

# PopH

## Music generation via NN

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# Introduction

- Listening to music is one of important part of our life
- Music is a simplest way to relax
- Music industry is one of the biggest market place it the world
- Musical composition are required in many different areas: cinema, games, ets.

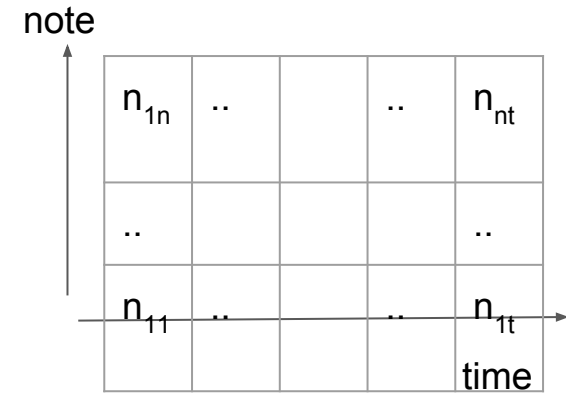
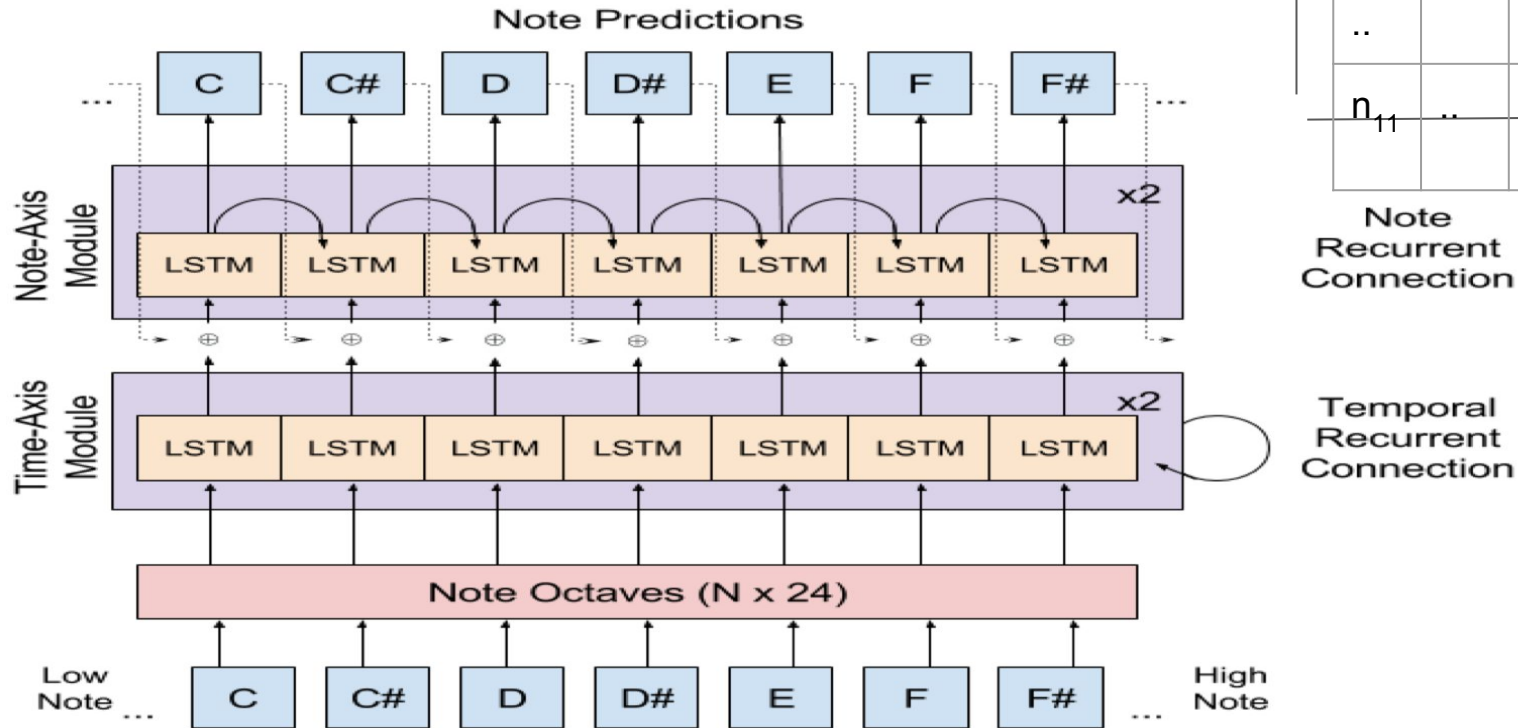
## Related works

- For the basic algorithm to implement we decided to take the one from the recent papers: DeepJ: Style-Specific Music Generation (2018), Generating Polyphonic Music Using Tied Parallel Networks (2016).
- After implementation we used self-attention mechanism as described in article: Attention Is All You Need

# Dataset description

- We used open source dataset: The Lakh MIDI Dataset
- Transformed structure of midi file to use in model is:
  - Play matrix
  - Replay matrix
  - Volume matrix

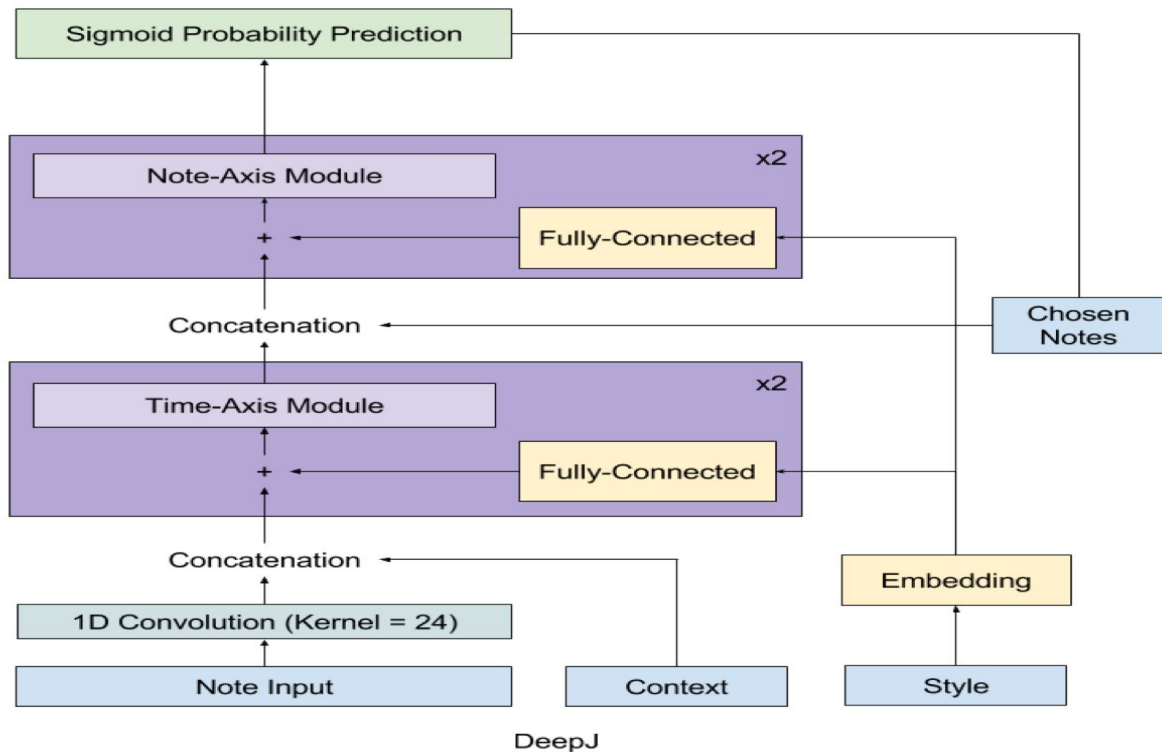
# ML methods: Biaxial LSTM Architecture



Note  
Recurrent  
Connection

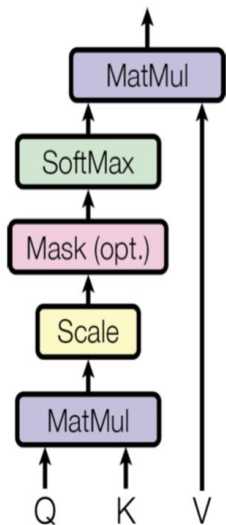
Temporal  
Recurrent  
Connection

# ML methods: DeepJ Architecture

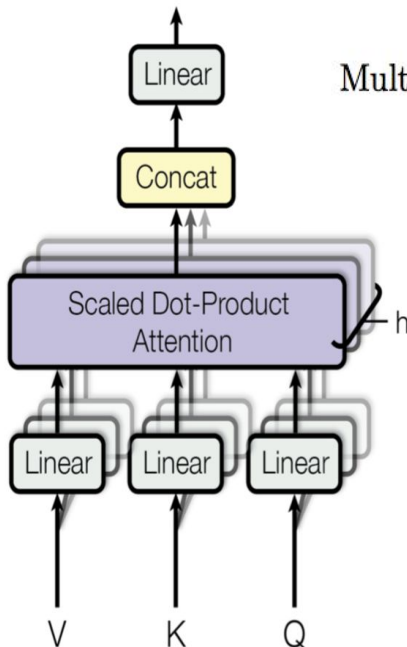


# ML methods: Attention

Scaled Dot-Product Attention



Multi-Head Attention



$$\text{MultiHead}(Q, K, V) = \text{Concat}(\text{head}_1, \dots, \text{head}_h)W^O$$

where  $\text{head}_i = \text{Attention}(QW_i^Q, KW_i^K, VW_i^V)$

Self Attention Mechanism: When  $Q=K=V$

# ML methods: Our architecture

Output:  $t_{\text{play}}$ ,  $t_r$ ,  $t_{\text{dynamics}}$

Note-Axis LSTM Module

Time-Axis LSTM Module

Self Attention Module

Note octaves  
(convolution 1d)

Input:  $t_{\text{play}}$ ,  $t_r$ ,  $t_{\text{dynamics}}$





## Experiments: DeepJ Losses

$$L_{play} = \sum t_{play} \log(y_{play}) + (1 - t_{play}) \log(1 - y_{play})$$

$$L_r = \sum t_{play} (t_r \log(y_r) + (1 - t_r) \log(1 - y_r))$$

$$L_{dynamics} = \sum t_{play} (t_{dynamics} - y_{dynamics})^2$$

$$L = L_{play} + L_r + L_{dynamic}$$

# Experiments: our losses

$$L = L_{play} + L_r + L_{dynamic} + L_{harm}$$

$$L_{harm} = \min \left[ A_{disharm} \text{SoftMax} \left( \tilde{y}_{play} \right) \right]$$

$$\tilde{y}_{play} = y_{play}[:12] + y_{play}[12:24] + y_{play}[24:36] + y_{play}[36:48]$$

$$A_{disharm} = \begin{pmatrix} C_{maj} \\ C_{min} \end{pmatrix}$$

$$c_{maj} = \begin{pmatrix} 0 & 1 & 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 & 1 & 0 \end{pmatrix}$$

$$c_{min} = \begin{pmatrix} 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 & 0 & 1 & 0 & 1 \end{pmatrix}$$



## Equipment:

3 GPU NVIDIA Tesla K80  
(Microsoft Azure)

**PopH Group**

**Thank you for your  
attention**

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