Kernel-Based Multi-channel PolyCovNet

Al Hackathon Challenge I

Team Borides

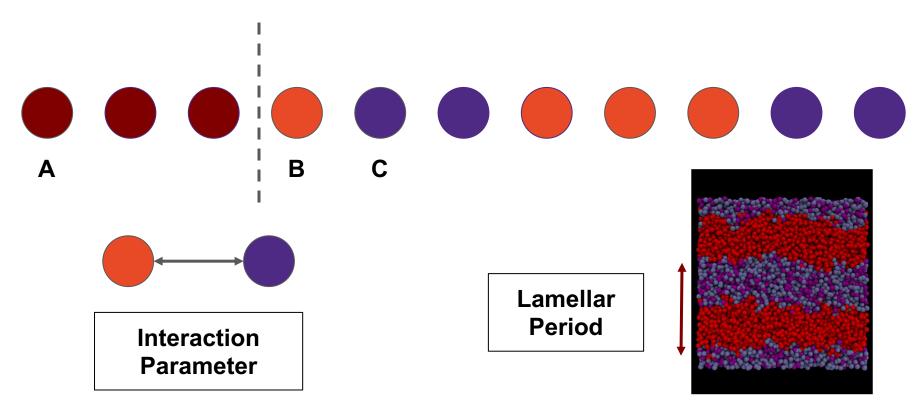
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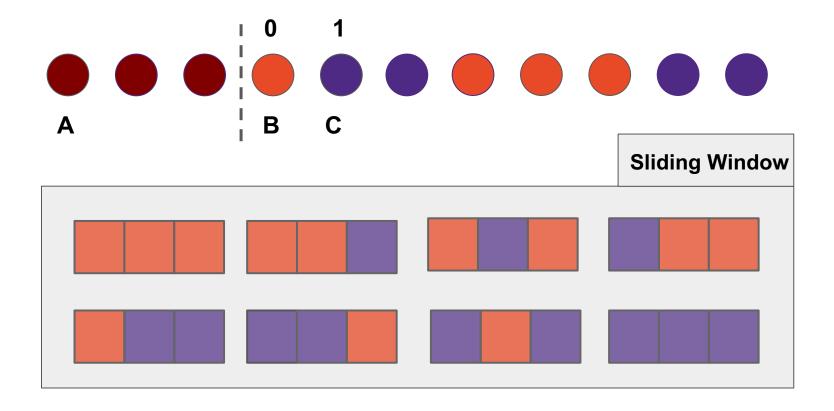
Problem Restatement

Predicting lamellar period using monomer sequence and interaction parameters

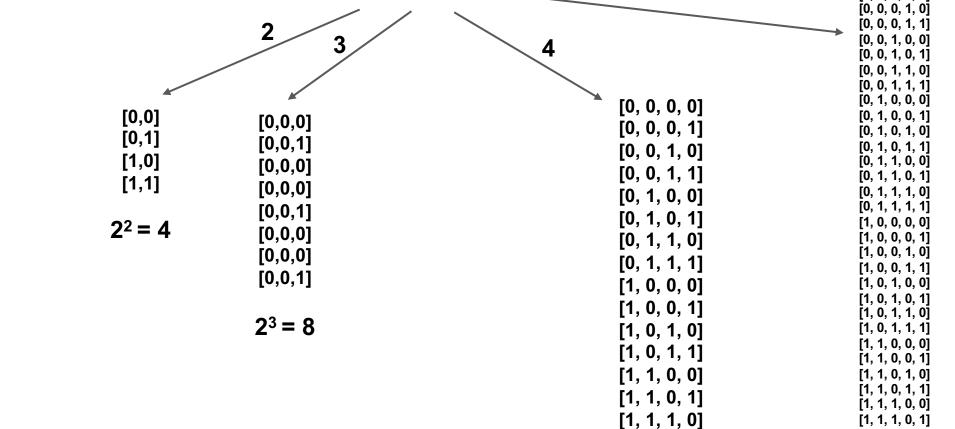


Feature Engineering

Sliding window - extract monomer sequence features



Sliding Window window size 5 Feature Engineering [0, 0, 0, 0, 0] [0, 0, 0, 0, 1] [0, 0, 0, 1, 0] [0, 0, 0, 1, 1]



 $2^4 = 16$

[1, 1, 1, 1]

[1, 1, 1, 1, 0]

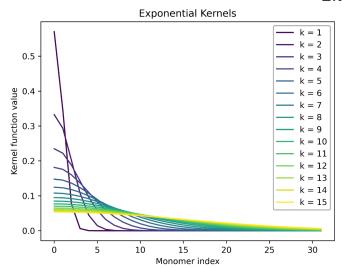
[1, 1, 1, 1, 1] 3

 $2^5 = 32$

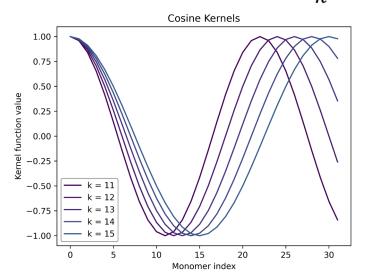
Feature Engineering

Non-linear kernel functions - preprocess monomer sequences

1. Exponential kernels $\exp(\frac{x^2}{2k^2})$



2. Cosine kernels $\cos(\frac{\pi x}{k})$



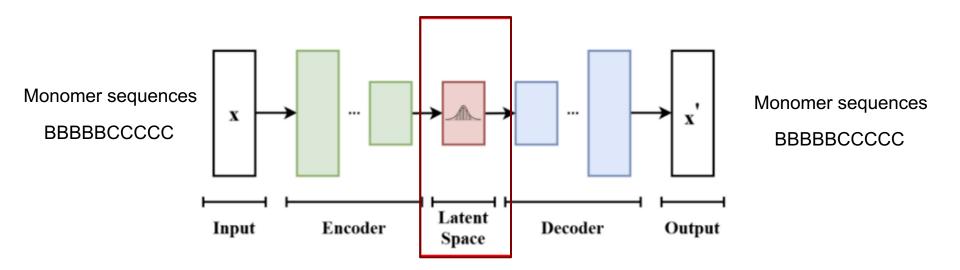
Applying the above kernels on monomer sequences



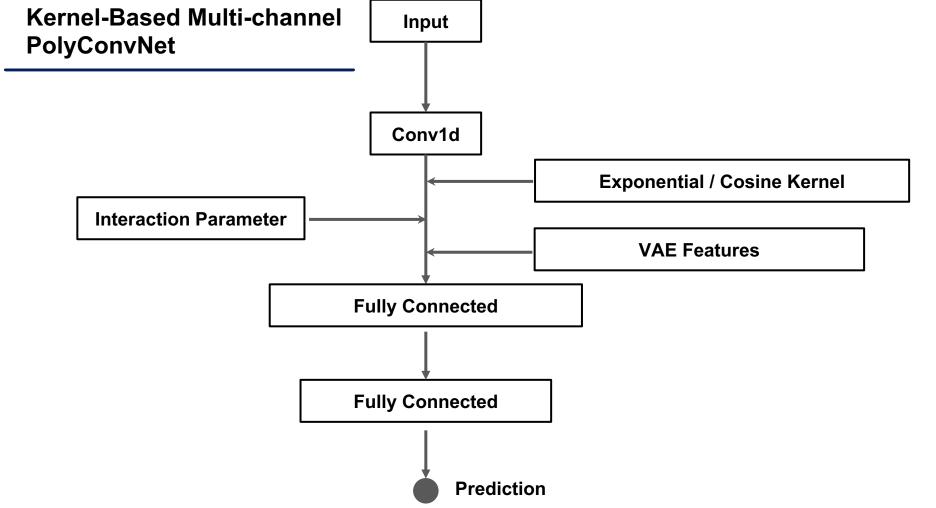
Non-linearity

The Model

Variational autoencoder - extract features from monomer sequences

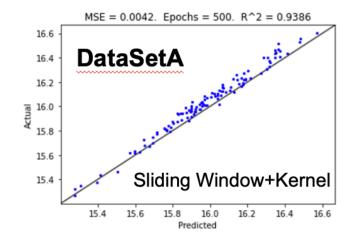


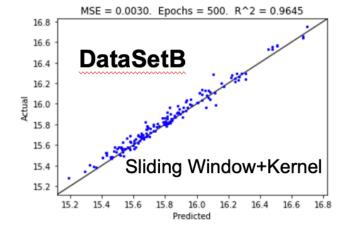
Reduced feature vectors

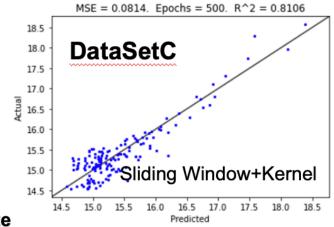


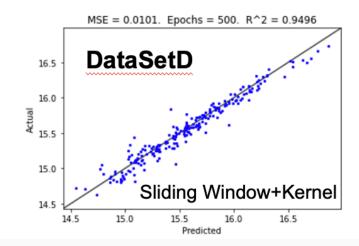
Results





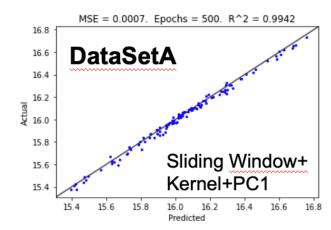


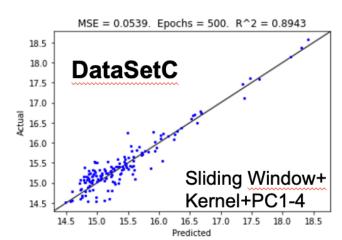




500 epoch 0.01 learning rate

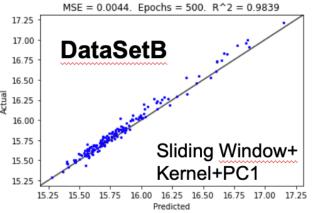


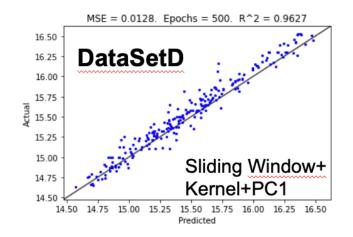




500 epoch 0.01 learning rate

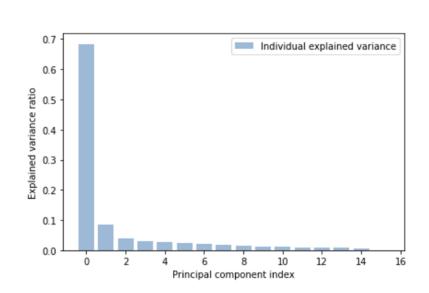
Results



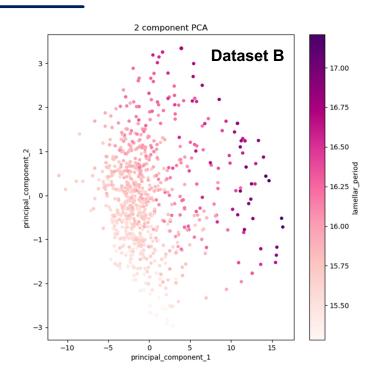


Discussion

Principal component analysis on the latent space



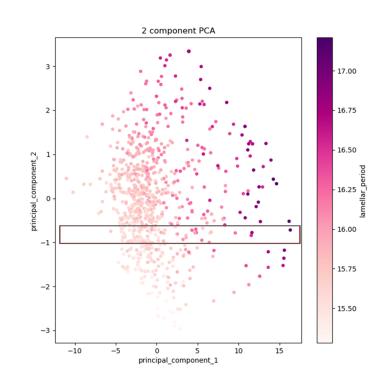
Principal component 1 dominates



Larger principal component 1Larger lamellar period

Discussion

Blockiness is important to result in a high lamellar period



Higher principal component 1

Lower principal component 1

Blockiness

0.875000 0.874510

0.873016

0.870445

0.866667

Blockiness

0.498039

0.740891

0.372549

0.000000

-0.036437

Computational Efficiency (500 epochs)

Feature Generation	Time (min)
2-channel Sliding Window Features	0.5
Exponential / Cosine Kernel Features	0.08
VAE Features	30

Model Training / Validation	Time (min)
Training	1
Validation	0.02

^{*} All runtimes reported using ThetaGPU

Thank you!