

# Mass Spectrometry Analysis of Proteins Using Electron Transfer Dissociation

## Statistical Model

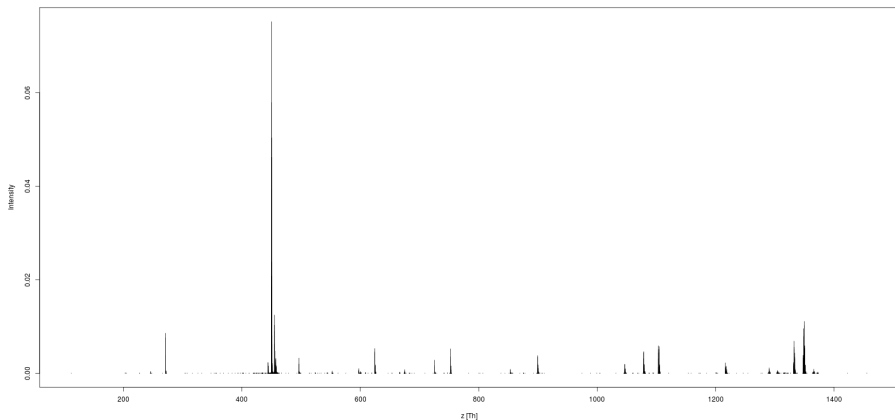
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# Data from a Mass Spectrometer for a given substance.



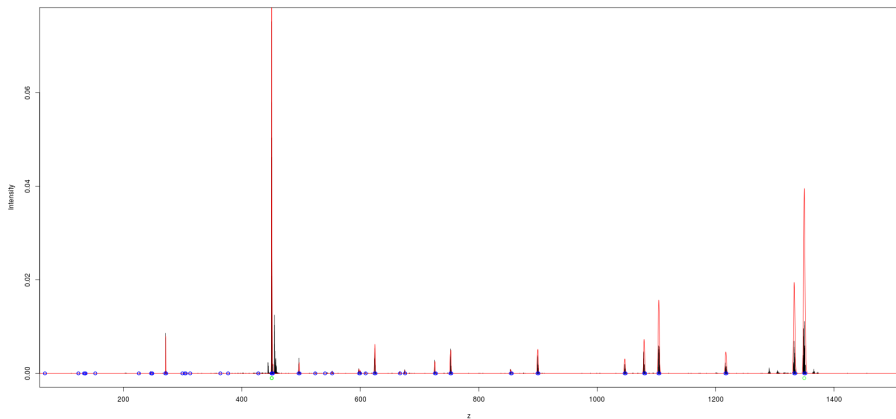
# Today's Agenda

- Understanding ETD statics
- Next step : understand dynamics
- Quantitative approach : potential characterisation of peptides through the use of MASS SPEC. But not certain yet how to do it.

# Project MassTodon: Debriefing

- Answers to:
  - What results from applying several actions on many molecules of a given type? Actions such as
    - Cleavage of peptide bond
    - Lost of proton
    - Gain of electron
  - Which reaction trails are most probable?
- Maturity?
  - Non-optimised reactions enumeration.
  - Non-calibrated fitting procedures.
- But who cares? To some extent - it works (for one substance).

# Theoretically Explained Spectrum

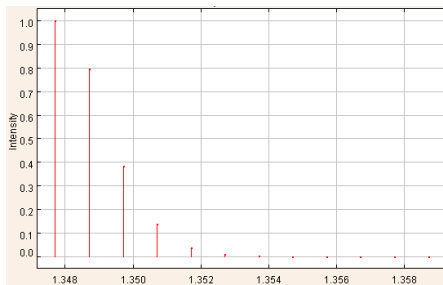


# Today's Agenda

- 1 What is our motivation?
- 2 Statistical Modelling
- 3 Generating DAGF
- 4 What remains to be done?

# Multinomial Model

- What is being explained?
  - Distributions of masses
  - Deviations from monoisotopic peaks



# Multinomial Model

- Modelling isotope distributions

- $\mathcal{P}(^{16}\text{O}) = 99.757$
- $\mathcal{P}(^{17}\text{O}) = 0.038$
- $\mathcal{P}(^{18}\text{O}) = 0.205$

- Molecule =  $\text{C}_c\text{H}_h\text{O}_o\text{N}_n\text{S}_s$

- Assumptions

- Isotope variant of a single atom from  $\text{C}_c\text{H}_h\text{O}_o\text{N}_n\text{S}_s$  (e.g. C) independent of isotope variants of other atoms  
*i.e.* for a molecule with 2 atoms

$$\mathcal{P}(^{13}\text{C}^{17}\text{O}) = \mathcal{P}(^{13}\text{C}) \times \mathcal{P}(^{17}\text{O})$$

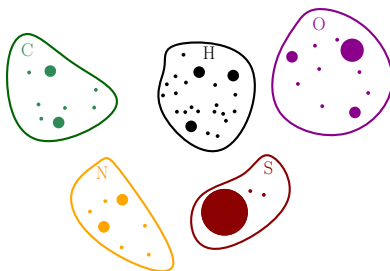
- We cannot discern among isomers

$$^{13}\text{C}^{17}\text{O}^{17}\text{O} \simeq ^{17}\text{O}^{13}\text{C}^{17}\text{O} \simeq ^{17}\text{O}^{17}\text{O}^{13}\text{C}$$



# Multinomial Model

- Chemical compound = list of sets of atoms



$$\mathcal{P}(\underbrace{c_{12}^{12}\text{C}, c_{13}^{13}\text{C}}_{c_{12}+c_{13}=c}, \underbrace{h_1^{1}\text{H}, h_2^{2}\text{H}}_{h_1+h_2=h}, \dots, s_{36}^{36}\text{S}) =$$

$$\binom{c}{c_{12}, c_{13}} \mathcal{P}({}^{12}\text{C})^{c_{12}} \mathcal{P}({}^{13}\text{C})^{c_{13}} \binom{h}{h_1, h_2} \mathcal{P}({}^1\text{H})^{h_1} \mathcal{P}({}^2\text{H})^{h_2} \dots$$

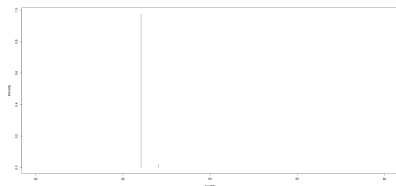
# Multinomial Model and Molecular Mass

- Atomic mass  $m$  of a molecule  $R = (c_{12}, c_{13}, \dots, s_{36})$ 
  - ★  $m_R = c_{12} m_{^{12}\text{C}} + \dots + s_{36} m_{^{36}\text{S}}$
  - ★  $\mathcal{P}(m_R = m) = \sum \mathcal{P}(c_{12} ^{12}\text{C}, \dots, s_{36} ^{36}\text{S})$
- s.t.  $m_R = c_{12} m_{^{12}\text{C}} + \dots + s_{36} m_{^{36}\text{S}}$ 
  - Good news: theory operates on chemical formulas
    - given a formula  $F$ , we calculate it's mass probability.
    - No need to solve these equations!
- Cool thing
  - Masses of neutrons for different elements are not equal!
  - Modern mass specs can already discern them
  - ★ To some extent - we neglect that for now

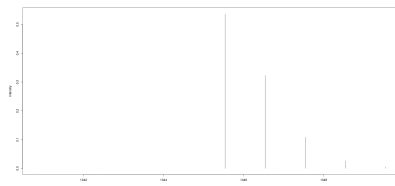
# Visualising Multinomial Model

- BRAIN software - Piotr Dittwald<sup>®</sup>

Ethanol  $C_2H_5OH$

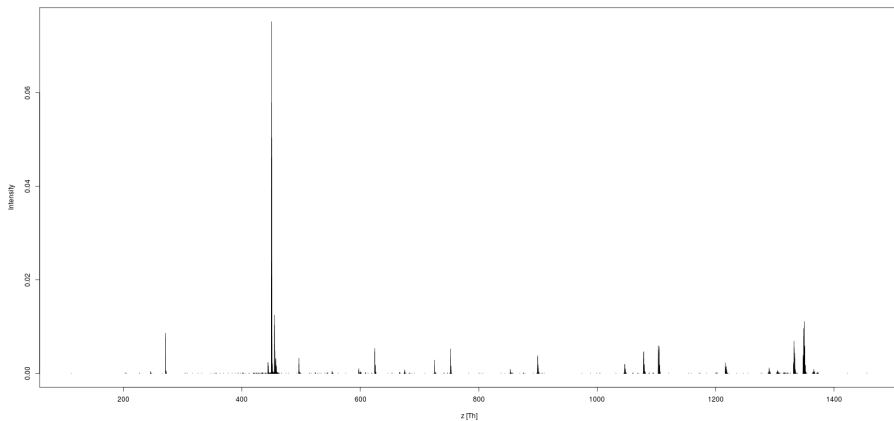


Angiotensin II  $C_{50}H_{71}N_{13}O_{12}$

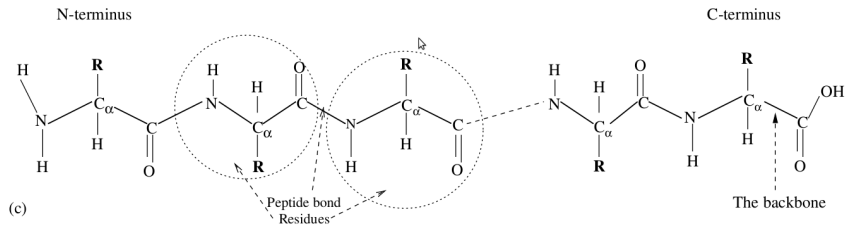


- Alas! Real spectra are multimodal!
  - fragmentation? (ETD)
  - charge reductions? (ETD, ETnoD, PTR)

# Mass Spec results for substance P



# Polymer as a sequence of Amino Acids

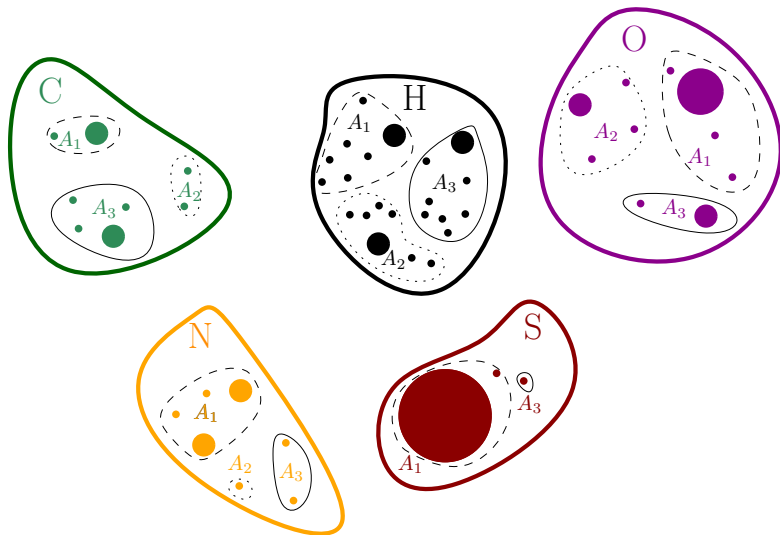


- Extra structure in our model must be added

$$C_c H_h O_o N_n S_s = A_1 A_2 \dots A_k$$

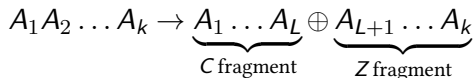
$$A_i \in \{ \text{Alanine, Cysteine, Aspartic Acid, Glutamic Acid, ...} \}$$

# Molecule Subdivided into Amino Acids



# Electron Transfer Dissociation

- Result: random cleavage of the peptide in two subsequences



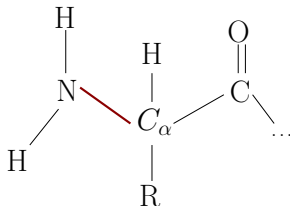
- $L$  = index of the cleaved peptide bond (N-terminus to C-terminus)

- Assumption

- Cleavage independent of isotope composition

$$\mathcal{P}(A_1 \dots A_L = a_1 \dots a_L | L = l) =$$

$$\mathcal{P}(A_1 \dots A_l = a_1 \dots a_l)$$



- Minor complication

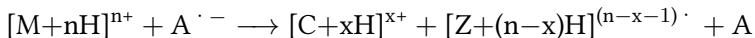
- Cleavage solely on  $A_1$

# Reactions considered by Frederik, our fellow chemist

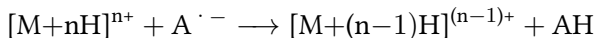
Hypothesis:

★ Empirical spectrum = Result of Several Reactions

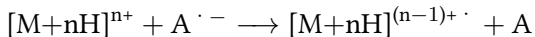
- ETD



- PTR



- ETnoD



- Not good description of rules

e.g. Concatenating reactions:  $ETD \rightarrow PTR \rightarrow PTR \rightarrow ETnoD$



# Correct Rules

- Additional Description of  $C_cH_hO_oN_nS_s-$  ( $p, q$ )
  - $p$  - protonisation
    - $n^\circ$  of extra protons
    - charge state of a given molecule
    - adds weight to molecule
  - $q$  - neutralised protonisation
    - $n^\circ$  of extra protons paired with electrons
    - only adds weight
- Problem Input ( $A_1A_2 \dots A_k, p, q$ )

# Reactions revised: post-doc in accountancy

- Problem Input  $(A_1 A_2 \dots A_k, p, q)$

- Some Partial Reactions

♣ ETD

→  $(A_1 \dots A_L, p_1, q_1)$

→  $(A_{L+1} \dots A_k, p_2, q_2)$

s.t.  $p_1 + p_2 = p - 1$  and  $q_1 + q_2 = q$  and  $q_2 \geq 0$

◇ PTR

→  $(A_1 \dots A_k, p - 1, q)$

♥ ETnoD

→  $(A_1 \dots A_k, p - 1, q + 1)$

♠ HTR

→  $(A_1 \dots A_L, p_1, q_1)$

→  $(A_{L+1} \dots A_k, p_2, q_2)$

s.t.  $p_1 + p_2 = p$  and  $q_1 + q_2 = q + 1$  and  $q_2 \geq 1$

# Algorithm?

- Inputs:

- $S = [M = A_1 \dots A_k, p = \text{Maximal Charge}, q = 0]$
- Partial Reactions =

$$= \{\mathfrak{I}\mathfrak{D}, \clubsuit_{L,p_1,q_1}^C, \clubsuit_{L,p_2,q_2}^Z, \diamondsuit, \heartsuit, \spadesuit_{L,\tilde{p}_1,\tilde{q}_1}^C, \spadesuit_{L,\tilde{p}_2,\tilde{q}_2}^Z\}$$

- Reactions =

$$= \{r_1 r_2 \dots r_k : r_i \text{ is a Partial Reactions and is OK}\}$$

e.g.  $\clubsuit_{L,2,1}^C \heartsuit, \heartsuit \diamondsuit$  might be valid reactions if

- $S$  has enough charges
- $M$  long enough
- there were  $q$  reactions before ET resulting in proton neutralisation
- Empirical Spectrum  $y = \left\{ \left( \frac{m_j}{z_j}, l_j \right) \right\}_{j=1}^J$

# Precising the hypothesis

- Observations:

- Each reaction is also a triplet  $R = [F, p, q]$
- $F \sim$  Multinomial Distribution
- $m_F$  - corresponding mass distribution

$$\frac{m_R}{z_R} = \frac{m_F + p + q}{p}$$

## Hypothesis

$$\star y = \sum_{R \in \text{Reactions}} \alpha_R \frac{m_R}{z_R} + \text{Error}$$

$$\text{s.t. } \alpha_R \geq 0 \text{ and } \sum_R \alpha_R \leq 1$$

- Problem: need for software that

- finds Reactions
- estimates  $\alpha_R$  so that error is smallest possible

# Project massTodon

- Operating

# Statics: Directed Acyclic Graph of Formulas




- What can be discerned?
- Certain Trails

# Statics: Directed Acyclic Graph of Formulas

# Whole lotta of things to do.

- Algorithmically
  - Optimise the DAG generation
    - Take into account numerous repetitions.
    - Example : PTR- $\rightarrow$ ETnoD = ETnoD- $\rightarrow$ PTR.
  - Calibrate fitting procedures: stick spectra more jazzy among chemical homies, and the hood does not give a shit about approximations.
  - Derive quick procedures for stick spectra generation: modify BRAIN.
- Experimentally
  - More substances to analyze
  - Mixtures of substances
- Pragmatically
  - What if the substance is not known?



-  Ingvar Eidhammer, Kristian Flikka, Lennart Martens, Svein-Ole Mikalsen, *Computational Methods for Mass Spectrometry Proteomics*. Wiley-Interscience, 2007.
-  Igor Kaltashov, Stephen J. Eyles *Mass Spectrometry in Biophysics: Conformation and Dynamics of Biomolecules*. Wiley-Interscience, 2005.
-  Prof. Gavin E. Reid *Mass Analyzers*. Lecture slides from the First International Mass Spectrometry School, 2013.