#### Whale Song Unit Classification

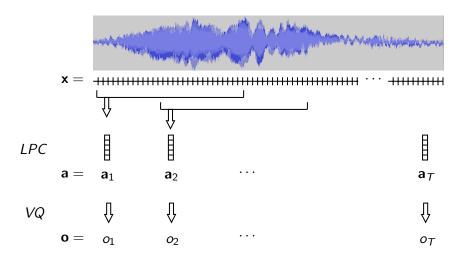
An Exploration
Using Linear Prediction Vector Quantization
and Hidden Markov Modeling

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## My background

- "Geospatial Image Stream Processing: Models, Techniques, and Applications in Remote Sensing Change Detection."
   Ph.D. Dissertation. Computer Science Dept., UC Davis, 2007.
- "Implementation and Experimentation with Speech Recognition
  --Isolated Digits— Using LPC Vector Quantization and HMM,"
  BS. Thesis, Systems Engineering Dept., Universidad Autónoma de
  Manizales, Colombia, 1993.

# Linear Predictive Coding and Vector Quantization



## **HMM Operations**

#### With $\lambda$ denoting an HMM

- For given  ${\bf o}$  and  $\lambda$ , compute  $P[{\bf o}|\lambda]$
- For a given  $\mathbf{o}$ , learn a model  $\lambda^*$  such that  $P[\mathbf{o}|\lambda^*]$  is maximized

## "whale 10": On a Selection of Units from 10 Song Files

- Classes with at least 20 unit instances
- Approximately 80% for training, 20% for a testing
- 752 training song unit instances
- N = 64 states, M = 2048 symbols
- 13 classes:

ascending\_moan ascending\_shriek cry descending moan descending\_shriek groan grunt grunts gurgle
modulated\_cry
modulated\_moan
purr

trill

<ロト < 回 > < 巨 > < 巨 > 三 の < C

## Classification on 178 Test Sequences

Confusion matrix:		0	1	2	3	4	5	6	7	8	9	10	11	12							
Confusion matrix:		U	1	2	3	4	э	О	'	۰	9	10	11	12		test	S	err	ors		
ascending_moan	0	1	0	4	1	0	0	0	1	0	0	0	0	0		7	7		6		
ascending_shriek	1	1	11	0	1	0	0	0	0	5	0	0	0	0		18	3		7		
cry	2	0	0 4 2		2	0	0	0	0	1	0	1	2	0		10	10 6		ŝ		
descending_moan	3	1	2 2 17		17	0	1	0	2	0	0	1	1	3		30	)	13			
descending_shriek	4	0	1	0	0	4	0	0	0	0	0	0	0	0		Ę	5		1		
groan	5	0	0 1 0		0	0	3	0	0	3	0	0	0	0		7	7	4			
grunt	6	0	0 0 1		1	0	2	13	0	3	0	1	0	0		20 7		7			
grunts	7	0	0	0	0	0	0	0	4	0	0	0	0	0		4	1	(	0		
gurgle	8	0	1	3	3	0	2	2	0	27	0	2	1	1		42	2	1	5		
modulated_cry	9	0	0	0	0	1	0	0	0	0	4	0	0	0		Ę	5		1		
modulated_moan	10	0	0	2	3	0	1	1	0	0	0	9	0	0		16			7		
purr	11	0	0 0 1			0	1	0	0	2	0	0	2	0		6 4					
trill	12	0	0	0	1	0	1	1	0	1	1	0	0	3		8	3		5		
	class		accuracy		test	s		candidate order													
ascending_moan	0			1.29		7			1	2	0	0	2	1	0	0	0	1	0	0	0
ascending_shriek		1		61.11%		18			11	0	2	2	0	0	0	2	0	1	0	0	0
cry	2		40.00%			10			4	2	1	1	1	1	0	0	0	0	0	0	0
descending_moan	3			6.67		30			17	6	1	3	3	0	0	0	0	0	0	0	0
descending_shriek	4			0.00		5			4	1	0	0	0	0	0	0	0	0	0	0	0
groan	5			2.86		7			3	0	2	2	0	0	0	0	0	0	0	0	0
grunt	6			5.00		20			13	4	0	2	1	0	0	0	0	0	0	0	0
grunts	7			0.00		4			4	0	0	0	0	0	0	0	0	0	0	0	0
gurgle	8			1.29		42			27	9	1	0	1	1	1	1	1	0	0	0	0
modulated_cry	9			0.00		5			4	1	0	0	0	0	0	0	0	0	0	0	0
modulated_moan	10			6.25		16			9	2	2	1	0	1	1	0	0	0	0	0	0
purr	11			3.33		6			2	1	1	1	0	1	0	0	0	0	0	0	0
trill	12		3	7.50	%	8			3	0	1	0	1	0	1	1	0	0	0	1	0
	TOTA	L	5	7.30	%	178		1	02	28	11	12	9	5	3	4	1	2	0	1 _	0