#### Recent advances in Speech Generation using Deep Learning Techniques

#### Hamid Mohammadi Advanced Machine Learning Course CSLU OHSU 09/28/2015

# Speech Generation

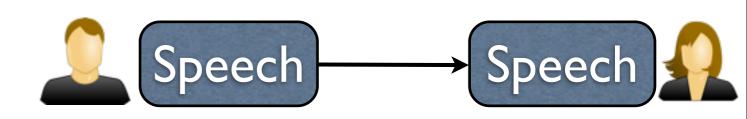
 Speech Generation (SG): Regression tasks in speech processing that are aimed to generate speech signals from various types of inputs.

# Speech Generation

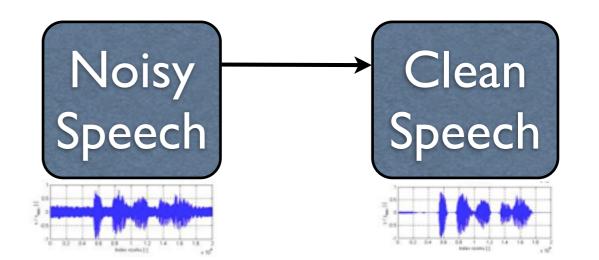
- Some examples of SG:
  - Text-to-Speech Synthesis



Voice Conversion



• Speech Enhancement



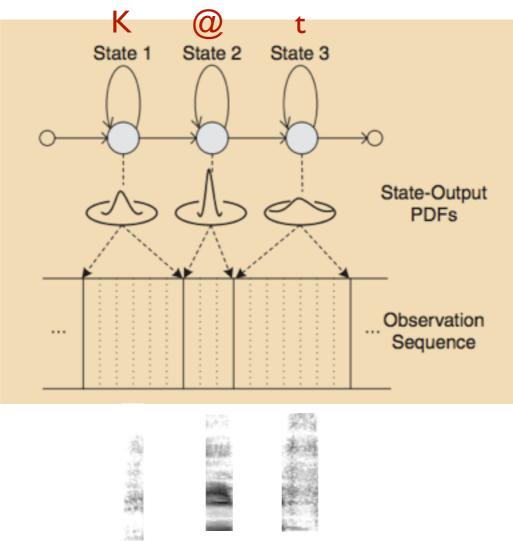
# Speech Generation

- Statistical parametric speech generation (SPSG):
- generates speech wave by combining:
  - statistical acoustic models, and
  - vocoding techniques (e.g. Linear Predictive Coding)



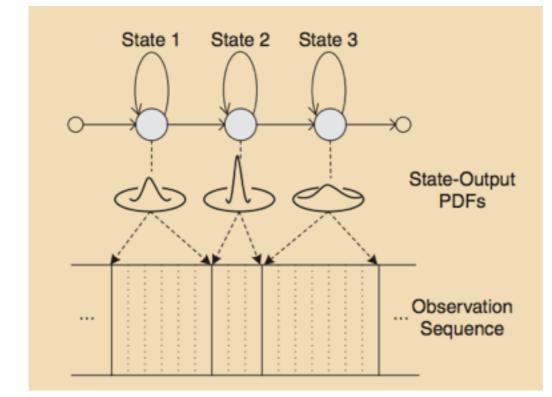
## SPSG

- Models:
  - Hidden Markov Model (HMM)

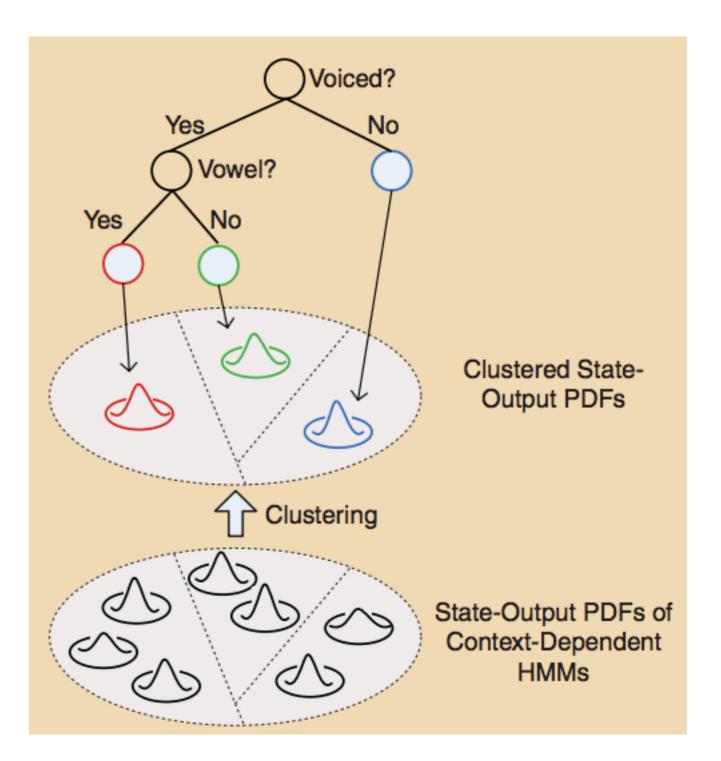


#### HMM





Speech



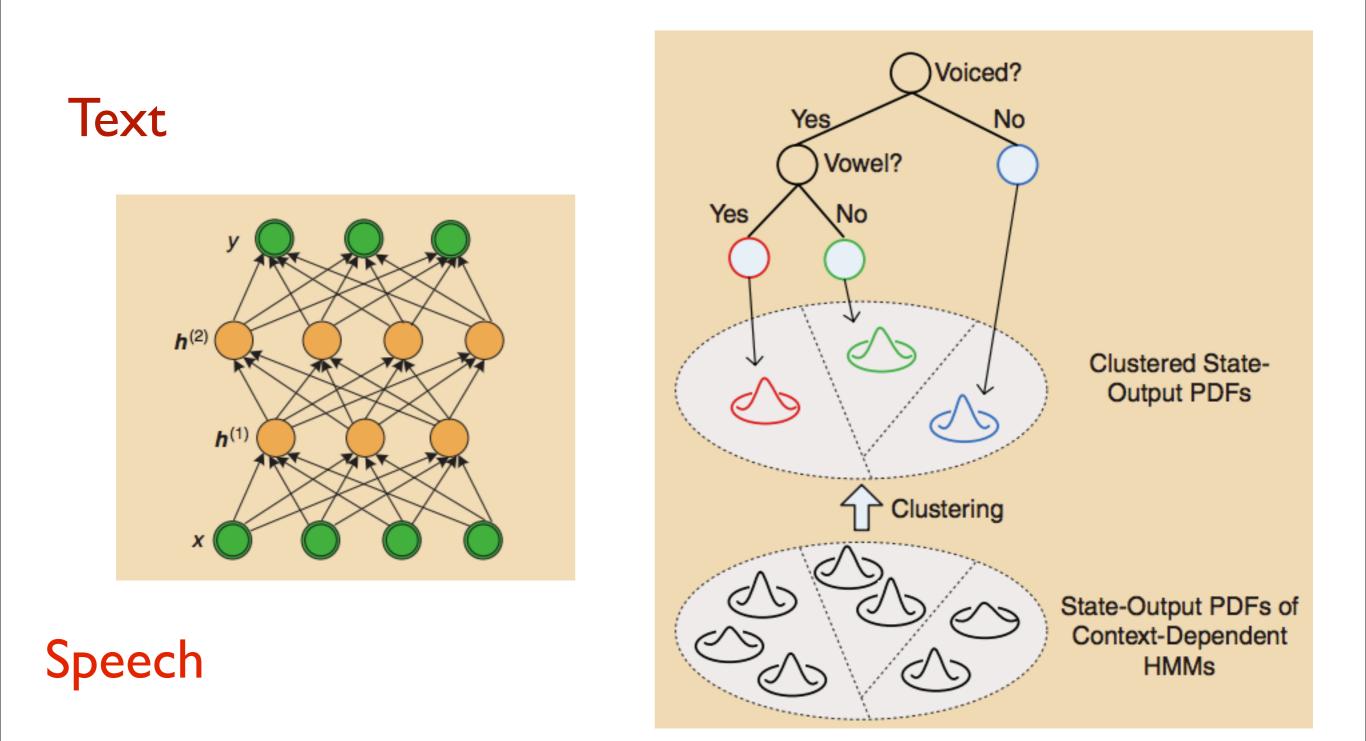
#### Bottleneck Features

- Instead of using a speech parametrization such as LPCs or Mel-Cepstrum,
- Learn Features using Deep architectures such as
  - Denoising Autoencoders, or
  - Restricted Boltzmann Machine (RBMs)
- Use those features in HMM-based TTS

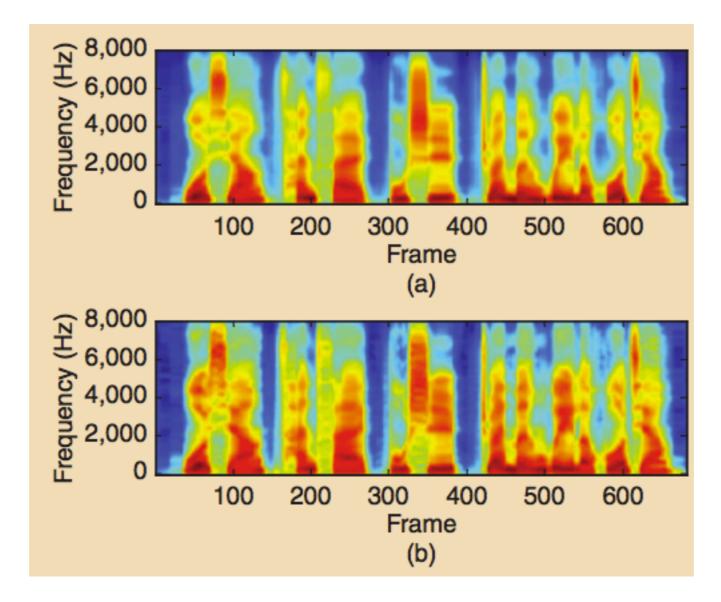
# Deep Learning Networks

- Deep Neural Network (DNN)
- Recurrent Neural Network (RNN)
- Long Short Term Memory (LSTM) architecture

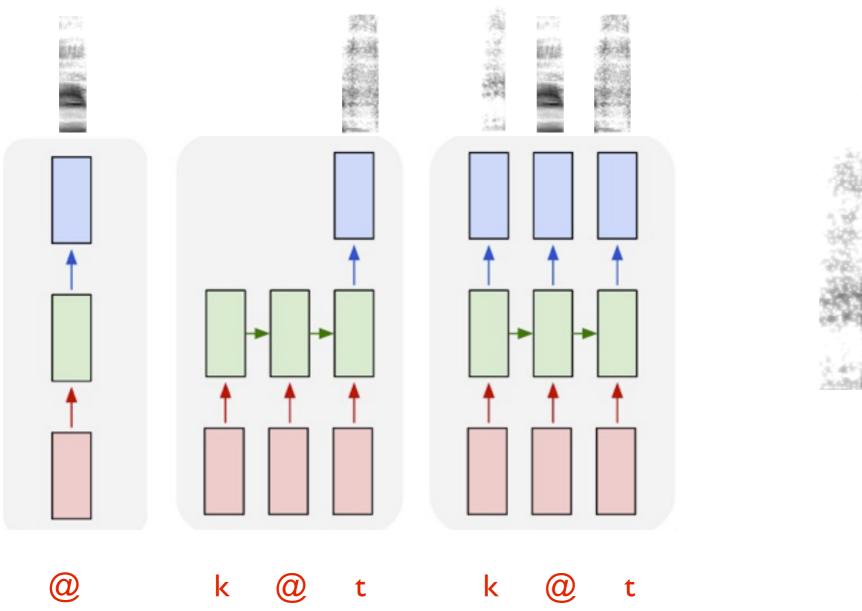
#### DNN



#### DNN



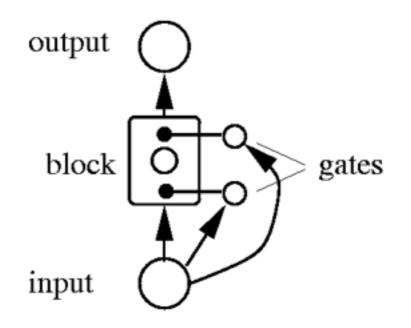
#### Recurrent NNs



Cat

# Long-Short Term Memory

- The LSTM: A RNN architecture is designed to model temporal sequences and their long-term dependencies.
- It has some memory-blocks



## Recurrent NNs

- Microsoft Research RNN samples
- <u>http://research.microsoft.com/en-us/</u> <u>projects/dnntts/</u>