

# Phase-based Information for Voice Pathology Detection

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- ✓ **Phase-based features**
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# Introduction

- **Most of speech processing techniques focus on the amplitude spectrum**
- **Phase-based features applied to speaker recognition and ASR** *Murty, 2006*  
*Hedge, 2004*
- **Promising approach for speech analysis**

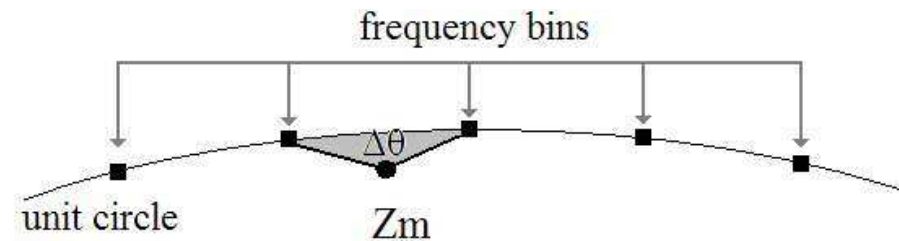
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# Group delay-based analysis

Group delay is defined as:

$$\tau(\omega) = \frac{-d(\angle X(\omega))}{d\omega}$$



# Group delay-based analysis

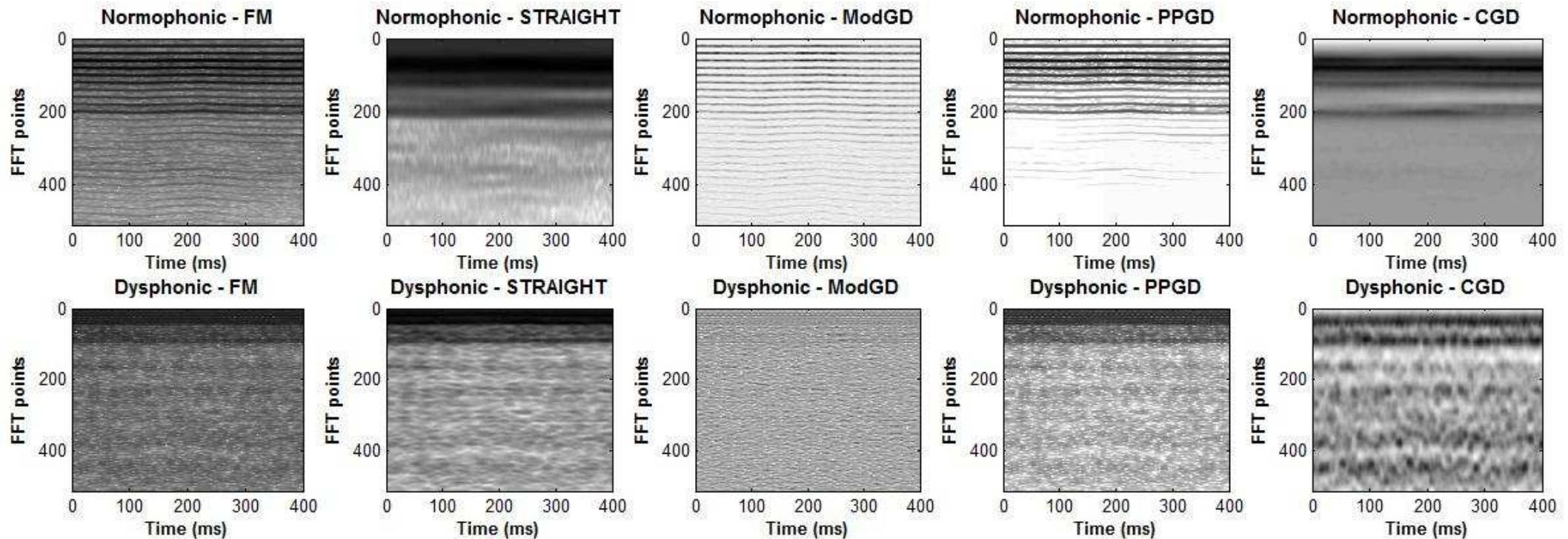
➤ **Modified Group Delay (MODGD)** *Hedge, 2004*

$$\tau_p(\omega) = \frac{X_R(\omega) \cdot Y_R(\omega) + X_I(\omega) \cdot Y_I(\omega)}{|S(\omega)|^{2\gamma}}$$

$$\tau_{\text{mod}}(\omega) = \frac{\tau_p(\omega)}{|\tau_p(\omega)|} \cdot |\tau_p(\omega)|^\alpha$$

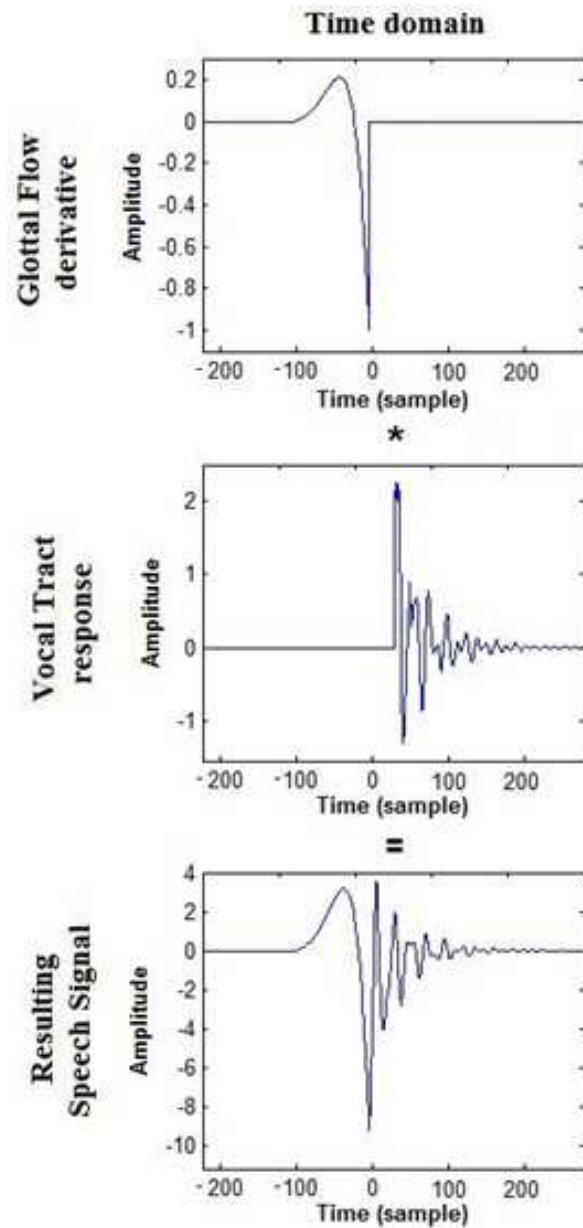
# Group delay-based analysis

- **Chirp Group Delay (CGD)** *Bozkurt, 2007*
- **STRAIGHT spectrogram** *Kawahara, 2002*
- **Fourier Magnitude (FM)**



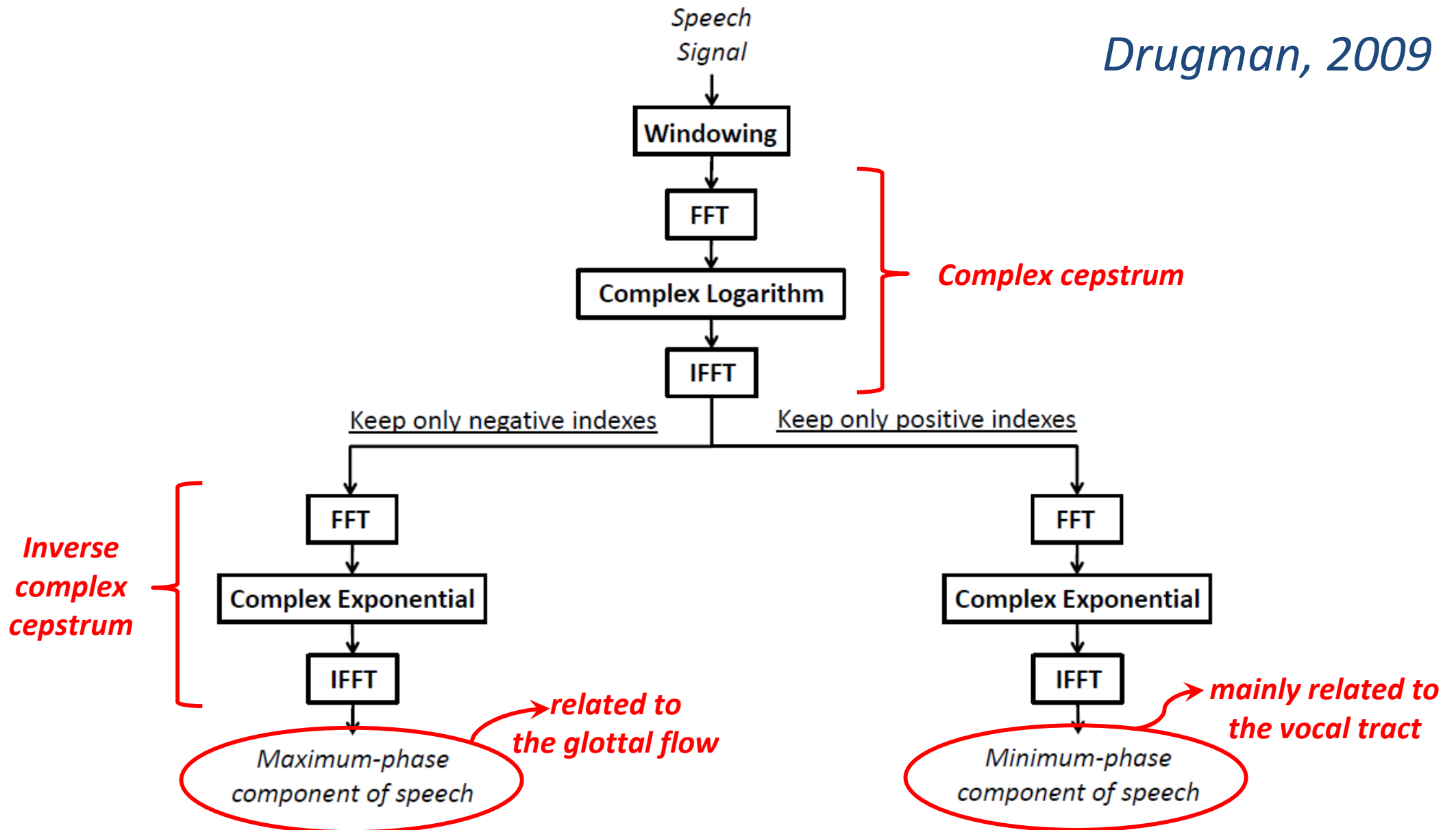


# Mixed-Phase Decomposition

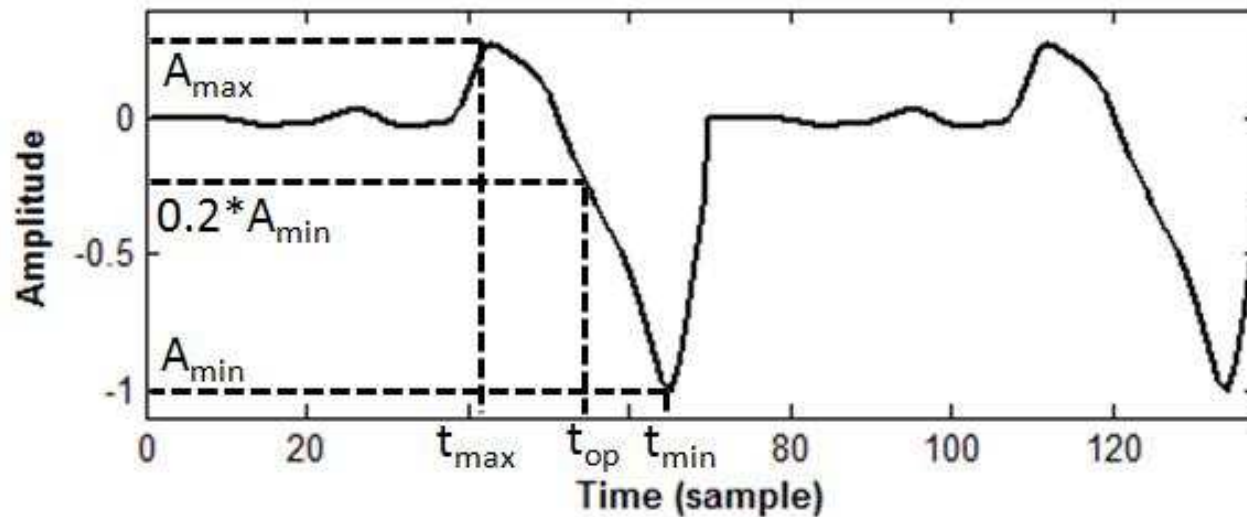


# Complex Cepstrum Decomposition

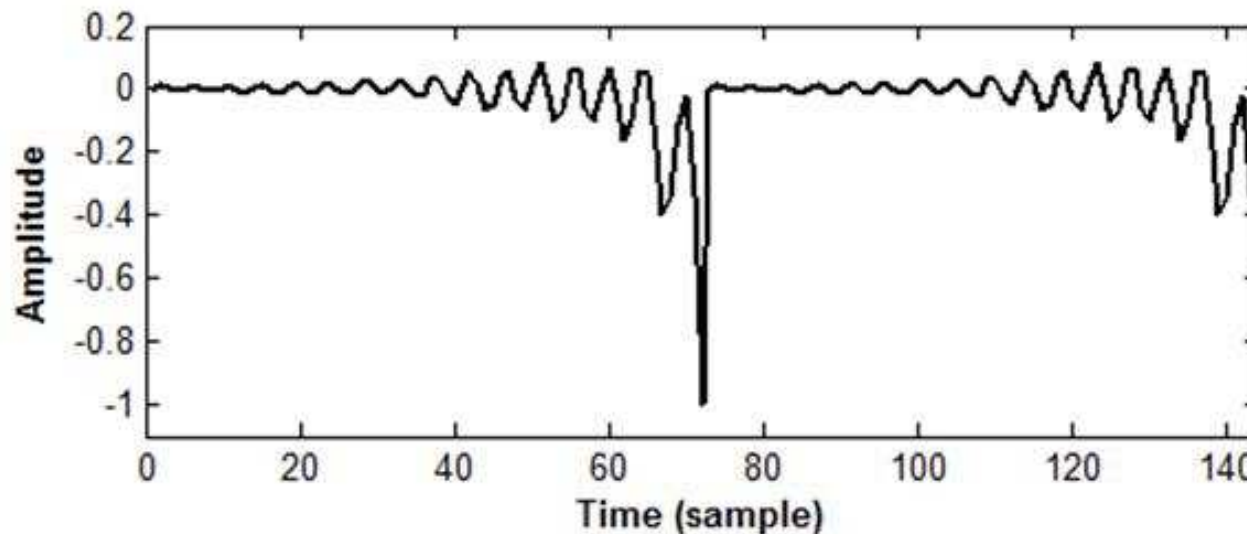
Drugman, 2009



# Adequacy of the mixed-phase model



$$T_1 = \frac{t_{min} - t_{max}}{T_0}$$



$$T_2 = \frac{t_{min} - t_{op}}{T_0}$$

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# Experimental Protocol

- **Database:** MEEI (Kay) database on sustained vowels (53 normo, 657 dyspho)

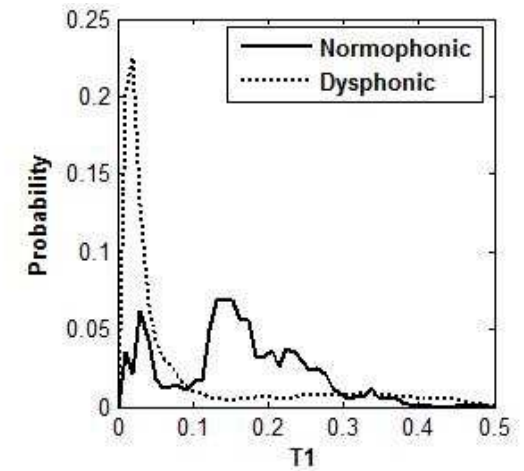
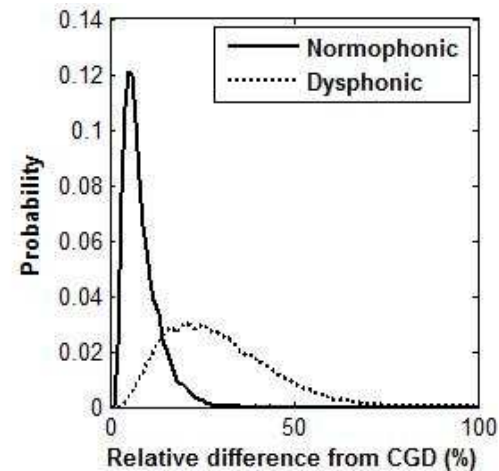
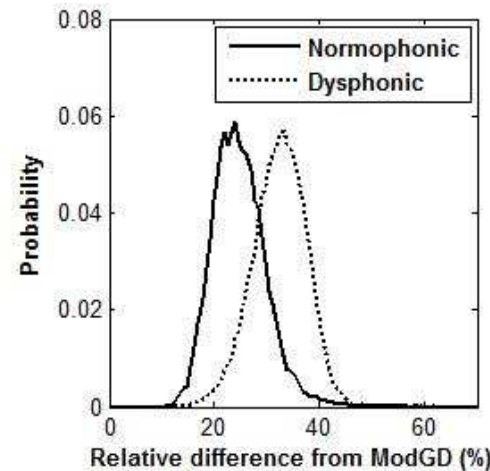
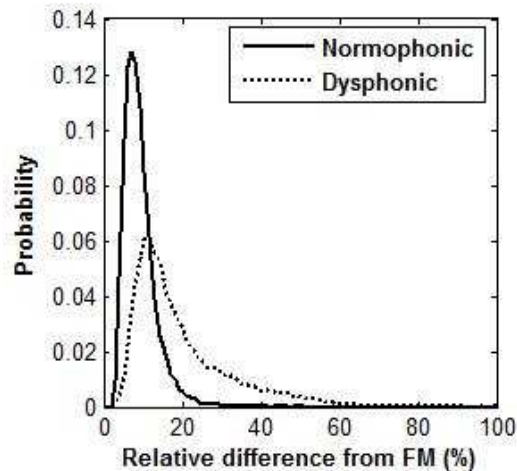
- **Features:**

Frame-to-frame variations of the 5 spectrograms

T1 and T2 for the mixed-phase model

3 perceptual spectral balances from FM

# Mutual Information-based Evaluation



Feature	dFM	dSTRAIGHT	dModGD	dPPGD	dCGD
Normalized MI (%)	22,32	16,32	30,56	15,43	55,97

Feature	T1	T2	Bal1	Bal2	Bal3
Normalized MI (%)	32,02	23,09	56,64	55,85	15,39

**(Bal1,Bal2): 64.6% of MI**

**(Bal1,T2): 79.3% of MI**

# Classifier-based evaluation

- **ANN with 16 neurons (1 hidden layer)**
- **10-fold cross validation**
- **Error rate at the frame and patient levels**

# Classifier-based evaluation

<b>Features used</b>	<b>Error rate (frame level)</b>	<b>Error rate (patient level)</b>
dFM	17.2	8.73
dCGD	9.40	4.93



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# Conclusion

- ✓ **Phase-based features are suited for characterizing irregularities of phonation**
- ✓ **Phase-based features are complementary to parameters derived from the magnitude spectrum**
- ✓ **Good performance with only 3 features**