

Multi-Input Multi-Output Electric Motor Modeling using Neural Networks

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What we discussed in the last meeting?

1. Problem definition
2. Neural networks introduction
3. Early results on public dataset
4. Error in predicting impulse peaks
5. Prediction scaling problem

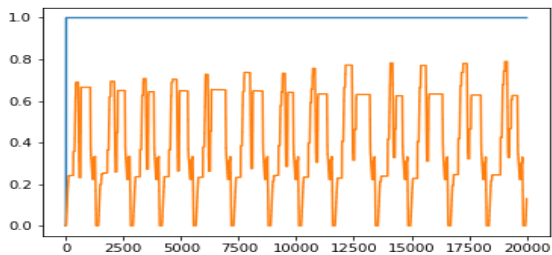
Dataset

Description

1. Single experiment
2. 1200 seconds long
3. Simulink dq-frame model is used

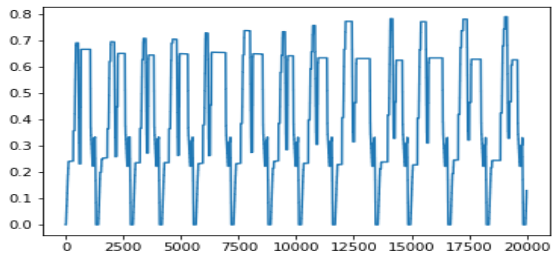
Dataset

Voltages



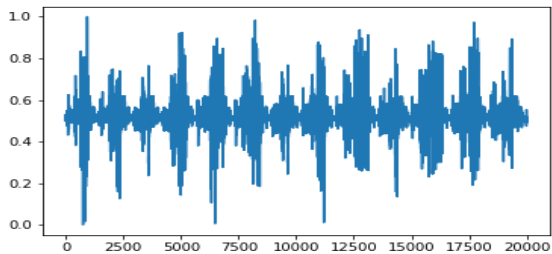
Dataset

Stator Pulse



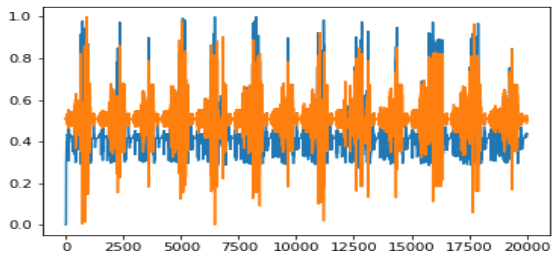
Dataset

Speed



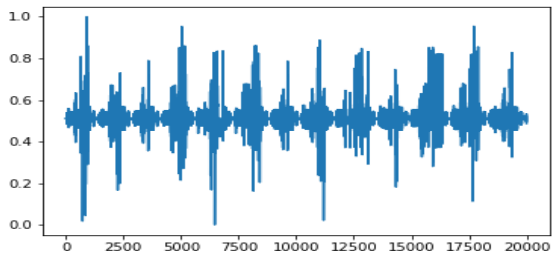
Dataset

Currents



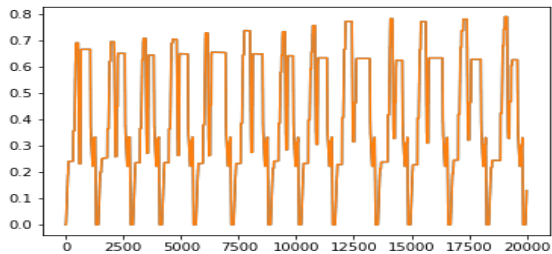
Dataset

Torque



Dataset

Voltage2 and Stator Pulse



Dataset

Train-Test Split

1. Single experiment
2. Biased if the split is 0-800s and 800-1200s
3. Random sampling
 - 3.1 Take window w with stride s
 - 3.2 Randomly sample windows
 - 3.3 Train-test cover whole data
 - 3.4 No overlapping b/w train-test

Experiments

Input selection

1. Use simulating for downsampling
2. Stride $s = 1, 5, 10$; Works best at stride 1
3. Windows sizes that matter, $5 \leq w < 10$ and $10 \leq w \leq 100$
4. Ignore voltage 1
5. Use either voltage 2 or stator pulse

Experiments

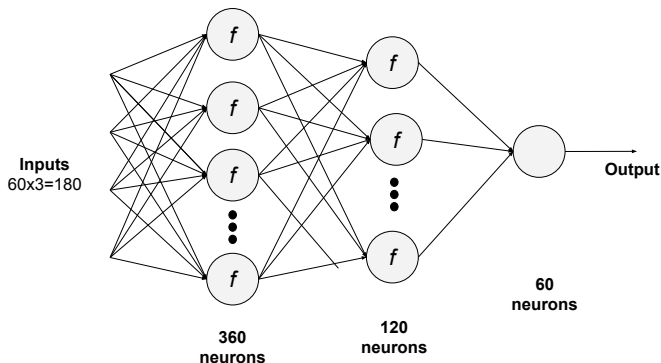
Output selection

1. Don't predict all time steps
2. Predict first, middle or last time step
3. Middle works better

Experiments

ANN for signal prediction

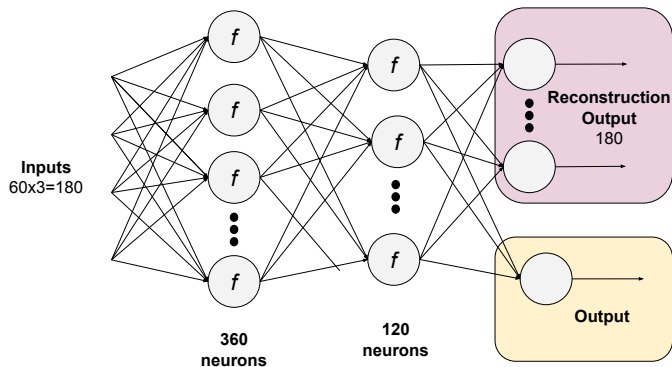
1. Three outputs, three networks.
2. Input: $w \times 3$ 1-D vector, Output: 1 middle value
3. Activation, f : Leaky Relu



Experiments

ANN with auxiliary task

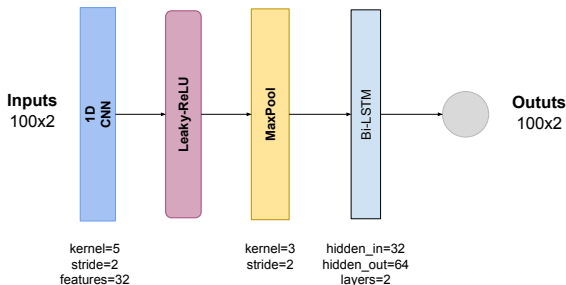
1. Also reconstruct input signal.
2. Three outputs, three networks.
3. Input: $w \times 3$ 2-D vector, Output1: 1, output2: $w \times 3$ 2-D vector
4. Activation, f : Leaky Relu



Experiments

Convolution network

1. CNN and ANN works better then RNN (Miller et al. 2018).
2. Kernels capture $w \leq 10$
3. Channel featurization, correlate voltage2 and speed
4. Three outputs, three networks.
5. Input: $w \times 3$ 2-D vector, Output: 1
6. Activation, f : Leaky Relu (in conv)



Results

Best Model

| Model | w | Current1 | Current2 | Torque |
|----------------|-----|--------------|--------------|--------------|
| ANN | 100 | 0.223 | 0.197 | 0.101 |
| ANN Aux | 100 | 0.192 | 0.182 | 0.112 |
| CNN | 100 | 0.107 | 0.104 | 0.091 |

Table: MSE of different models.

Results

Example Outputs

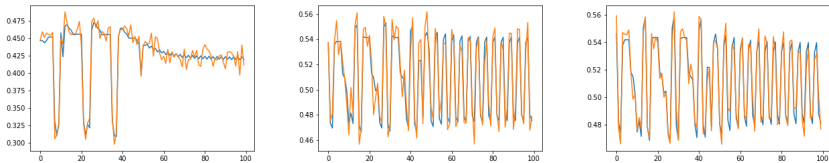


Figure: Left to right: current1, current2, and torque, orange color: predicted

Questions

1. Is data very simple?
2. When voltage 1 is not constant?
3. When Voltage 2 and stator pulse are not same?
4. Can signals be grouped into some classes?
5. Visual evaluations?
6. Other evaluation metrics?
7. Predict future(causal)?

Thank you!