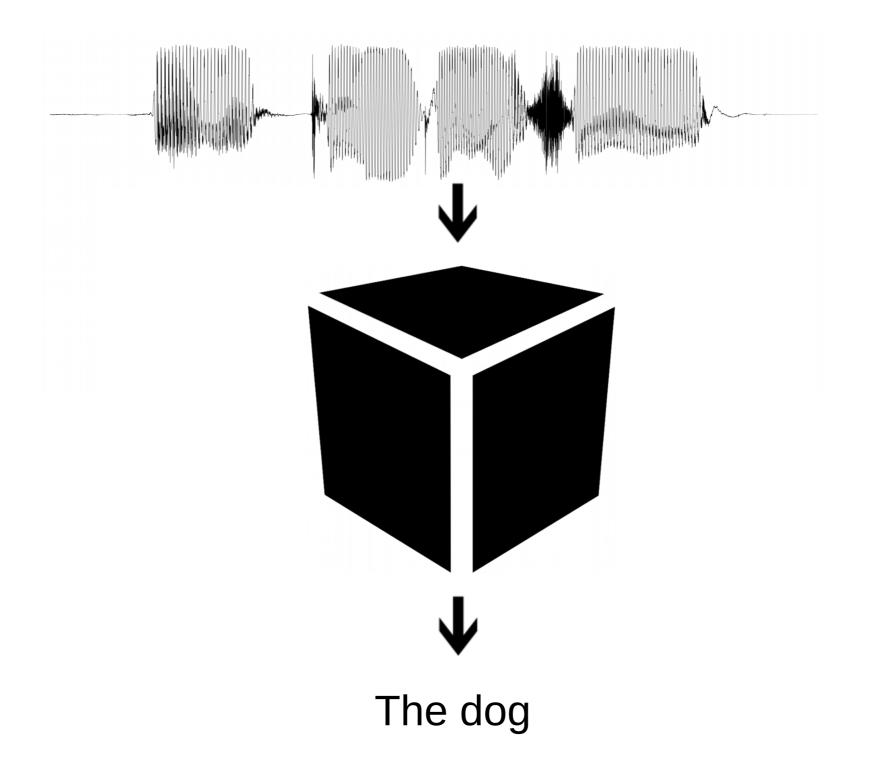
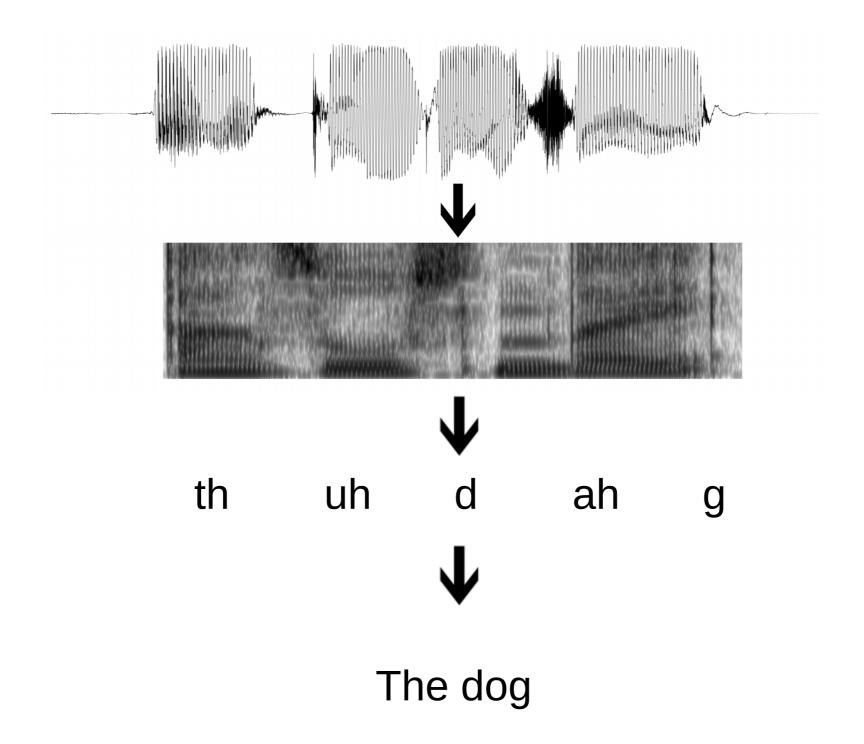
# Automatic Speech Recognition:

Gaussians and Neural Nets and Markov Models... Oh my!

@joshmeyerphd





**GMM MONOPHONE TRAINING** 

**GMM TRIPHONE TRAINING** 

**DNN TRAINING** 

**DECODING** 

- Sliding window feature extraction

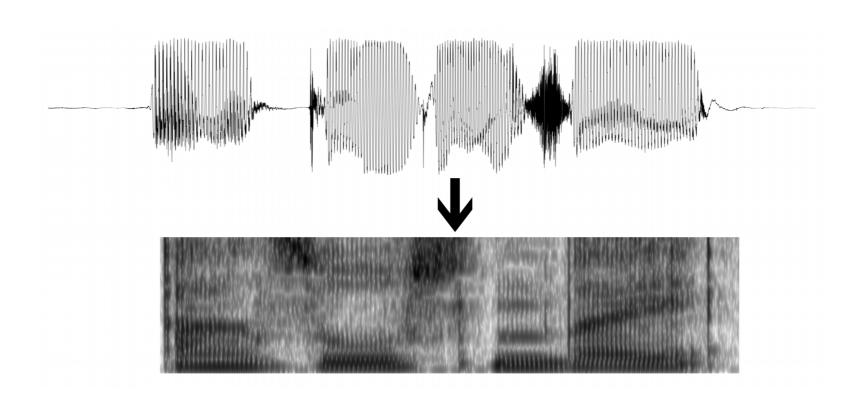
**GMM MONOPHONE TRAINING** 

**GMM TRIPHONE TRAINING** 

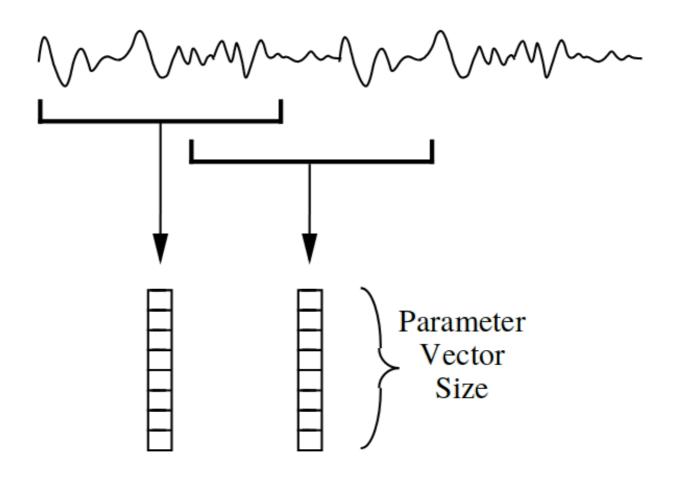
**DNN TRAINING** 

**DECODING** 

- Sliding window feature extraction



- Sliding window feature extraction



- Sliding window feature extraction

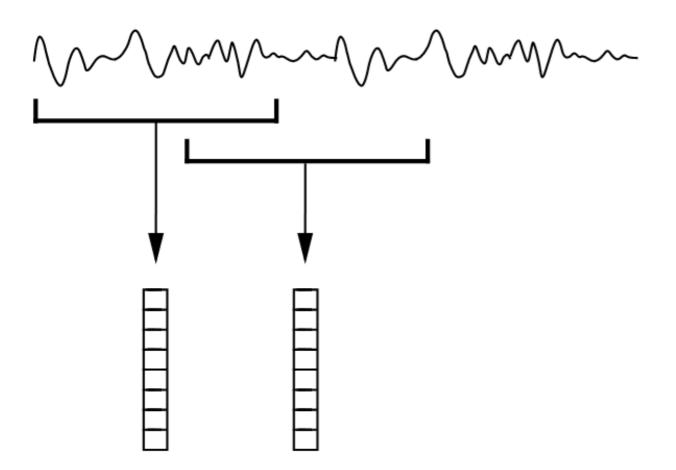
#### **GMM MONOPHONE TRAINING**

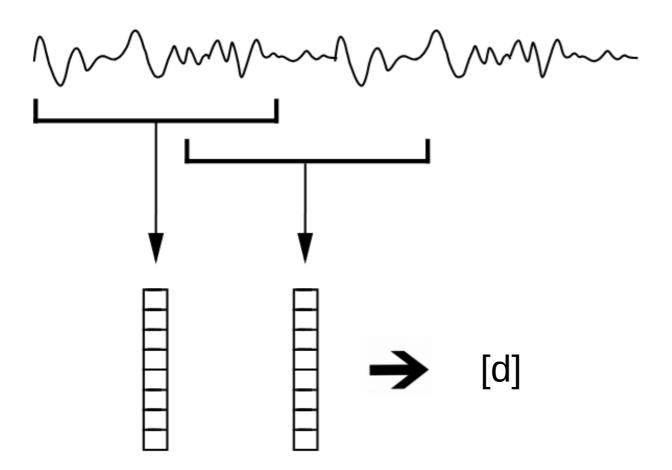
- Flat-start
- Baum-Welch re-estimation

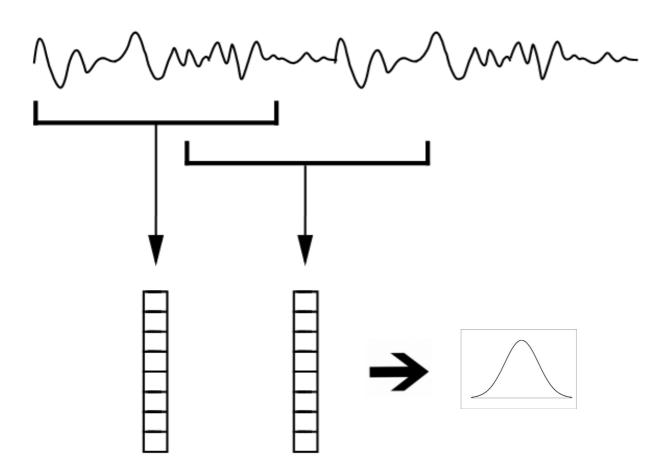
#### **GMM TRIPHONE TRAINING**

#### **DNN TRAINING**

#### **DECODING**







[t] ==

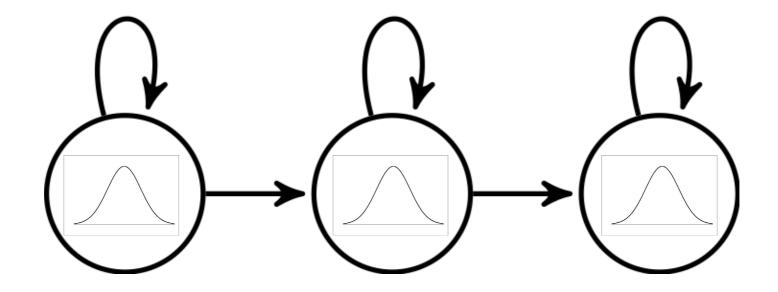
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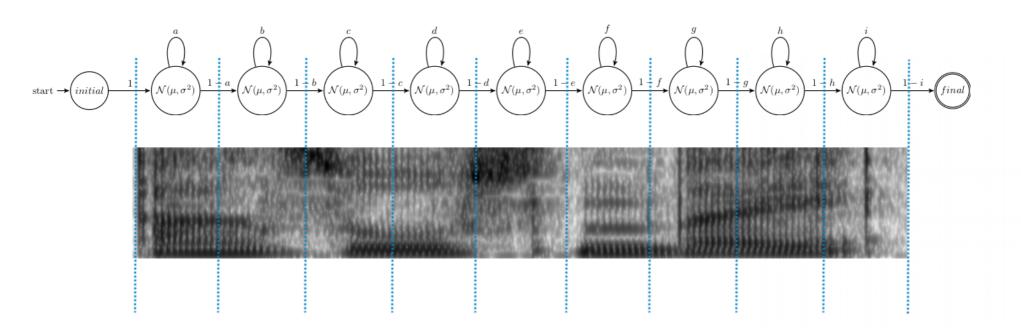
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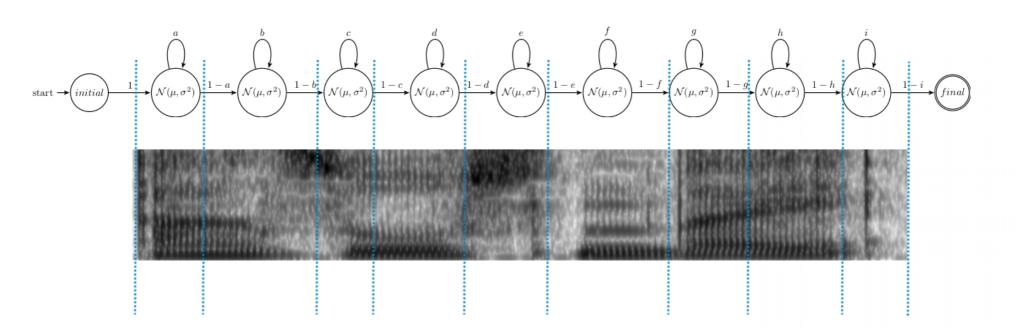
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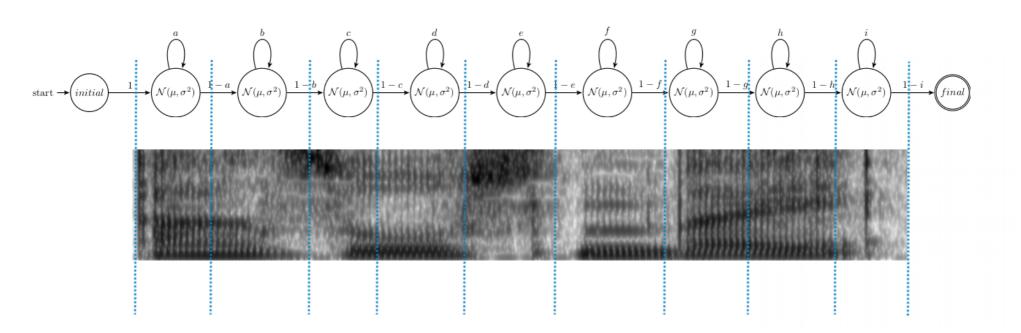
- Flat-start



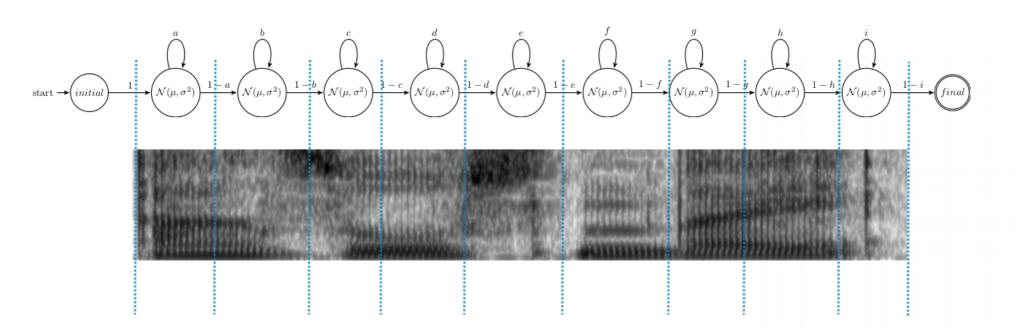
- Flat-start
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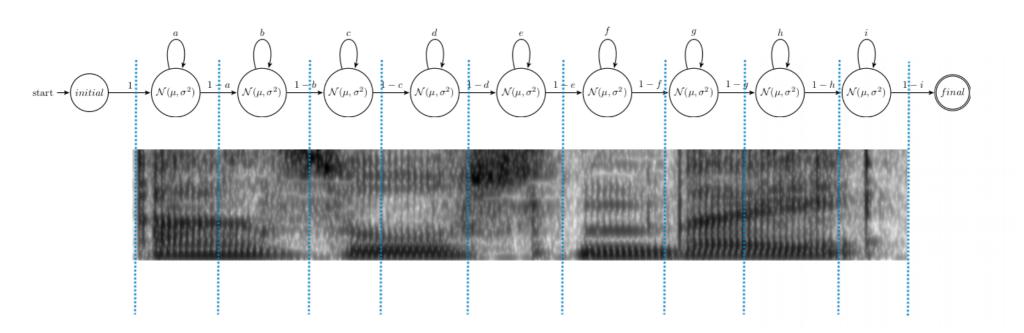
- Flat-start
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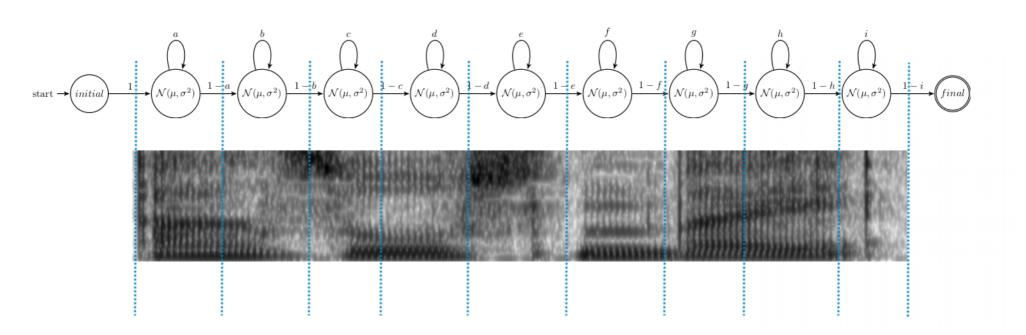
- Flat-start
- Baum-Welch Re-estimation



- Flat-start
- Baum-Welch Re-estimation



- Flat-start
- Baum-Welch Re-estimation



- Sliding window feature extraction

## **GMM MONOPHONE TRAINING**

- Flat-start
- Baum-Welch re-estimation

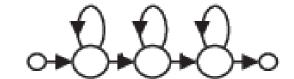
#### **GMM TRIPHONE TRAINING**

- Phonetic decision tree
- Baum-Welch re-estimation

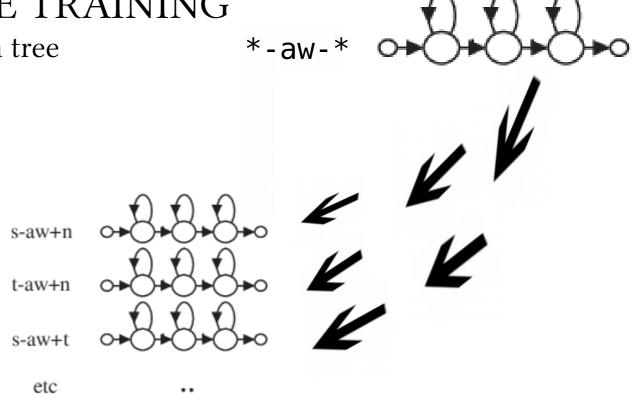
#### **DNN TRAINING**

#### **DECODING**

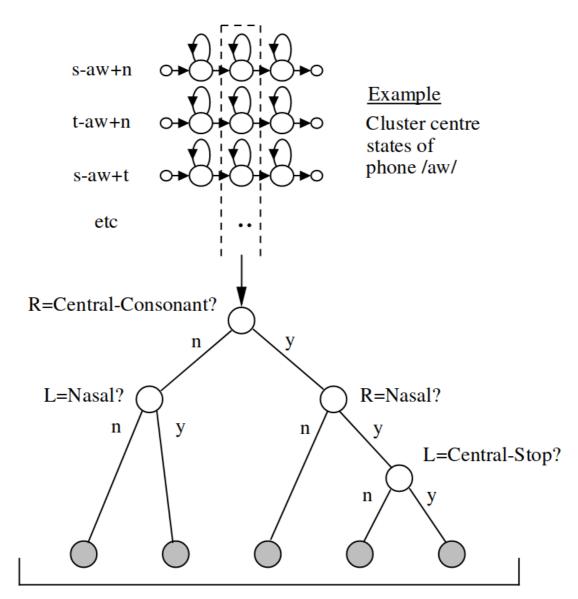
- Phonetic decision tree



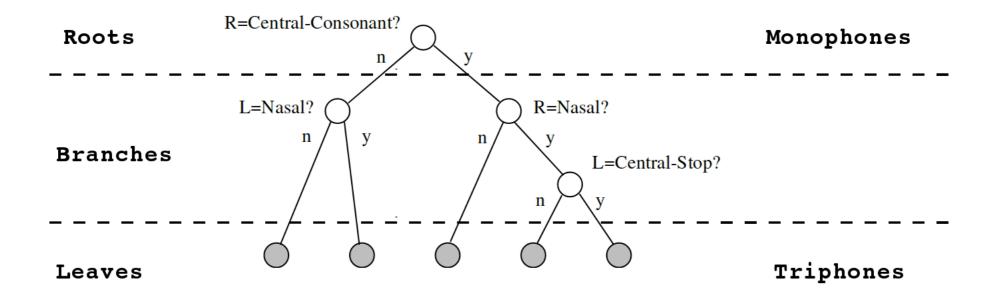
- Phonetic decision tree



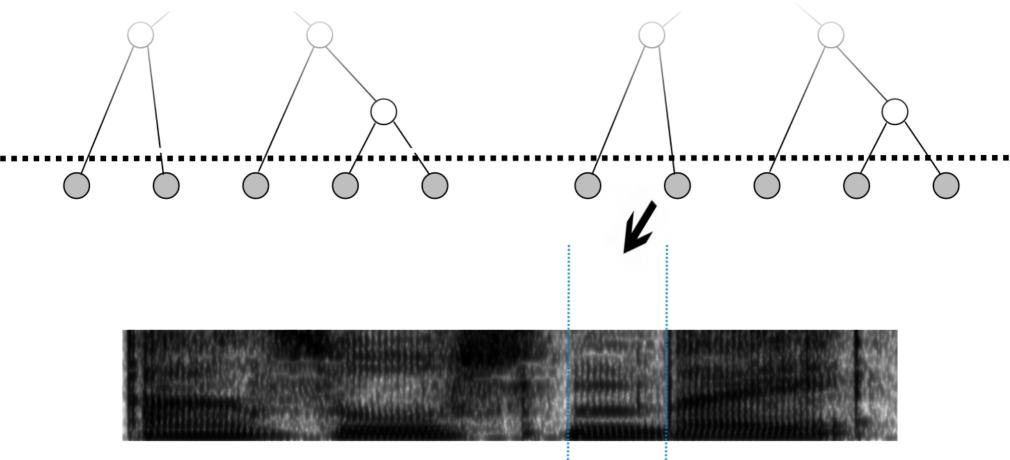
- Phonetic decision tree



- Phonetic decision tree



- Phonetic decision tree
- Baum-Welch re-estimation



- Sliding window feature extraction

#### **GMM MONOPHONE TRAINING**

- Flat-start
- Baum-Welch re-estimation

## **GMM TRIPHONE TRAINING**

- Phonetic decision tree
- Baum-Welch re-estimation

#### **DNN TRAINING**

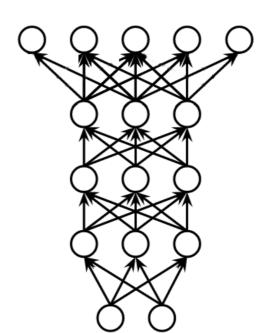
- Labeled Data
- Gradient descent via backprop

#### **DECODING**

# **DNN TRAINING**

- Labeled Data

Phonetic Labels



**Audio Features** 

# **DNN TRAINING**

- Labeled Data

R=Central-Consonant? R=Nasal? L=Nasal? L=Central-Stop?

Phonetic Decision Tree

DNN Acoustic Model

Label Equivalences

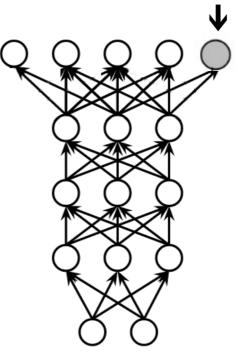
# **DNN TRAINING**

- Labeled Data
- Gradient descent via backprop

[VOWEL\_b\_LIQUID]

Phonetic Labels

Audio Features





- Sliding window feature extraction

#### **GMM MONOPHONE TRAINING**

- Flat-start
- Baum-Welch re-estimation

## **GMM TRIPHONE TRAINING**

- Phonetic decision tree
- Baum-Welch re-estimation

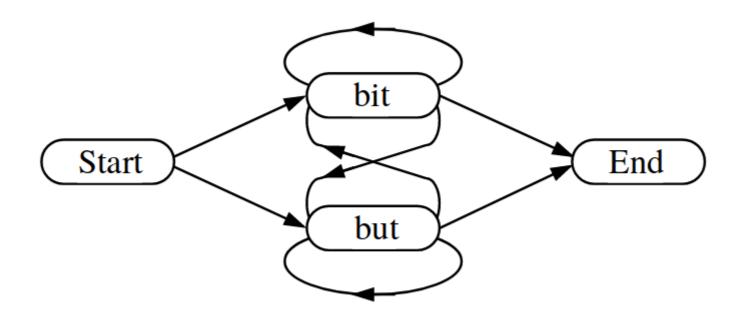
#### **DNN TRAINING**

- Labeled Data
- Gradient descent via backprop

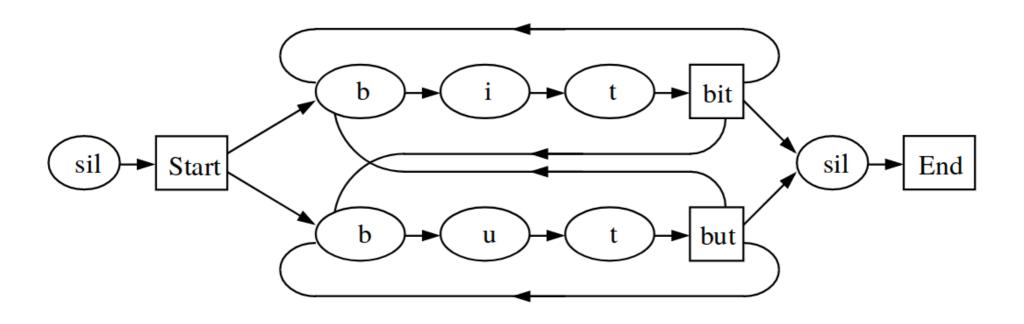
#### **DECODING**

- WFST Graph compilation
- Viterbi decoding

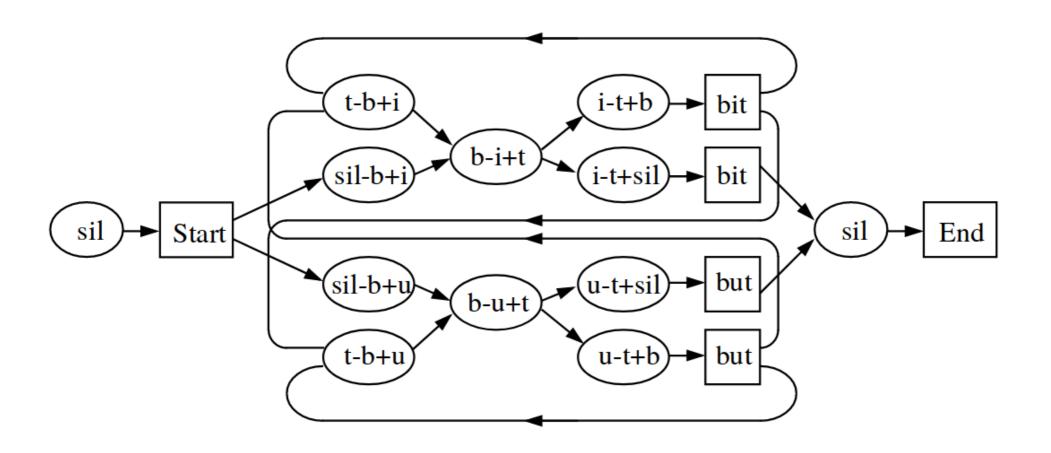
- WFST Graph compilation



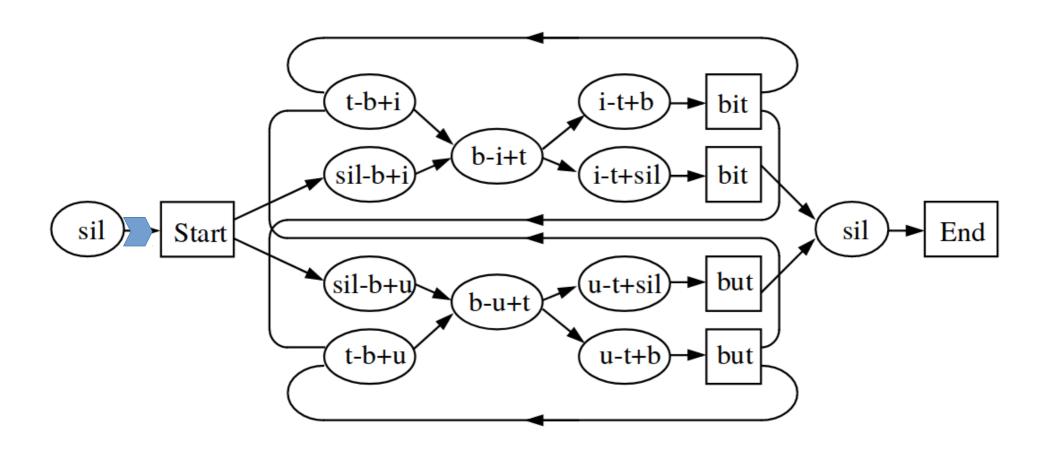
- WFST Graph compilation



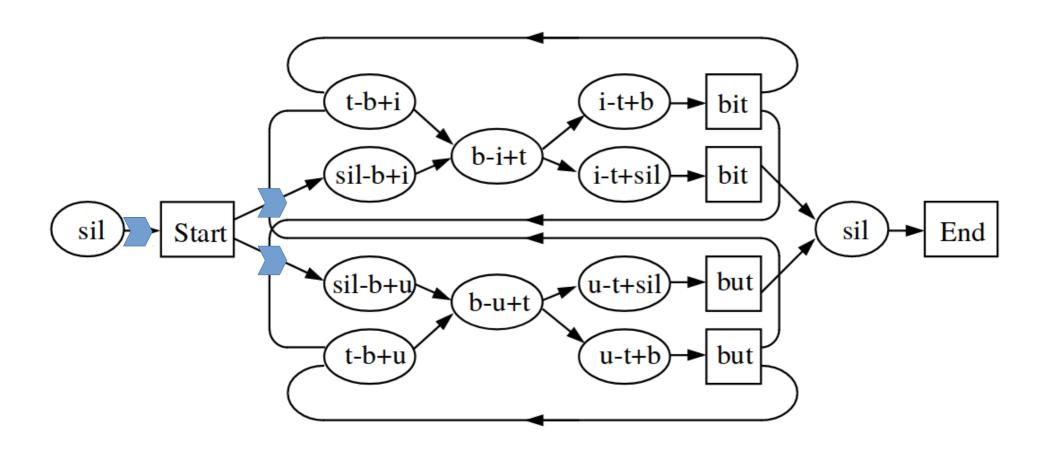
- WFST Graph compilation



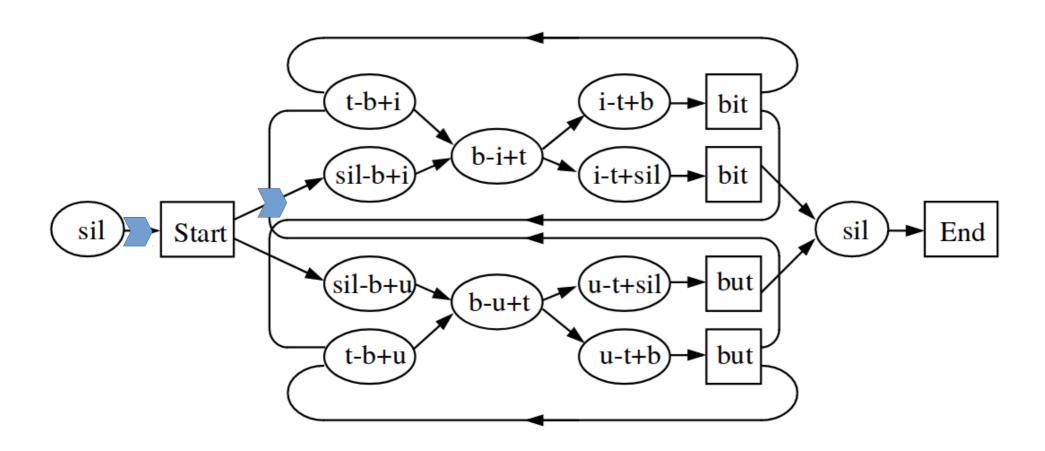
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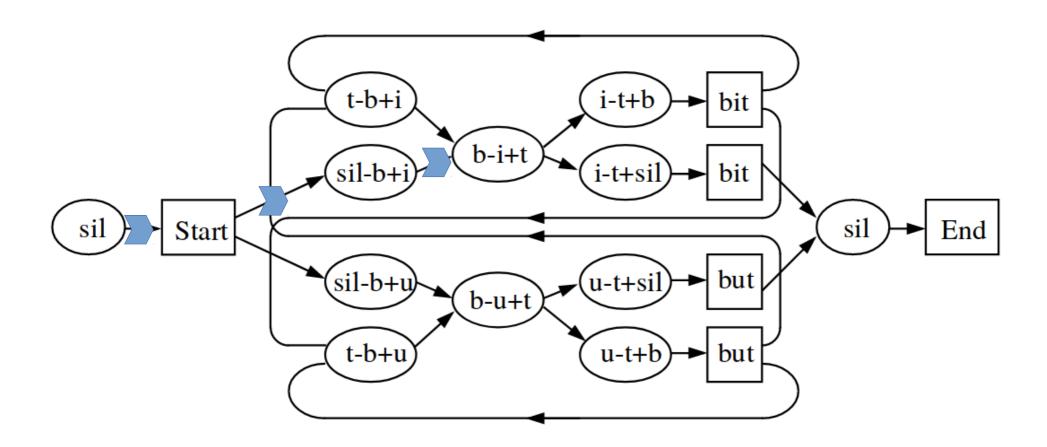
- WFST Graph compilation
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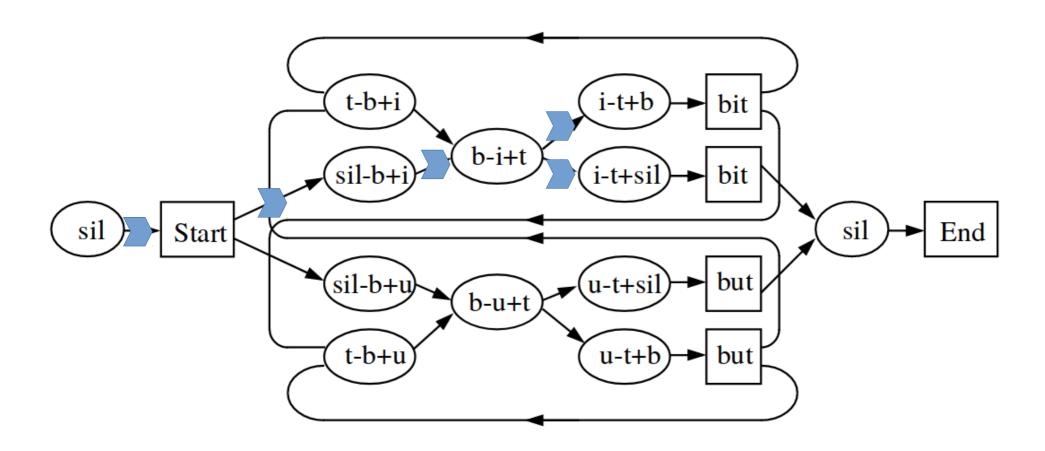
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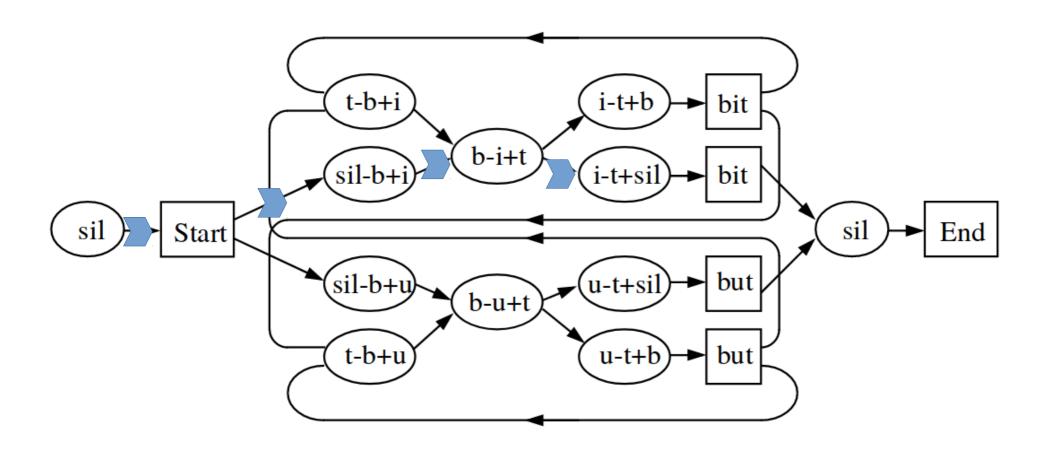
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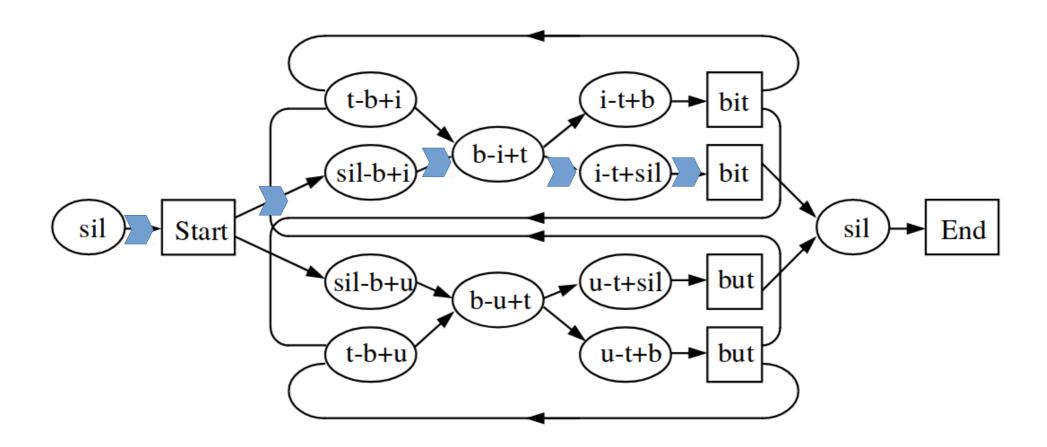
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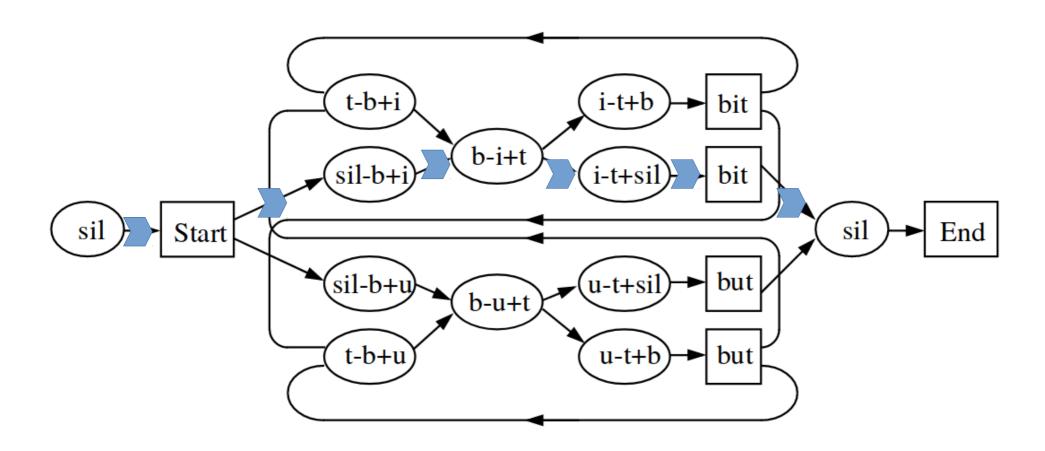
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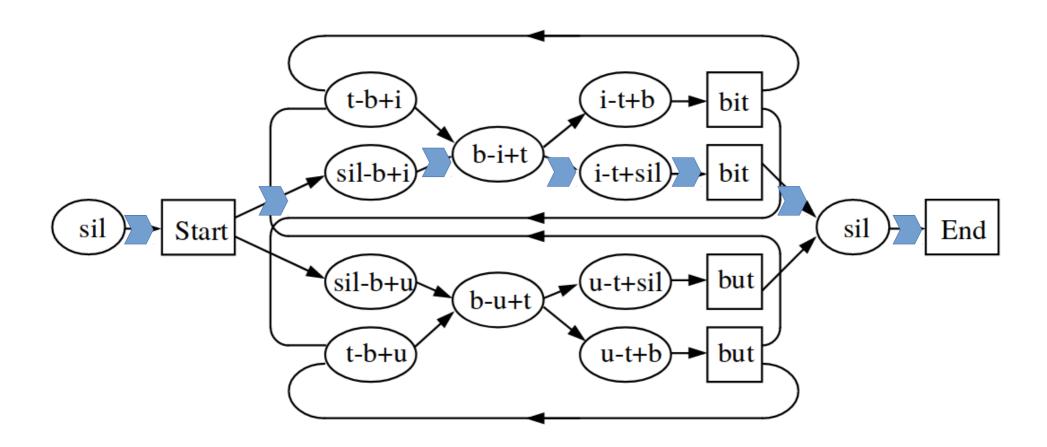
- WFST Graph compilation
- Viterbi decoding



- WFST Graph compilation
- Viterbi decoding



- WFST Graph compilation
- Viterbi decoding



- Sliding window feature extraction

#### **GMM MONOPHONE TRAINING**

- Flat-start
- Baum-Welch re-estimation

## **GMM TRIPHONE TRAINING**

- Phonetic decision tree
- Baum-Welch re-estimation

#### DNN TRAINING

- Labeled Data
- Gradient descent via backprop

#### **DECODING**

- WFST Graph compilation
- Viterbi decoding

# Thanks for your attention:)

@joshmeyerphd

jrmeyer.github.io