# GPU Multiple Sequence Aligner

Fourier-Space Cross-Correlation Alignment

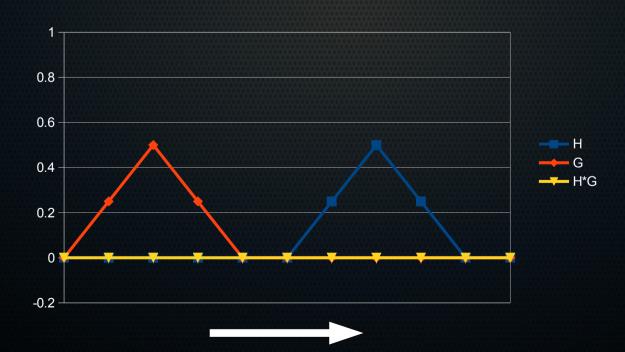
#### **Cross-Correlation Alignment**

- Overview
  - Introduction
  - Cross-Correlation (Time-domain)
  - Cross-Correlation (Feq-domain)
  - DNA to Complex Time-Series
  - Alignment Results
  - Performance Results

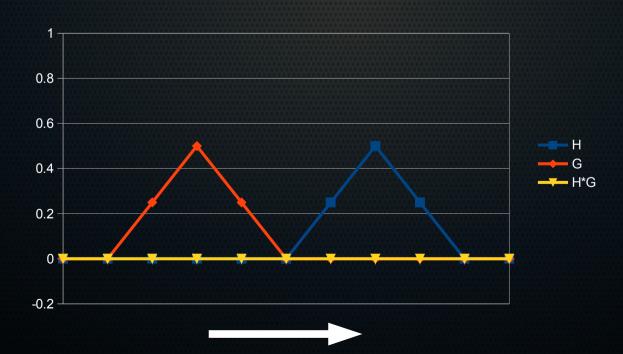
#### **Cross-Correlation Alignment**

- Introduction
  - Common methods for alignment
    - Smith-Waterman
    - Needleman-Wunsch
    - Suffix trees
    - Many more...
  - Cross-Correlation
    - Well-studied Signal Processing method
    - Works well with Long sequences
    - Regular and Complementary matching in one

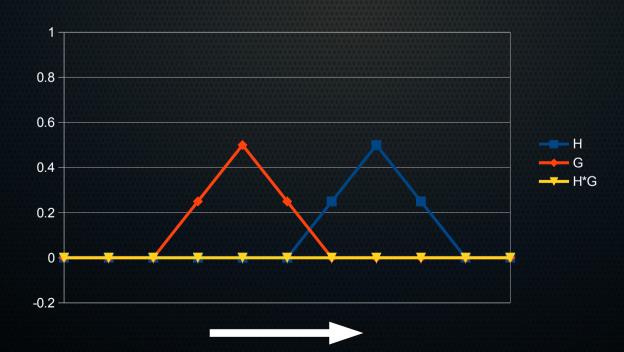
- Cross-Correlation (time-domain)
  - Compute similarity between 2 time-series
    - Also yields time-delay/phase-shift
  - O(n^2) efficiency



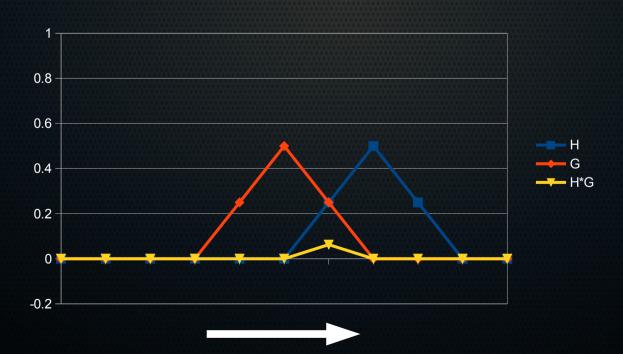
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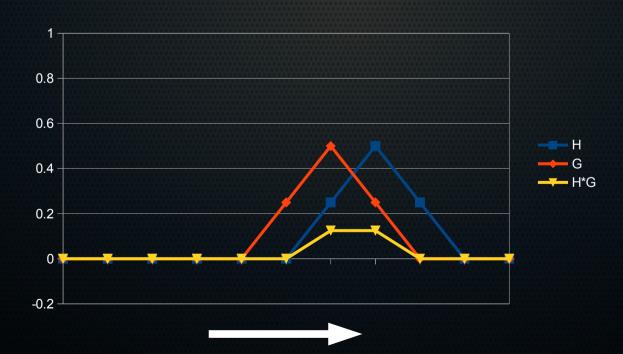
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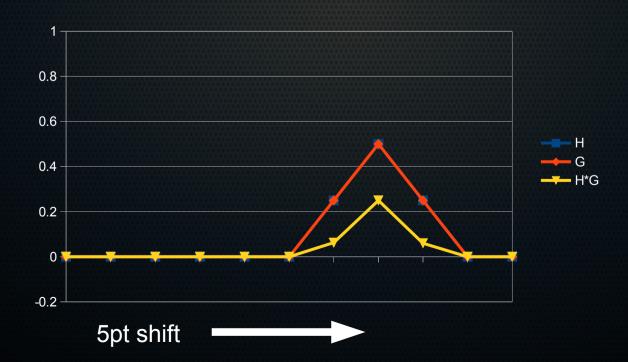
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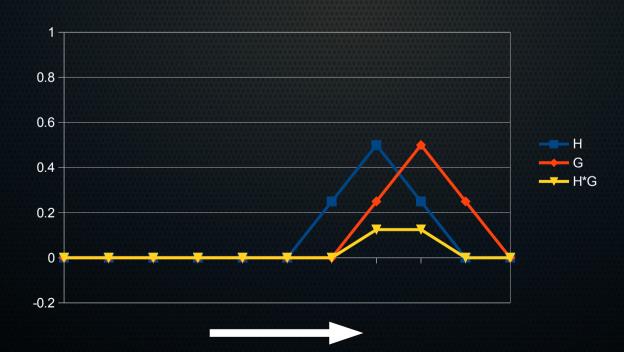
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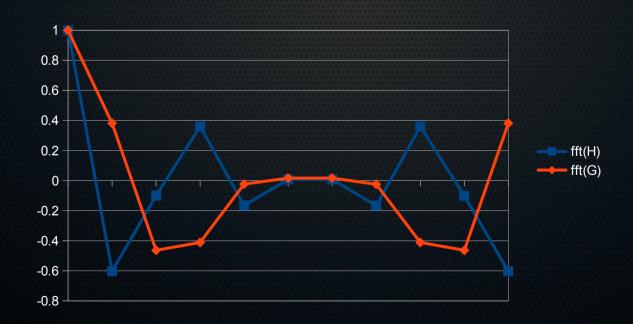
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- Cross-Correlation (Fourier-Space)
  - Compute similarity between 2 time-series
    - Also yields time-delay/phase-shift
  - O(n log n) efficiency when using FFT



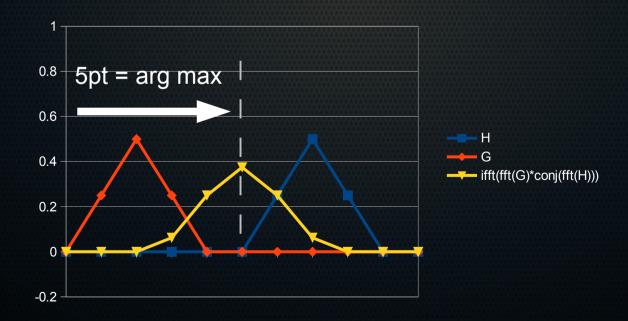
- Correlation Theorem:
  - Corr(G,H) <==> FFT(G) FFT\*(H)
  - Both G & H must be of length n



- Correlation Theorem:
  - Sliding dot-product of FFT(G) and complex Conj(FFT(H))
  - $F = FFT(G) \cdot FFT*(H)$



- Correlation Theorem:
  - Correlation = max (FFT(G) FFT\*(H) )
  - Shift = arg max (FFT(G) FFT\*(H) )



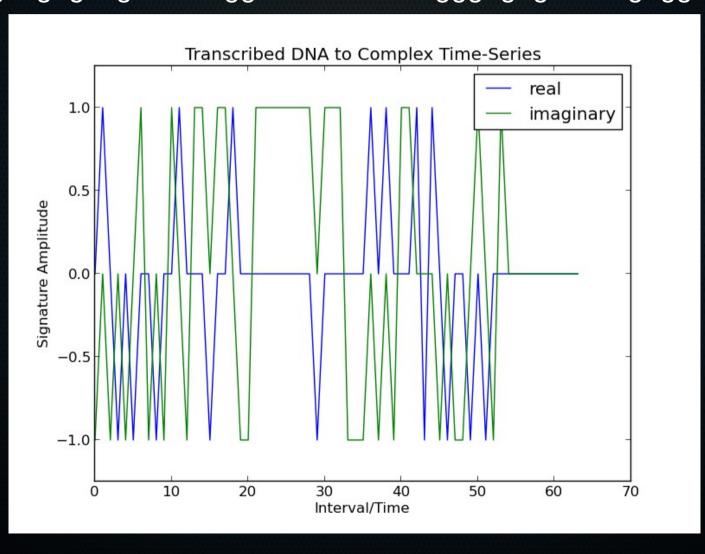
#### Time-Series vs DNA/RNA

- Transcription to numeric time-series
  - How do we translate to numeric values?

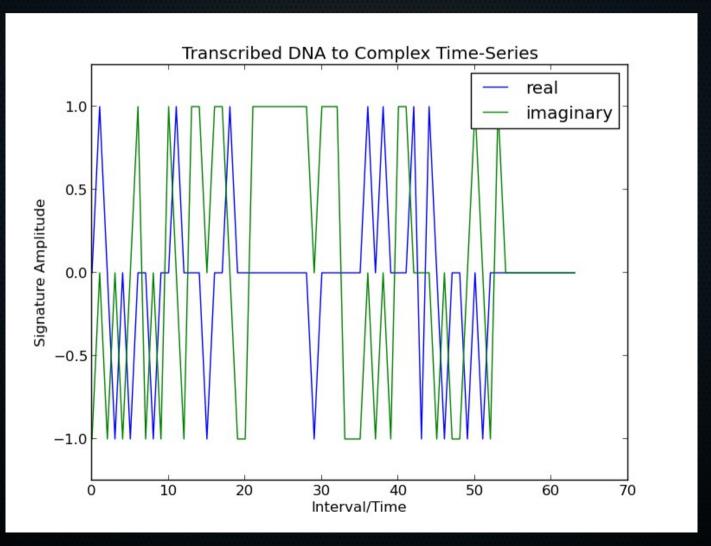
Nucleotide	Transcription
А	1
U/T	-1
С	i
G	-i

- Ex: AACGTGT => [1, 1, -i, i, -1, i, -1]

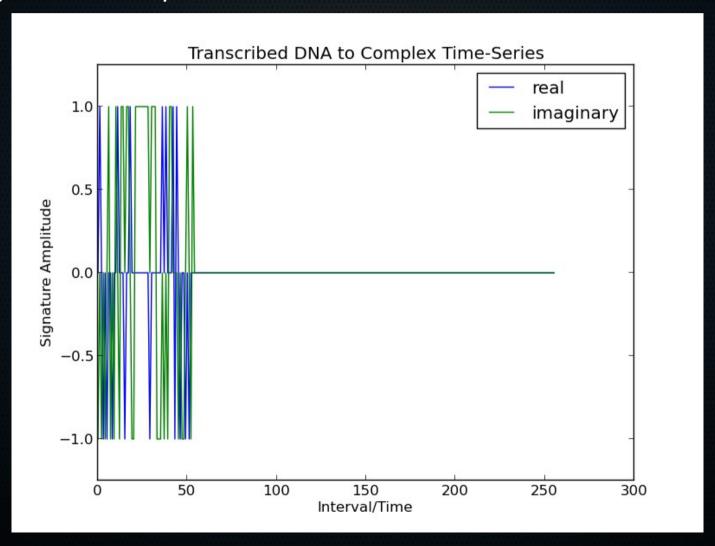
gagugucgugcagccuccaggccccccccucccgggagagccauaguggucugc



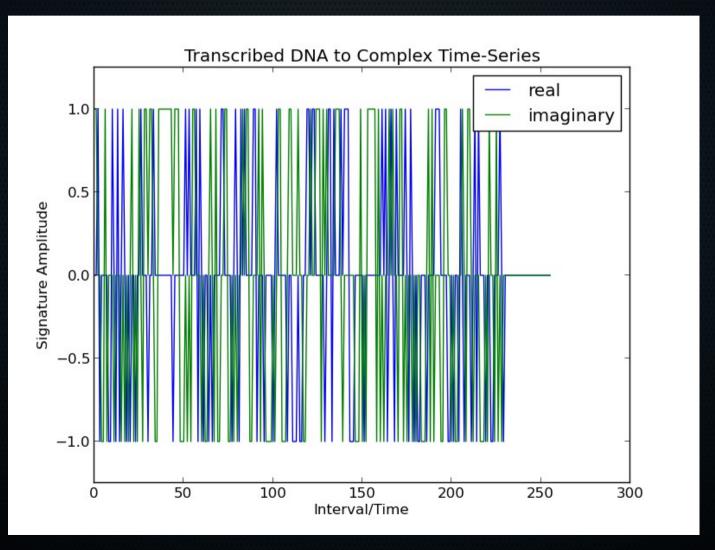
• len(G) = 54



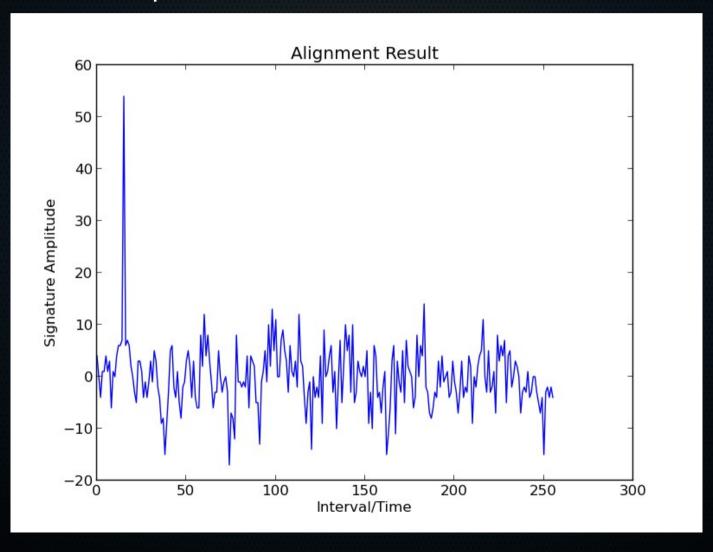
len(G) = 54, must pad to size of H with zeros



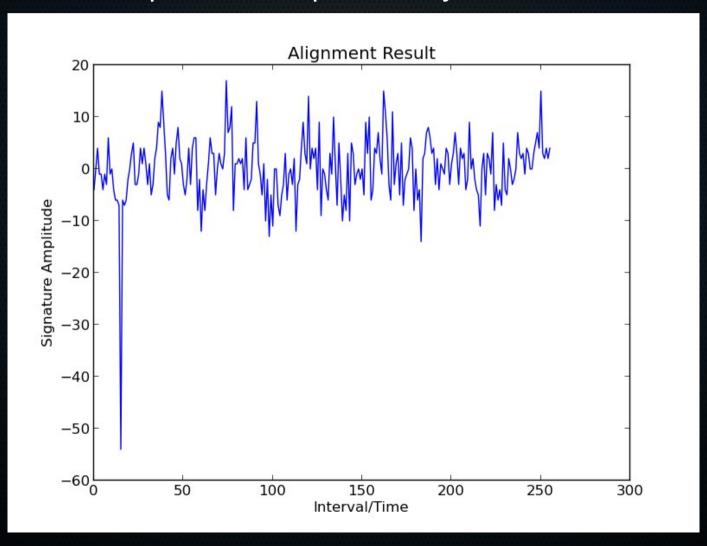
len(H)



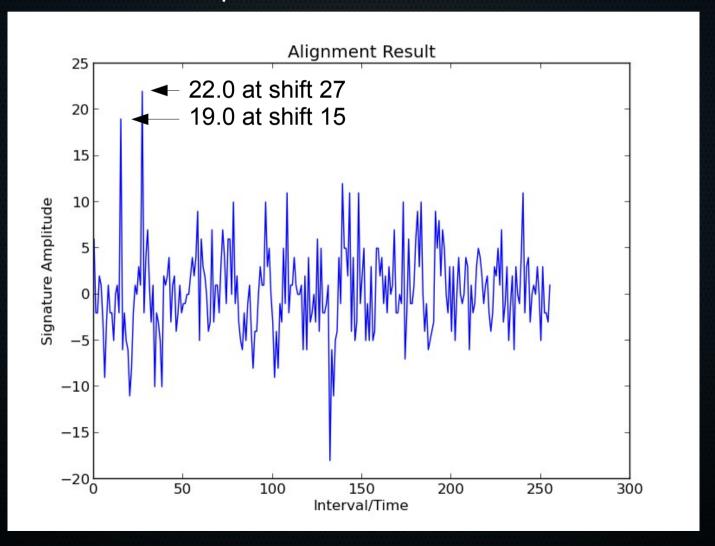
Alignment result, perfect match



• Alignment result, perfect "complementary" match



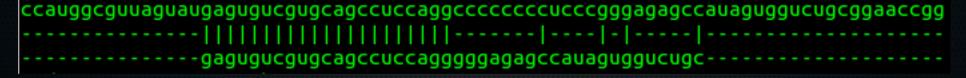
Non-exact matches, "Split Peaks"



Non-exact matches, "Split Peaks"

#### 22.0 at shift 27:

#### 19.0 at shift 15



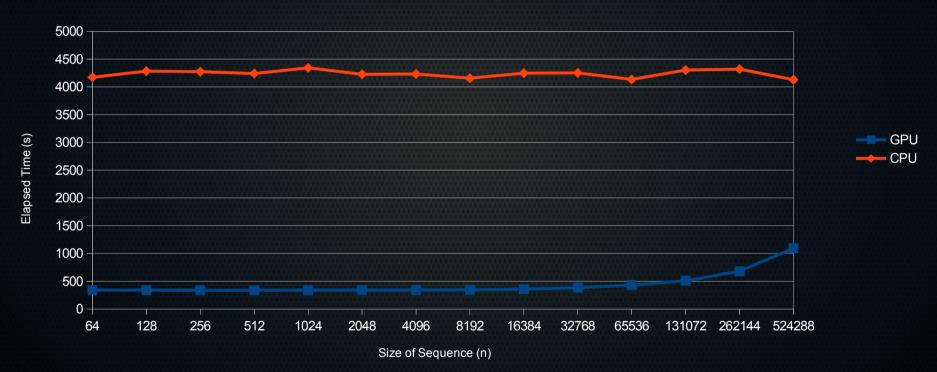
#### Why use GPUs?

- Parallelism. Parallelism. Parallelism.
- FFT can be parallelized well
- Cross-Correlations are large sets of fully independent calculations.
- When you have 2496 cores... many things look better parallel.
- Test system:
  - Dual Quad Xeon(2.3Ghz), 30GB DDR3 1333
  - Tesla K20c 5GB GDDR5, 2496 cores @ 706MHz

# Alignment Performance

#### GPU vs CPU performance

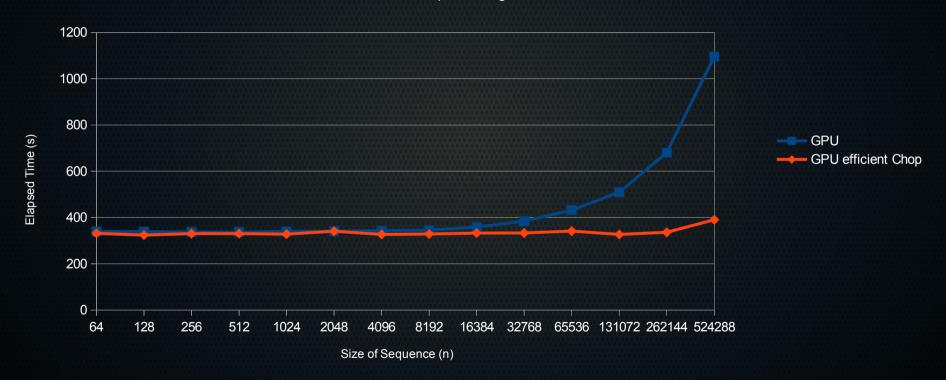
1000 sequence alignmnets of size n



# Alignment Performance

#### GPU vs CPU performance

1000 sequence alignmnets of size n



#### Possible improvements

- Use GPU "streams" to line up work
- Implement CPU code in C/C++
- Also return Complementary matches
- Implement more post processing
  - Combine partial matches

#### Thanks

Questions?

• Github: https://github.com/madmaze/gpuFFTMSA