# Super-resolution in FT-ICR MS by non-Fourier Transform genetic evolution signal processing

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1	What is an evolutionary algorithm ?
2	Sinus_it
3	Results





#### **Evolutionary algorithms (EAs)**

- Bio-inspired algorithms that simulate evolution by natural selection in order to solve optimization problems or find innovative solutions
- We create a virtual population of individuals that are candidate solutions to the problem we want to solve



• Used in artificial creation, travel salesman problem, signal processing









#### Evolutionary algorithm (example : onemax)

- An individual is a combination of N bits : ...1001011100010110...
- A mutation corresponds to the modification of a bit (0 switches to 1 or the inverse)
- The crossover function consists in cutting the individual into two and exchange the first/second part of each individual

   ...10010111 00010110...
   ...00110010 11011010...
- Evaluation function is to count the number of 1's
- Stopping criteria : the maximal value was found (only 1's).



#### Plotting onemax results (N=100 bits / ≈10^30 combinations !)





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#### Implementation

- Sinus\_it is an evolutionary algorithm implemented with EASENA from CSTB, Strasbourg University
- The program is in C++/CUDA in order to have high control over the hardware and to benefit from the speed of the C++ langage.





NVIDIA RTX 2080 TI

 The program was run on a 2 × 16 cores 2.1 Ghz Intel Xeon server with one GPU Nvidia RTX 2080 Ti card





#### State of the art

• Filter diagonalization to achieve super-resolution



KOZHINOV, Anton N. et TSYBIN, Yury O. Filter diagonalization method-based mass spectrometry for molecular and macromolecular structure analysis. *Analytical chemistry*, 2012, 84, 2850-2856.

• Or having correct mass isotopic ratios



BILLS, Jacob R., NAGORNOV, Konstantin O., KOZHINOV, Anton N., *et al.* Improved Uranium Isotope Ratio Analysis in Liquid Sampling–Atmospheric Pressure Glow Discharge/Orbitrap FTMS Coupling through the Use of an External Data Acquisition System. *Journal of the American Society for Mass Spectrometry*, 2021, 32, 1224-1236.



Workflow



#### Signal fitting

- Sinus\_it tries to approach/fit the decaying sinusoidal signal
  - e.g. With an individual
    - sine1 = 6578.95 \* sin(2\*pi\*0.2688379 + 1.40878)
    - sine2 = 68232.5 \* sin(2\*pi\*0.2688365 + 1.41167)
    - sine3 = 1142.58 \* sin(2\*pi\*0.2608350 + 1.41348)
  - The real signal is
    - sine1 = 6575.94 \* sin(2\*pi\*0.2688378 + 1.40905)
    - sine2 = 68139.09 \* sin(2\*pi\*0.2688365 + 1.41165)
    - sine3 = 1150.13 \* sin(2\*pi\*0.2688359 + 1.41284)



Comparison of the real signal (blue dash) and the candidate solution (orange line)



## **Recall plan**

1	What is an evolutionary algorithm ?
2	Sinus it
2	
3	Results





#### Coarse isotopic graph (Substance P simulated / 7 peaks)



#### Coarse isotopic graph (Substance P simulated / 7 peaks)



#### Fine isotopic graph (Substance P simulated / 1<sup>st</sup> isotope)



#### Coarse isotopic distribution (Substance P real signal / 5 peaks)



#### **Coarse isotopic distribution ( Gluthation real signal narrow band)**

#### Sinus\_it with dynamic number of sine



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#### Glutathione (broad band) frequency, phase vs time

- Glutathione (broad band, sampling frequency 1 MHz), monoisotopic peak
- 32k transients sliced on 16M transient at different time (kpoints = 1.024 ms)



• Phases and frequencies varie along the transient and are correlated









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#### **Speed and complexity**



- Sinus\_it execution time propotionnal to:
  - Sine
  - Generations ٠
  - Coarse isotopic: ~2-3 hours ٠
  - Fine isotopic: ~4 hours •







#### Conclusion

- FFT has many drawbacks
  - limited resolving power,
  - Shannon-Nyquist limit,
  - damping, apodization ...
- Sinus\_it is a genetic algorithm that achieves harmonic inversion of exponentially damped sine without these drawbacks and is close to the theoretical maximum resolution (super-resolution).

CANDÈS, Emmanuel J. et FERNANDEZ-GRANDA, Carlos. Super-resolution from noisy data. *Journal of Fourier Analysis and Applications*, 2013, 19, 1229-1254.

• Sinus\_it can find the right amplitude for quantification, or the decay constant as well as the correct phase.



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