bottom left) visualized by uniform manifold approximation and projection (UMAP) were identified via Louvain clustering. Some of these clusters were enriched in lipids at specific ages while other clusters were intermixed across stages or regions. On average, there were 2923 cells per cluster ranging from 184 to 9153. The lower right shows summed mass spectra from all cells, demonstrating how bulk analysis is insufficient for assaying lipid diversity, the UMAP recolored by number of cells, and the distribution of lipids per cell for each sampled brain structure.

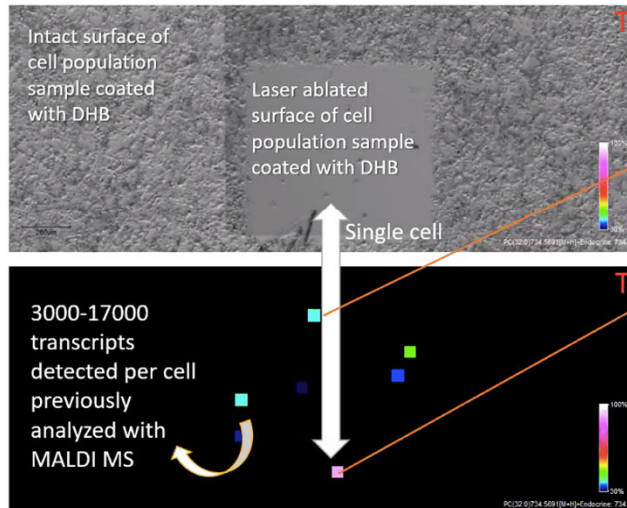
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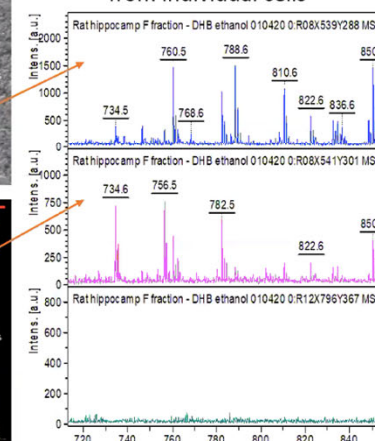
# Hyphenation of single cell mass spectrometry and transcriptomics

Talking: Jonathan Sweedler

Rat hippocampal cell population analyzed using single cell MALDI MS. Individual cells are collected and sent to the Eberwine laboratory for transcriptomics



## Examples of mass spectra obtained from individual cells



## Lipids found in hippocampal cell extracts

Lipid	exact mass
• PC(32:0)	734.5694
• PC(32:0)+Na	756.5514
• PC(34:1)	760.5851
• PC(32:0)+K	772.5253
• PC(36:1)	788.6164
• PC(34:1)+K	798.5410
• PC(34:0)+K	800.5566
• PC(38:6)	844.5253

DHB MALDI matrix is water soluble and can be removed with PBS wash. However, it requires higher laser beam intensity - 60%.

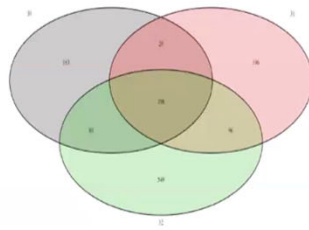
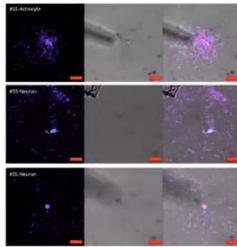
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## The greatest information from a single cell ever!

With Jim Eberwine U Penn

Isolate individual cells, perform MS, and then send to Eberwine's group for transcriptomics. single cell transcriptomics after MS!



Genes expressed in all three cells

Acta1	Zfp1	Srm1
Acta2	Zfp2	Srm2
Acta3	Zfp3	Srm3
Acta4	Zfp4	Srm4
Acta5	Zfp5	Srm5
Acta6	Zfp6	Srm6
Acta7	Zfp7	Srm7
Acta8	Zfp8	Srm8
Acta9	Zfp9	Srm9
Acta10	Zfp10	Srm10
Acta11	Zfp11	Srm11
Acta12	Zfp12	Srm12
Acta13	Zfp13	Srm13
Acta14	Zfp14	Srm14
Acta15	Zfp15	Srm15
Acta16	Zfp16	Srm16
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Acta100	Zfp100	Srm100

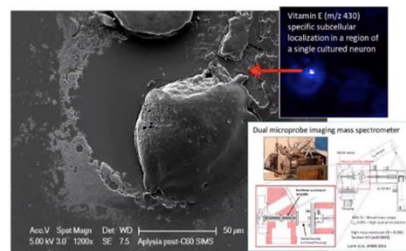
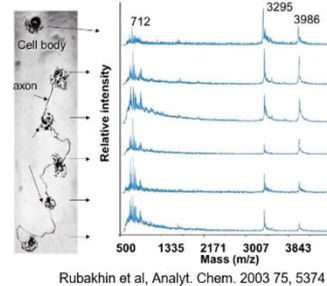
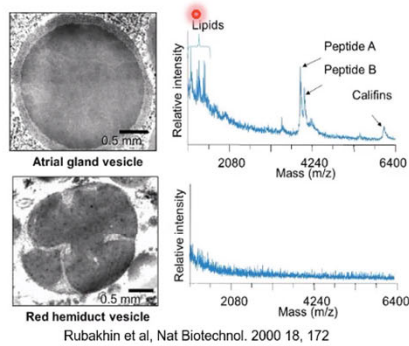
With Eberwine, UPenn

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## Subcellular profiling of neurons!

MALDI MS of hormones in a large dense core vesicle, lipids and neuropeptides in an axon, and vitamin E in a damaged cultured cell



Each type of separation, mass analyzer and ionization source provides distinct advantages in terms of spatial resolution, detectability and observed molecular class

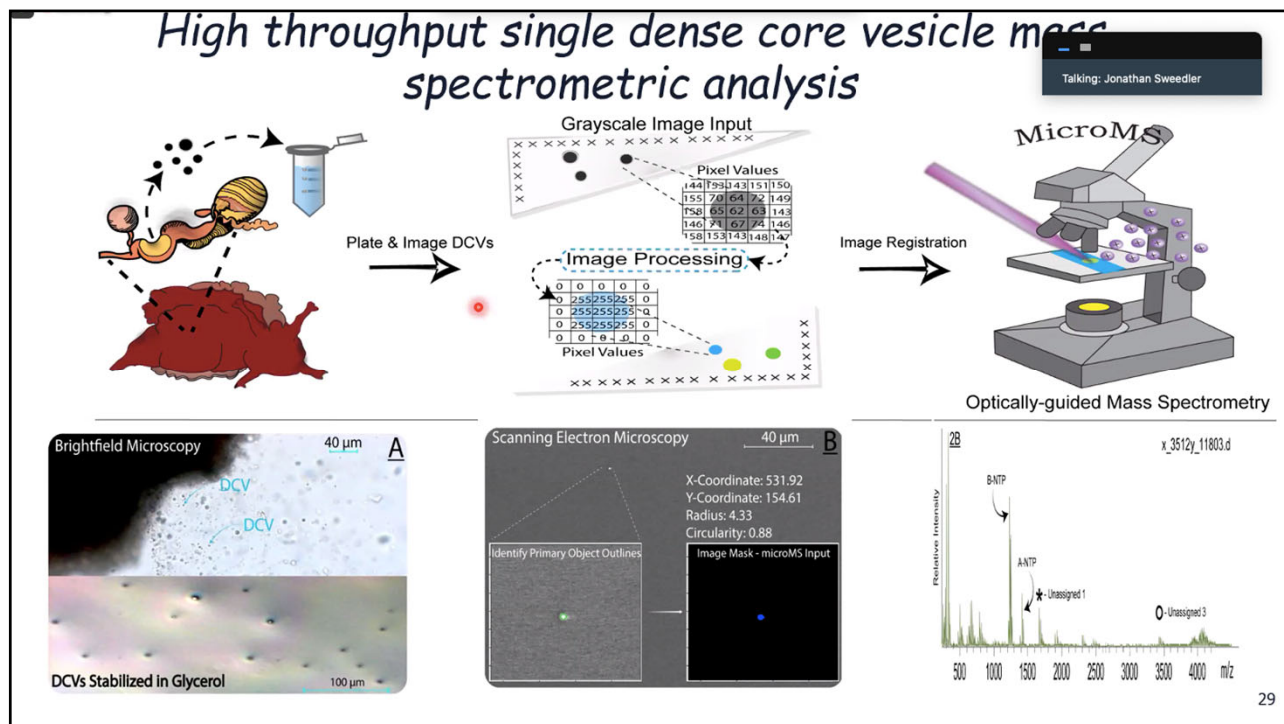
The major components in subcellular domains are measureable

Can we make these measurements high throughput?

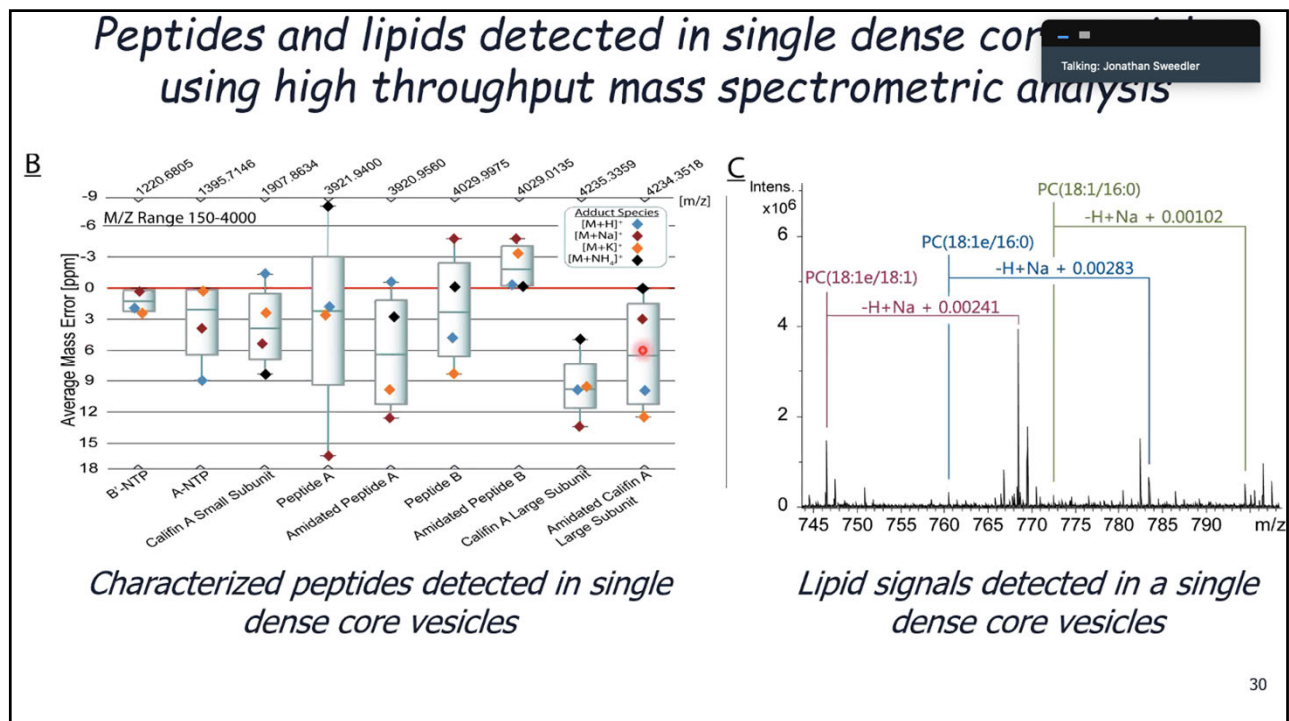
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