

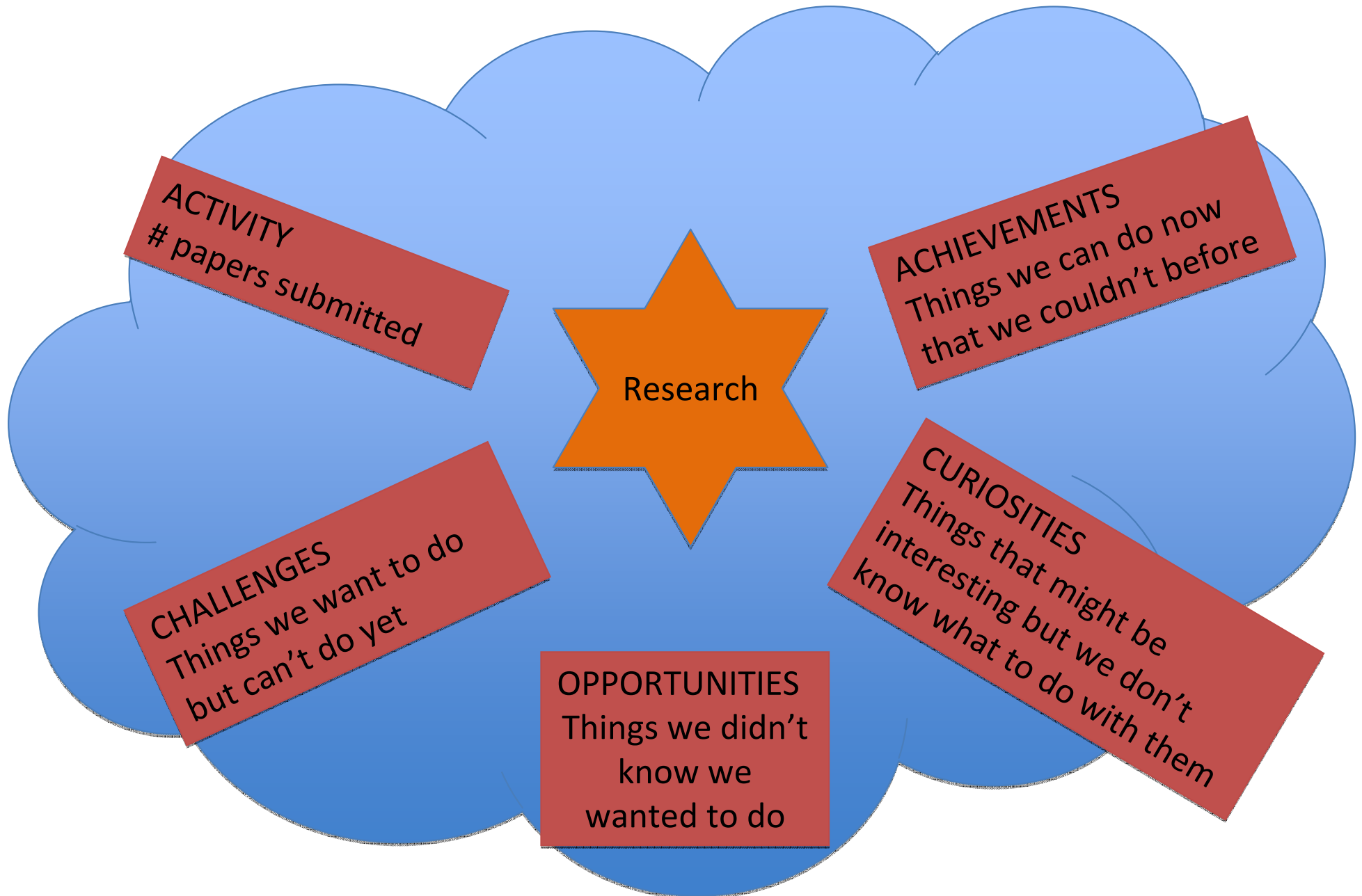
Trends
in
Audio and Acoustic Signal Processing

ICASSP 2011

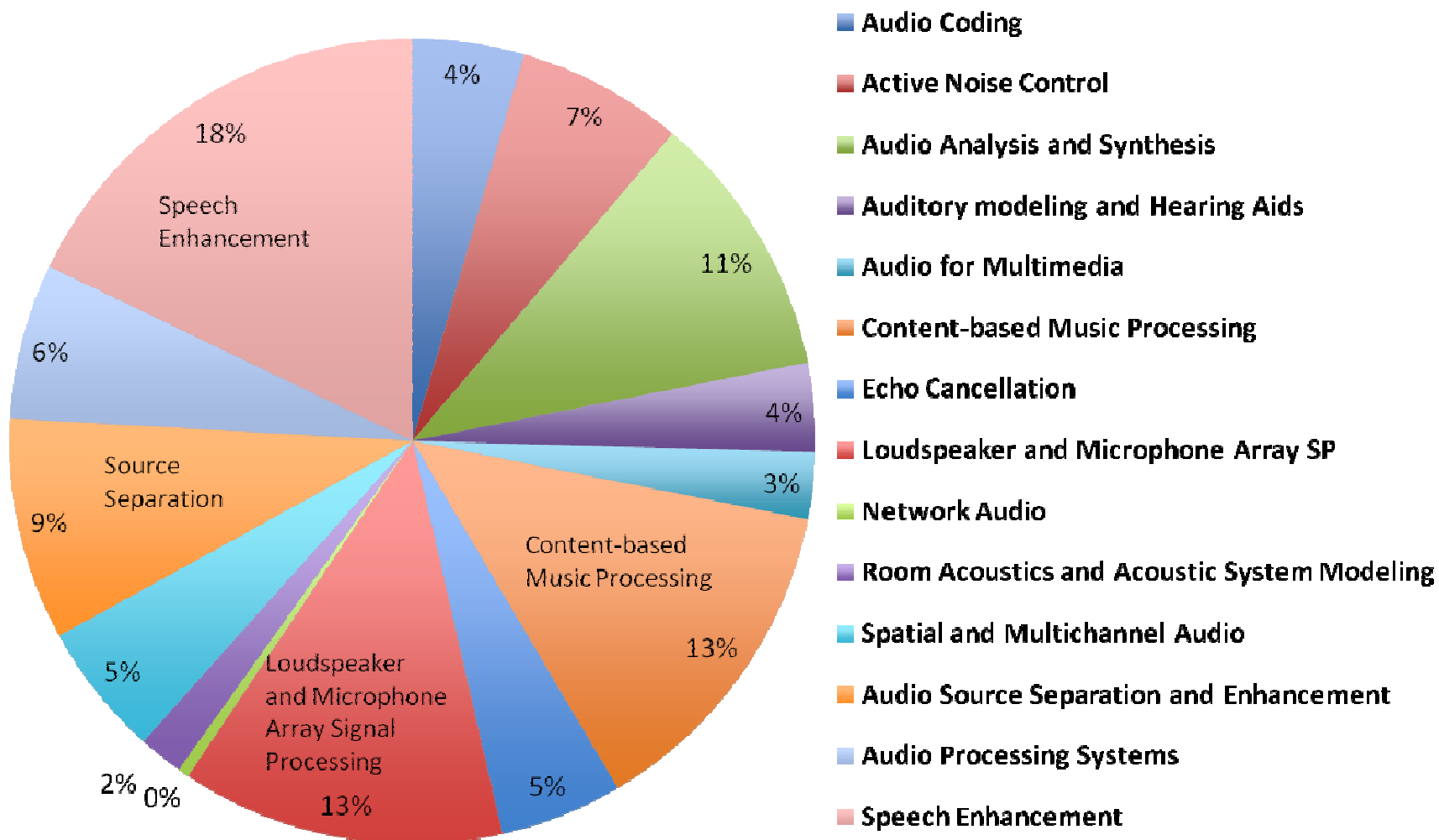
Malcolm Slaney, Yahoo! Research Silicon Valley, USA

Patrick A. Naylor, Imperial College London, UK

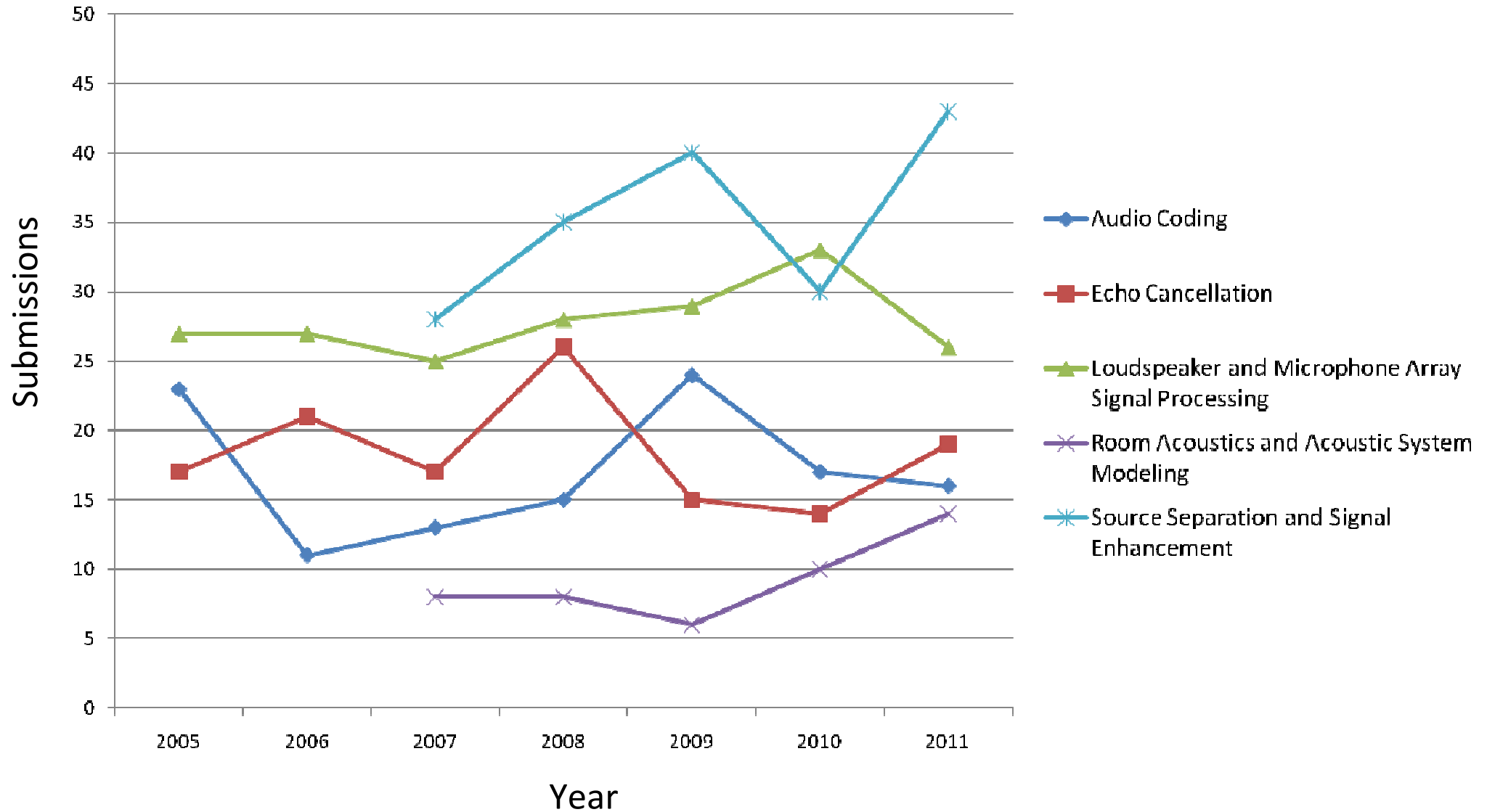
What do we mean by 'Trends'?



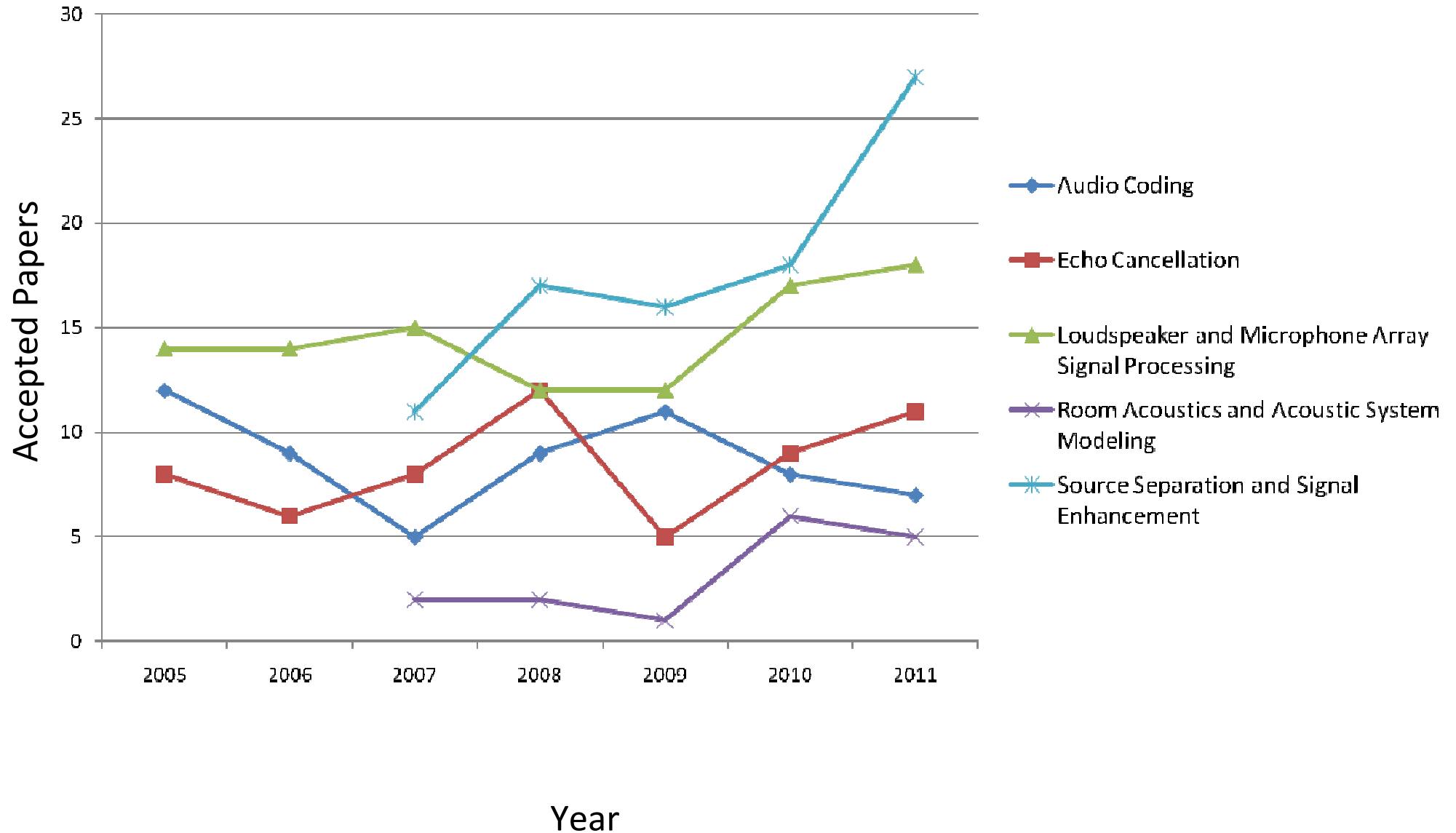
T-ASLP Submissions by EDICS, 2010



Historical Trends – ICASSP Submissions



Historical Trends – ICASSP Accepted Papers



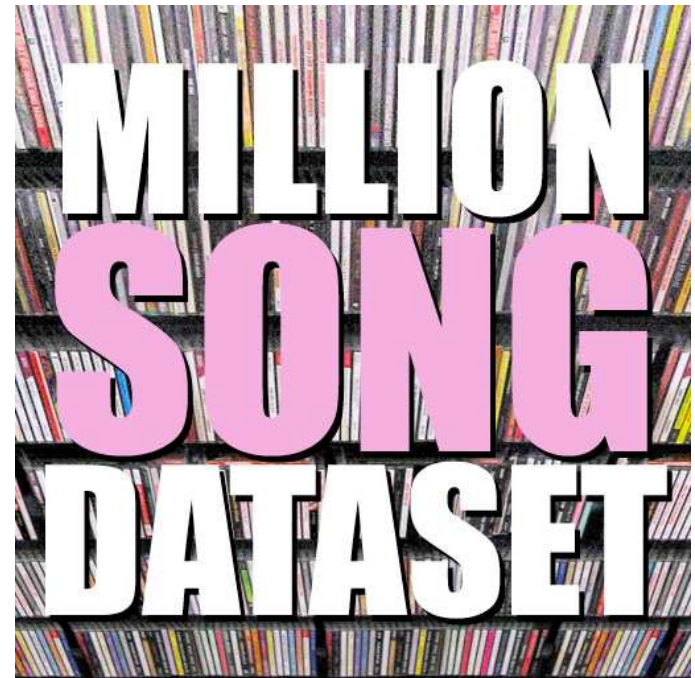
Music at ICASSP

- Three sessions
 - SS-L5: Music Signal Processing Exploiting Musical Knowledge
 - AE-L3: Music Signal Processing
 - AE-P7: Music Signal Processing
- Reasons
 - New EDICS
 - More content
 - Commercially relevant



Big Datasets

- Easy to rip CDs
 - Copyright issues
- Million-Song Dataset
 - Distribute features
 - Columbia and EchoNest



MIREX Competition



Audio Classification (Train/Test) Tasks

- Audio Artist Identification
- Audio US Pop Genre Classification
- Audio Latin Genre Classification
- Audio Music Mood Classification
- Audio Classical Composer Identification

Audio Cover Song Identification

Audio Tag Classification

Audio Music Similarity and Retrieval

Symbolic Melodic Similarity

Audio Onset Detection

Audio Key Detection

Real-time Audio to Score Alignment (a.k.a Score Following)

Query by Singing/Humming

Audio Melody Extraction

Multiple Fundamental Frequency Estimation & Tracking

Audio Chord Estimation

Query by Tapping

Audio Beat Tracking

Structural Segmentation

Audio Tempo Estimation

Musical Separation

- Sound separation
 - Uses
 - Understanding (key, melody)
 - Transcriptions
 - Multipitch estimation
 - With better models
 - HMM
 - Scores
 - Techniques
 - NMF
 - Matching Pursuit
 - PLCA

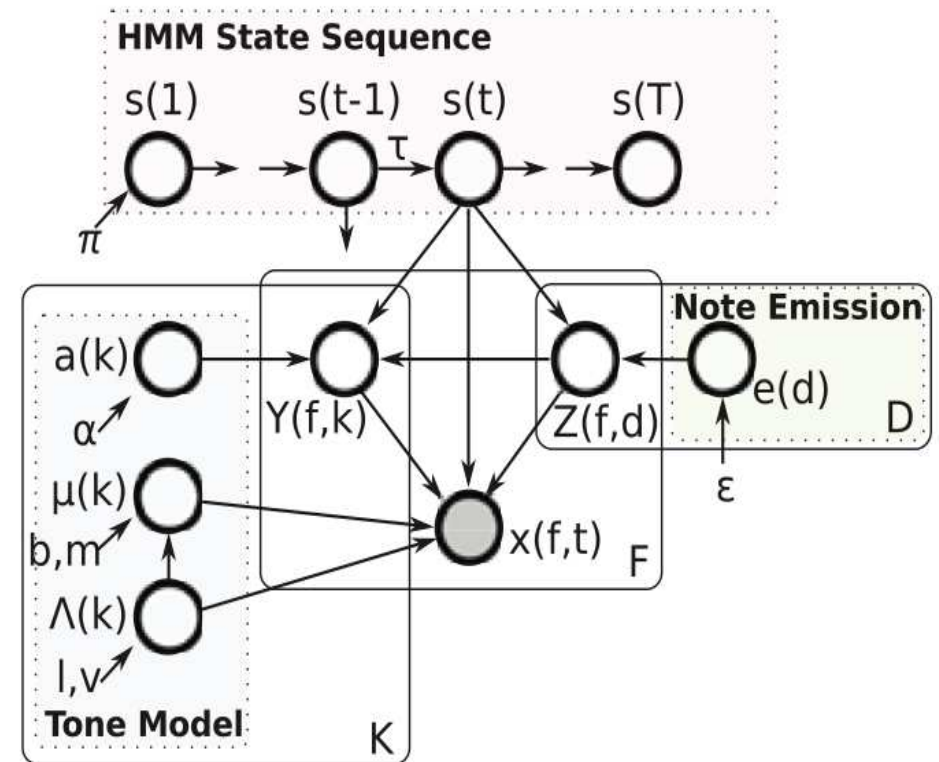
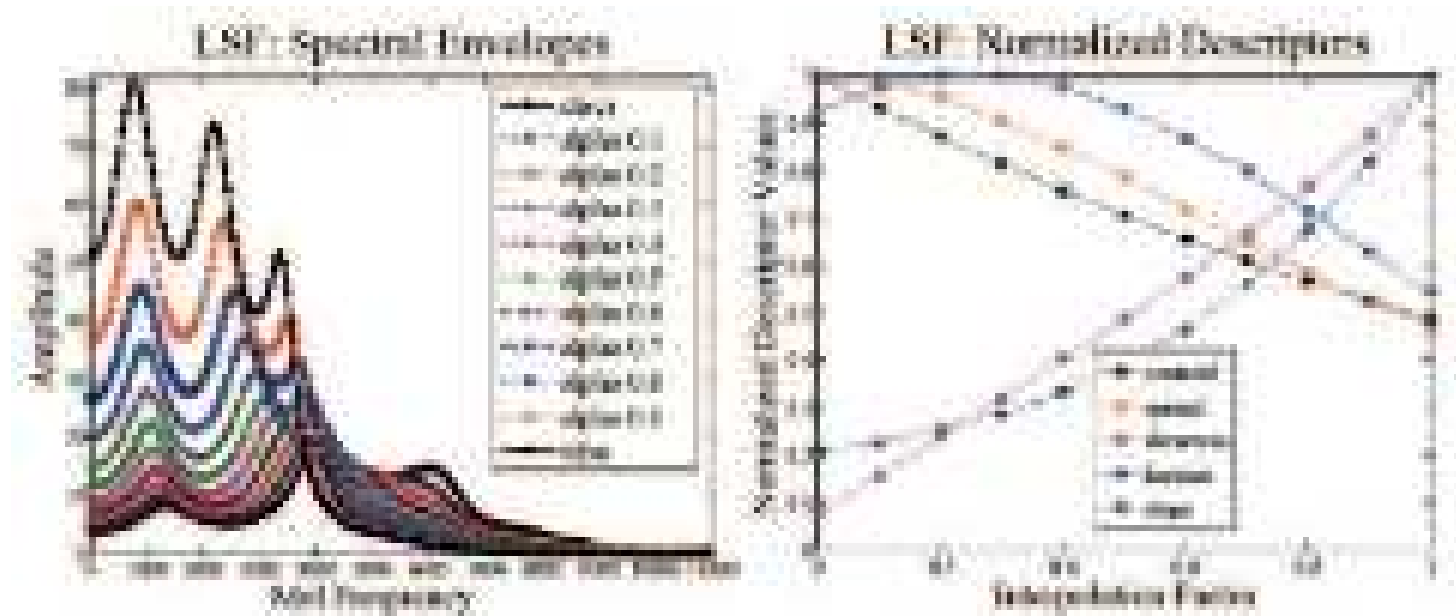



Fig. 1. Graphical model of our method.

Music Research

- Tagging
 - Genre
 - Emotion
- Miscellaneous
 - Morphing
 - Similarity



Applications vs. Algorithms?



If I'm going to be Queen, I suppose I will not have much time left for Audio and Acoustic Signal Processing

My Expectation Maximization algorithm has converged !

If there is a trend towards things that look nice (applications), let's not lose sight of the fundamental power behind them (algorithms).

Microphone Array Signal Processing

APPLICATIONS

- Hearing aids
- TV / Entertainment

GEOMETRY and DISTRIBUTION

- Linear, planar/cylindrical, spherical, distributed
- Spacing and orientation

TASKS

- Localization of sources
- Tracking
- Extraction/Separation
- Inference of room geometry

the Eigenmike®
– mh Acoustics



32 elements
8.4 cm rigid sphere



2 - 64 elements, 0.5 m, linear 'wing' array

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3D LED Series (40")

Call friends and family from the comfort of your couch.

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Other Sizes

46" 55"



MICROPHONE POSITION OPTIMIZATION FOR PLANAR SUPERDIRECTIONAL BEAMFORMING

Ina Kodrasi^{1,2}, Thomas Rohdenburg², Simon Docto¹

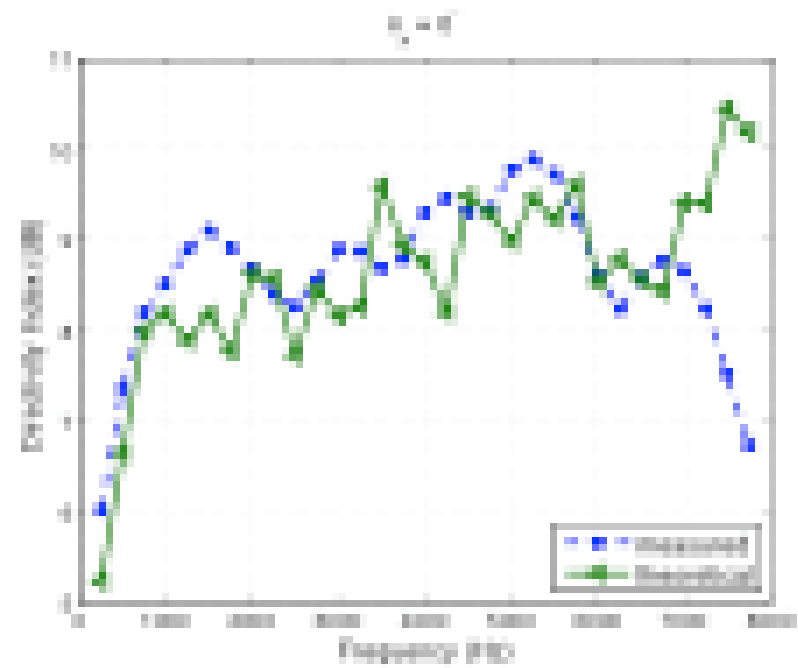
ina.kodrasi@uni-oldenburg.de

¹University of Oldenburg, Institute of Physics, Signal Processing Group, Oldenburg, Germany

²Fraunhofer IDMT, Project Group Hearing, Speech and Audio Technology, Oldenburg, Germany



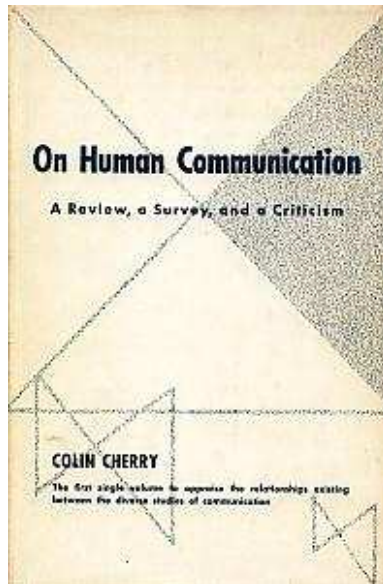
Planar Array Geometry



Directivity Index measured vs theoretical

Source Separation

- ‘Cocktail party problem’
 - Colin Cherry in 1950s
 - Audio signals from multi-talker distant talking scenarios
 - Behavior of a listener presented with two speech signals simultaneously



Colin Cherry
'TRENDSETTER'

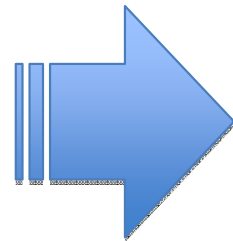
Source Separation

- Determined and underdetermined scenarios
 - Clustering based blind source separation
 - Permutation problem (EM)
 - Reverberation times of, say, 100 - 500 ms



Speech Enhancement

- Dereverberation technology

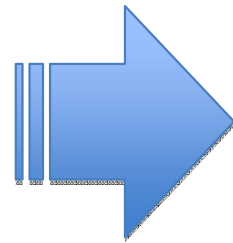


real-world applications

- Single and multichannel
- Acoustic channel inversion
- Speech and Music

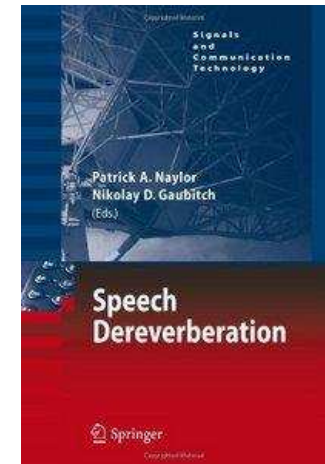
Speech Enhancement

- Dereverberation¹ technology



real-world applications

- Single and multichannel
- Acoustic channel inversion
- Speech and Music



[1] P. A. Naylor and N. D. Gaubitch, Eds., Speech Dereverberation. Springer, 2010.

Synergies

- Joint dereverberation and blind source separation

IEEE TRANSACTIONS ON AUDIO, SPEECH, AND LANGUAGE PROCESSING, VOL. 19, NO. 1, JAN. 2011

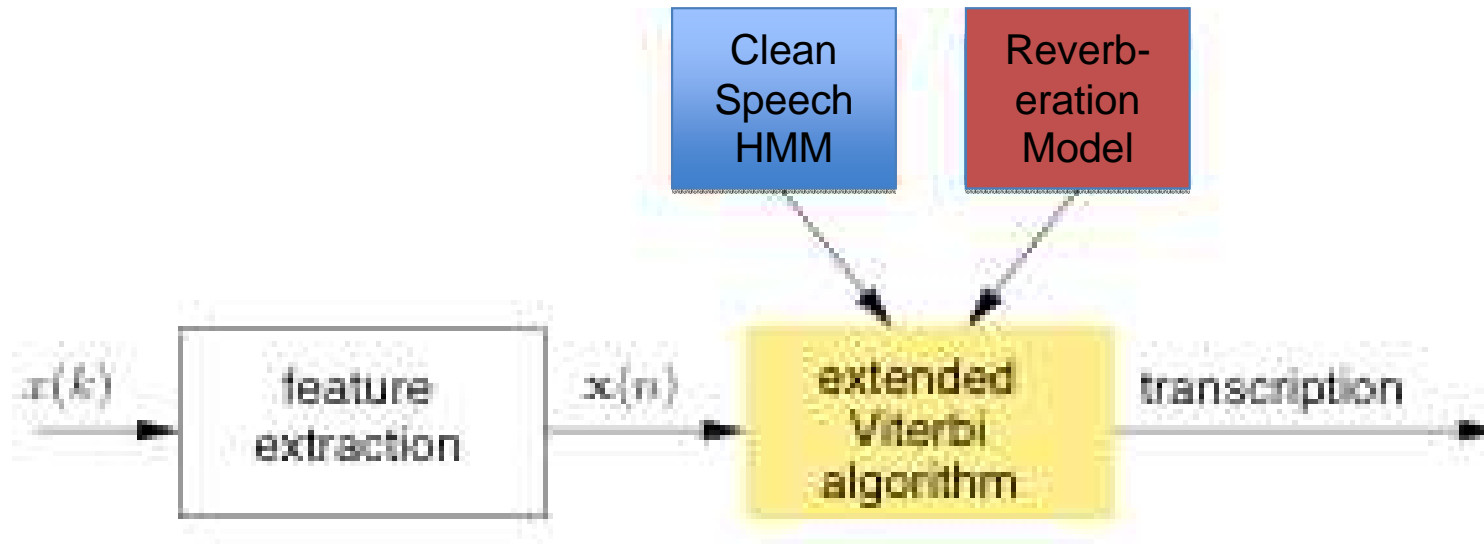
Blind Separation and Dereverberation of Speech Mixtures by Joint Optimization

Takuya Yoshida, *Member, IEEE*, Tomohiro Nakatani, *Senior Member, IEEE*,
Masato Miyoshi, *Senior Member, IEEE*, and Hiroshi G. Okuno, *Senior Member, IEEE*

- Speech recognition of reverberant speech

**FRAME-WISE HMM ADAPTATION USING
STATE-DEPENDENT REVERBERATION ESTIMATES**

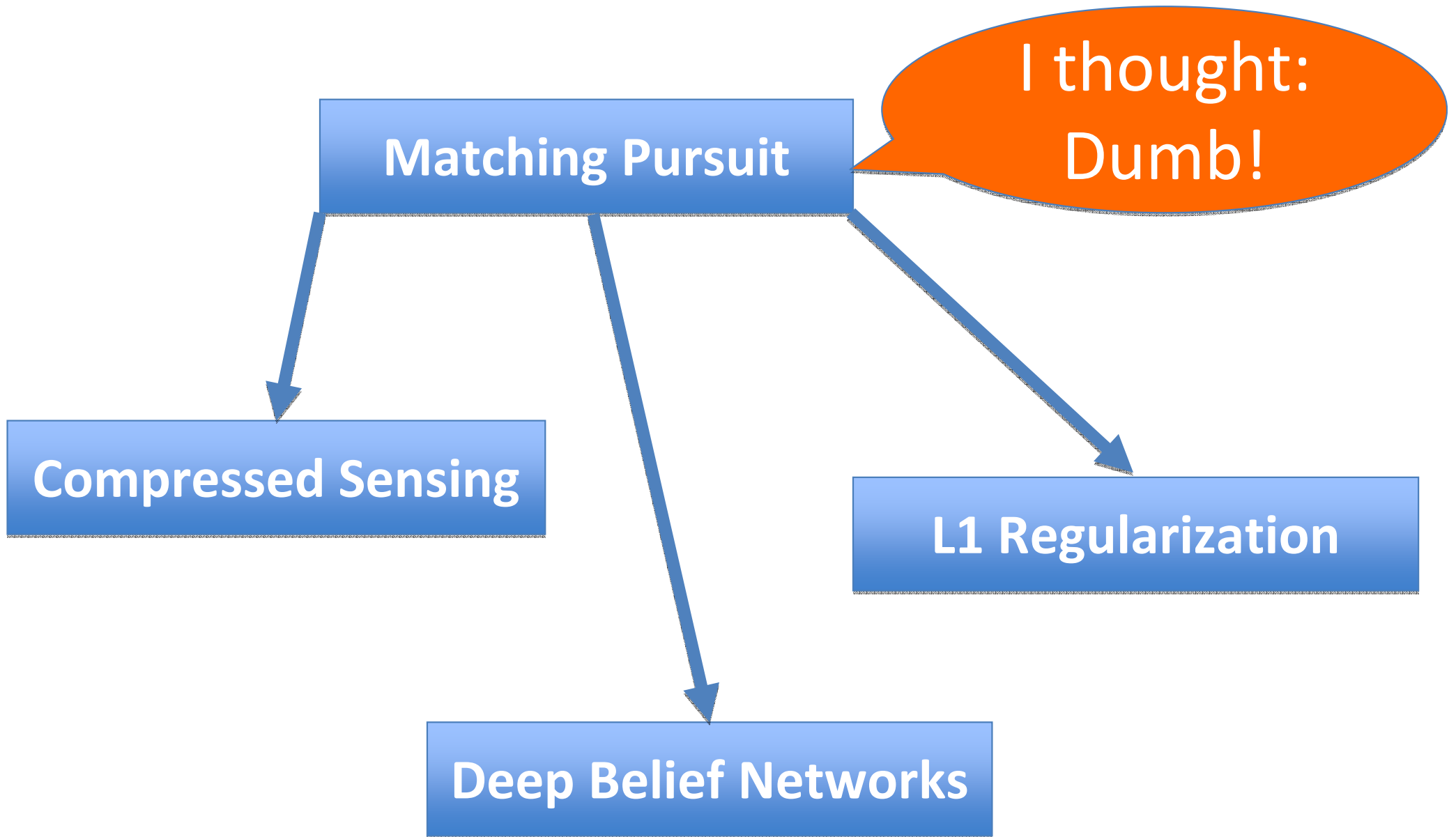
Armen Sotiv, Roland Maas, and Walter Kellermann



Recurring Theme

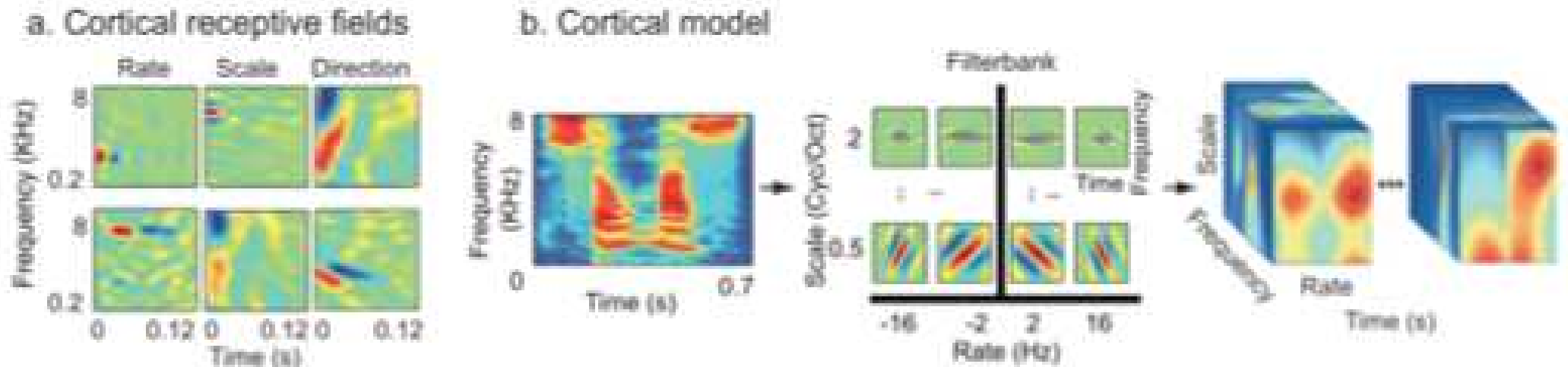
S P A R S I T Y !

History of Sparsity at ICASSP

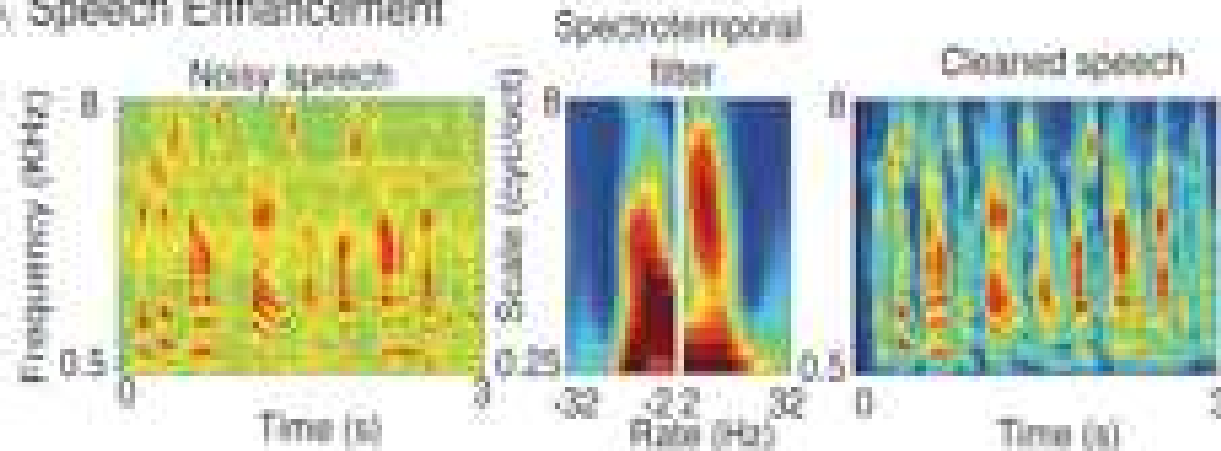


Spatial-Temporal Receptive Fields

- Original sparse representation (spikes!)



b. Speech Enhancement



Deep Belief Network

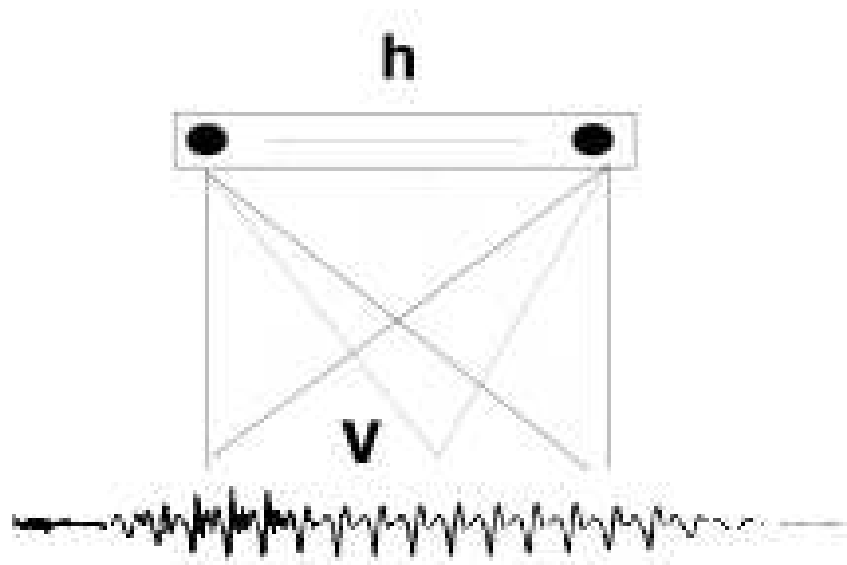
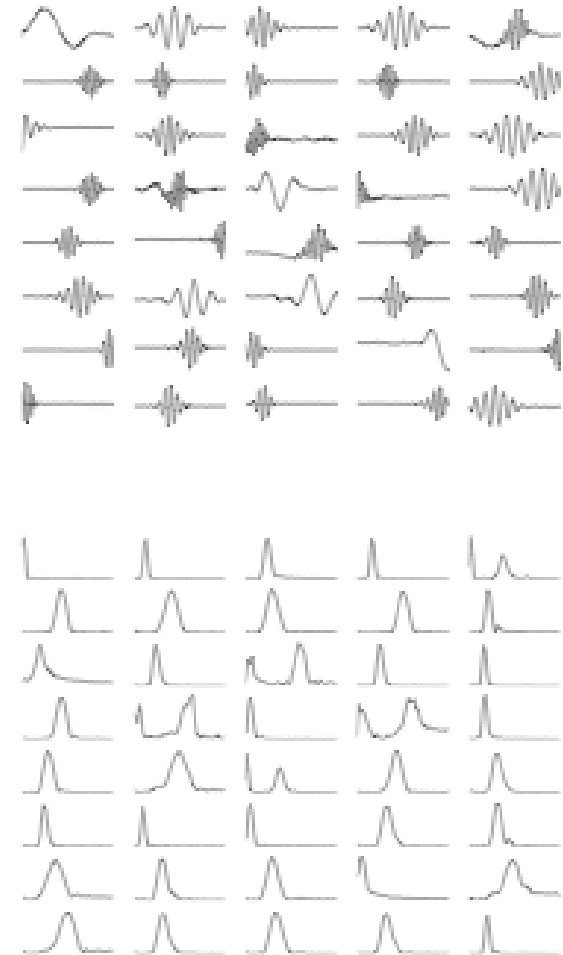


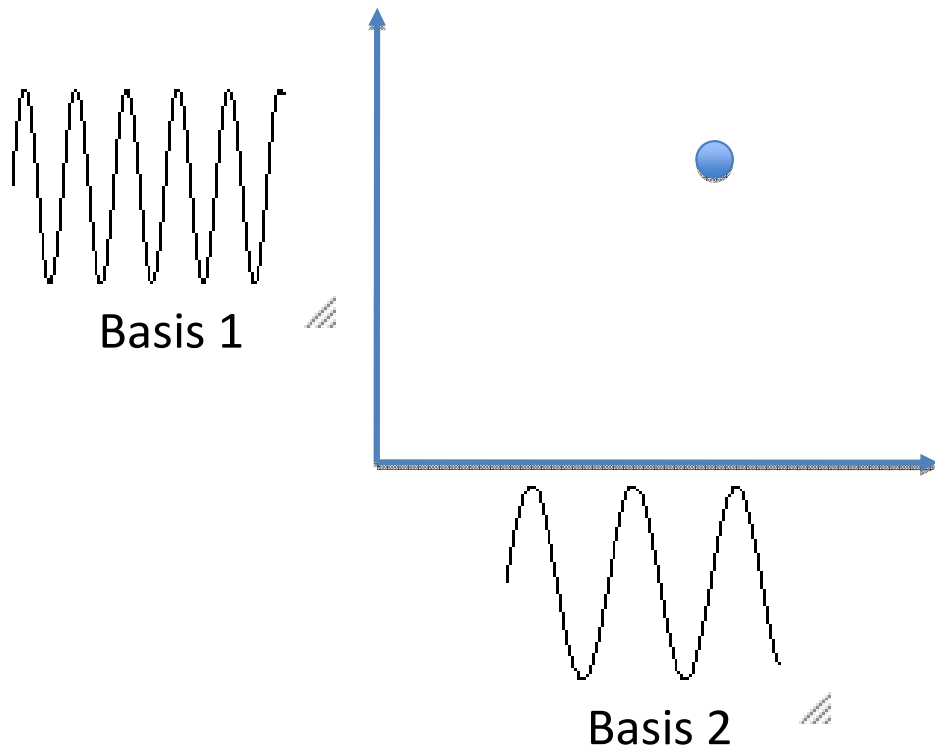
Fig. 1. RBM is used to model fragments of speech signals.



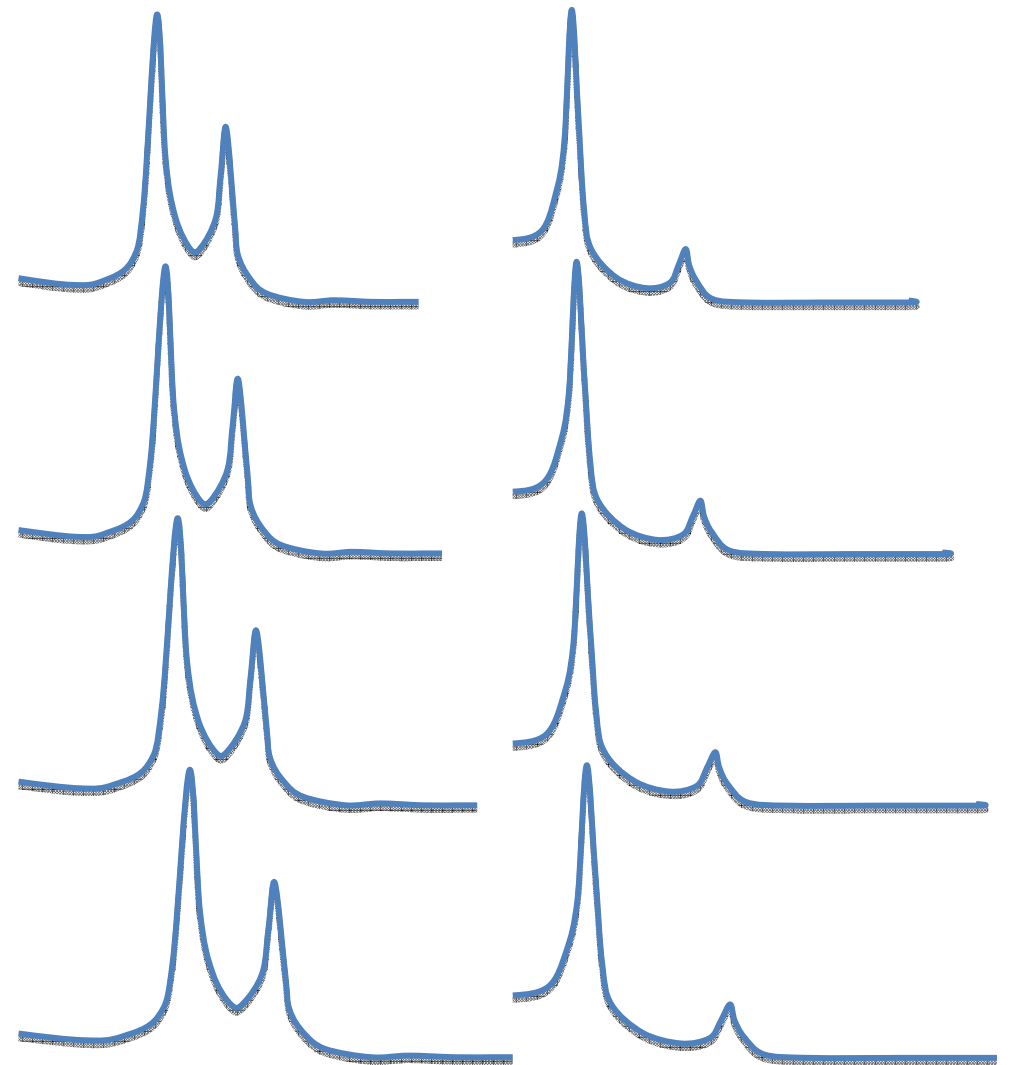
These are NOT your average wavelet/Gabor response!!

Nonlinear Modeling via Sparsity

All-Possible Combinations



Over-complete Basis



Industrial Perspectives

“Remaining challenges [in source separation] could include BSS for unknown/dynamic number of sources.”

Tomohiro Nakatani NTT Communication Science Laboratories



Industrial Perspectives

Mixed-signal ICs for mobile phones

“Moore’s Law is driving DSP speed and memory capacity ... enabling implementation of sophisticated DSP functions that have resulted from years of research in acoustic signal processing. The end-user experience is one of natural wideband voice communication, devoid of acoustic background noise and unwanted artefacts.”

Anthony Magrath Director of DSP Technology, Wolfson Microelectronics

Industrial Perspectives

“The applications of sound capture, speech enhancement, and audio processing technologies shift gradually from communications mostly, towards speech recognition and building natural human-machine interfaces for mobile devices, in cars, and in our living rooms.”

Ivan Tashev Microsoft Research



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for  XBOX 360.

New Album

LADY GAGA

BORN THIS WAY



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Born This Way (...)
Lady GaGa



Like My Mother ...
Lauren Alaina



American Idol Se...
Scotty McCreery



Glee: The Music,...
Glee Cast



Brighter Than th...
Colbie Caillat



Torches
Foster the People



Don't W
Jason D



This Is Country ...
Brad Paisley



I Love You This ...
Scotty McCreery



American Idol Se...
Lauren Alaina



Light Up the World
Glee Cast



Original Songs A...
Various Artists



MMG Presents: S...
Various Artists



Blacklig
Tedashi



After-thought

- Trend
 - Origin: Old English *trendan* ‘revolve, rotate’, of Germanic origin
- “What goes around, comes around” (?)

Texture

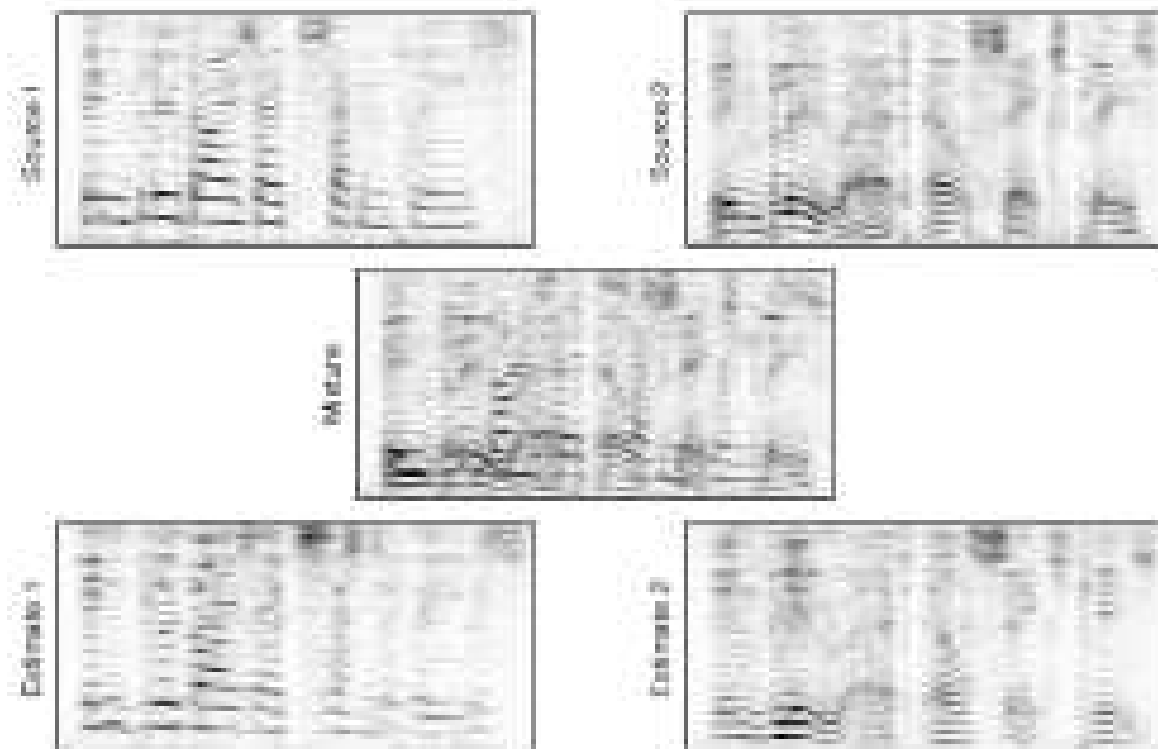


Fig. 6. A result from a single source separation experiment. The top plots show two sentences spoken by two different speakers. The middle plot shows their observed mixture, and the bottom plots the estimated sources given training data from each speaker.

Sparsity

- Better representations
 - Sparse
 - Matching pursuit
 - DBNs
 - features for recognition
 - New angles (cortical and textures)
 - Subspaces (latent and otherwise)