

# NIST 2006 Speaker Recognition Evaluation

## Evaluation Results

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[www.nist.gov/speech/tests/spk](http://www.nist.gov/speech/tests/spk)

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San Juan, Puerto Rico

## Outline

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- Today
  - Evaluation Review
  - Evaluation Results
  - Mothballed Systems and History Plots
  - Language Effects
  - Summary
- Tomorrow
  - Cross-channel Results

## Evaluation Review

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- Task
- Modes of Operation
- Conditions
- Rules
- Data
- Changes from Last Year
- Metric and Performance Representation

## Speaker Detection Task

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- Given a model speaker and side information, determine if that speaker is speaking in a given test segment
  - A model and a test segment define a *trial*
  - Permitted side information
    - Gender of the model speaker
    - ASR transcripts

## Modes of Operation

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- Normal mode (no adaptation)
- Unsupervised adaptation mode
  - May use test segments to update the model for subsequent test segments
  - Must process the trials for each model in a prescribed order
  - Must submit normal mode results as well

## Evaluation Conditions

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<ul style="list-style-type: none"><li>■ Five training conditions<ul style="list-style-type: none"><li>■ Two-channel data with target speaker channel designated<ul style="list-style-type: none"><li>■ Eight conversations</li><li>■ Three conversations</li><li>■ <i>One conversation</i></li><li>■ 10-sec excerpt from one conversation</li></ul></li><li>■ Summed-channel data, three conversations</li></ul></li></ul>	<ul style="list-style-type: none"><li>■ Four test conditions<ul style="list-style-type: none"><li>■ Two-channel data with target speaker channel designated<ul style="list-style-type: none"><li>■ <i>One conversation</i></li><li>■ 10-sec excerpt from one conversation</li><li>■ One conversation from auxiliary microphone</li></ul></li><li>■ Summed-channel data, one conversation</li></ul></li></ul>
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# 15 Evaluation Conditions

Test→ Train↓	1conv4w	10sec4w	1conv2w	1convmic
1conv4w	required	optional	optional	optional
3conv4w	optional	optional	optional	optional
8conv4w	optional	optional	optional	optional
10sec4w		optional		
3conv2w	optional		optional	

## Evaluation Rules *(normal mode)*

- Each decision to be made independently
  - Not applicable to unsupervised adaptation
- Normalization over multiple test segments NOT allowed
  - Not applicable to unsupervised adaptation
- Normalization over multiple target speakers NOT allowed
- Use of evaluation data for impostor modeling NOT allowed
- Use of manually produced transcripts or any other human interaction with the data NOT allowed
- Knowledge of the model speaker gender ALLOWED
  - No cross sex trials

## Evaluation Data

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- MIXER3
  - 528 new speakers
    - 139 native English speakers, 389 bilingual speakers
    - recordings made from Dec, 2005 to Feb, 2006
- Cross-channel
  - 85 unexposed MIXER2 speakers
    - 57 had other non-cross-channel calls
  - collected at LDC & ICSI
- SRE05 Data
  - 398 speakers from SRE05 for 8-conv training condition
- 16558 test segments
- 3459 models
  - 1484 male, 1975 female
- 514706 trials

## Data Processing

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- Processed with the Mississippi State provided echo canceller
- The “10 second” training and test segments had 7-13 seconds of actual speech
- ASR transcripts created for training and test data
  - Processed at BBN with a 1x real-time system
  - English recognizer run on all data in all languages
  - ASR produced no transcripts for some segments

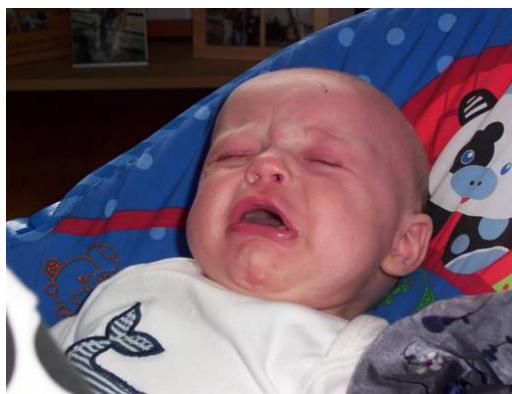
## Data Problems

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- Inappropriate trial lists
  - Due to data preparation algorithm bug
  - Solution: corrected trial lists and extended submission deadline
- Empty files
  - Models with very little or no speech (1.1%)
  - Test segments with very little or no speech (0.7%)
  - Solution: eliminated these models/test segments from scoring
- Mislabeled language
  - Data incorrectly labeled as English (1.1% model, 3% test segment)
  - Solution: corrected the key and rescored the common condition, other rescore to be done after workshop
- Malfunction microphone
  - Mic5 of cross-channel data collected at LDC had a battery pack malfunction
  - Solution: will eliminate these test segments from scoring

## Introducing

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**Anton Filip Reynolds Feb 28, 2006**

## Changes from Last Year

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- Some reused data
  - Trials involving 8-conv. training repeated from 2005 to increase the numbers of speakers and trials
- Sites could optionally specify that scores represented likelihood ratios appropriate for the alternative scoring metric
- BBN supplied ASR from a different recognizer
- Reduced the number of tests from 20 to 15 based on participation from last year

## Evaluation Metric

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$$C_{DET} = Norm_{Fact} * ((C_{Miss} * P_{Miss/Target} * P_{Target}) + (C_{FA} * P_{FA/NonTarget} * P_{NonTarget}))$$

Cost of a miss	$C_{Miss} = 10$
Cost of a false alarm	$C_{FA} = 1$
Probability of a target	$P_{Target} = 0.01$
Probability of a non-target	$P_{NonTarget} = 1 - P_{Target} = 0.99$

Normalization factor ( $Norm_{Fact}$ ) is defined to make 1.0 the score of a knowledge-free system that always decides “False”

- Its detection cost  $C_{default} = 10 * 100\% * 0.01 + 1 * 0\% * 0.99 = 0.1$   
So  $Norm_{Fact} = 10$

## Alternative Metric

$$C_{11r} = 1 / ( (2 * \log 2) * ( (\sum \log(1+1/lr) / NTT) + (\sum \log(1+lr) / NNT) ) )$$

lr	$P_{Data Target} / P_{Data NonTarget}$
Number of target trials	NTT
Number of non-target trials	NNT

- Reference

- “Application-Independent Evaluation of Speaker Detection” in Computer Speech & Language, volume 20, issues 2-3, April-July 2006, pp. 230-275, by Niko Brummer and Johan du Preez

## Performance Representation

- DET Plots

- Shows the tradeoff of False Alarm and Miss error rates on a normal deviate scale
  - Actual decision points marked with a triangle, minimum detection point marked with a circle
  - Actual decision points often have a 95% confidence box around them

- Bar Graphs

- Shows the contribution of two error types to  $C_{DET}$  values

# Participants

## ■ 36 submitting sites

Australia

Canada

China (6)

## Czech Republic

Denmark

## Finland

## Frame

## Germany

Israel

Italy

## Lebanon

Singapore (:

## South Africa

Spain (2)

## ■ 90 systems

- 10 unsupervised adaptation systems
- 2 “mothballed” systems

- 283 test condition/system combinations

## Participants – Asia

NIST ID	Site	Location
CST*	Center for Speech Technology, Tsinghua University	China
DEAR*	Beijing d-Ear Technologies Co. Ltd	China
FTRD*	France Telecom Research and Development Beijing	China
IIR	Institute for Infocomm Research	Singapore
IIRJ	Institute for Infocomm Research & University of Joensuu*	Singapore
IOA	Institute of Acoustics, Chinese Academy of Sciences	China
USTC	University of Science and Technology of China	China

\* denotes first time participant

## Participants – Australia

NIST ID	Site	Location
QNI	Queensland University of Technology & IBM	Australia

## Participants – Europe

NIST ID	Site	Location
ATVS	Universidad Autonoma de Madrid	Spain
BUT*	Brno University of Technology	Czech Republic
ENST	Ecole Nationale Supérieure des Telecommunications, IRCCN	France
ETI	ETI	Denmark
I3A*	Aragon Institute for Engineering Research, University of Zaragoza	Spain
IESK*	IESK Cognitives Systems, University of Magdeburg	Germany
IMK*	Fraunhofer Institute for Media Communication	Germany
IRI	IRISA	France

## Participants – Europe (cont'd)

NIST ID	Site	Location
LIA	Laboratoire d'Informatique d'Avignon, University of Avignon	France
LIM	LIMSI, CNRS	France
LPT	Loquendo* & Politecnico Di Torino	Italy
LRDE	LRDE EPITA	France
THL	Thales Communication	France
TNO	TNO	The Netherlands
UFR	University of Fribourg & Institut National des Telecommunications	France
ULJ*	University of Ljubljana	Slovenia
UPMC*	Universite Pierre et Marie Curie, France	France
UWS	University of Wales Swansea	UK

## Participants – Middle East

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NIST ID	Site	Location
PRS*	Persay Ltd	Israel
UOB*	University of Balamand	Lebanon

## Participants – N. America

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NIST ID	Site	Location
CRIM	CRIM	Canada
CRSS*	Center for Robust Speech Systems, University of Texas at Dallas	USA
HEC	HEC, Air Force Research Laboratory	USA
ICSI	International Computer Science Institute	USA
MIT	MIT Lincoln Laboratory & IBM	USA
SRI	SRI International	USA

## Evaluation Systems Collaborations

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- MIT/IBM
- QUT/IBM
- SRI/ICSI
- IIR/University of Joensuu
- SDV/TNO/BUT/SUN
- ENST/LRDE/UFR/UPMC
- ...
- There were numerous site collaborations in this year's evaluation. This list is not exhaustive.

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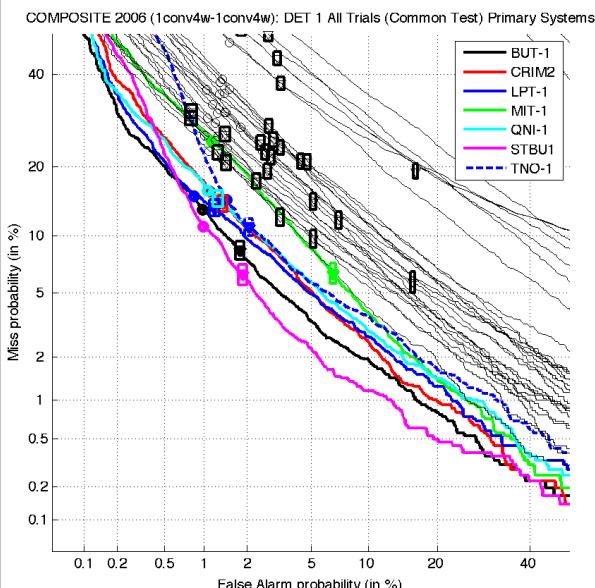
## Core Test Condition

- 1conv4w-1conv4w
- Required of all participants
- Restrictions
  - None, but we removed many trials involving models or test segments in error

Targets			Non-Targets			
Trials (segs)	Speakers	Models	Trials (segs)	Model Speakers	Models	Segment Speakers
3612 (2410)	608	810	47836 (2456)	608	810	614

## Core Test DET Plot (all trials)

1conv4w-1conv4w



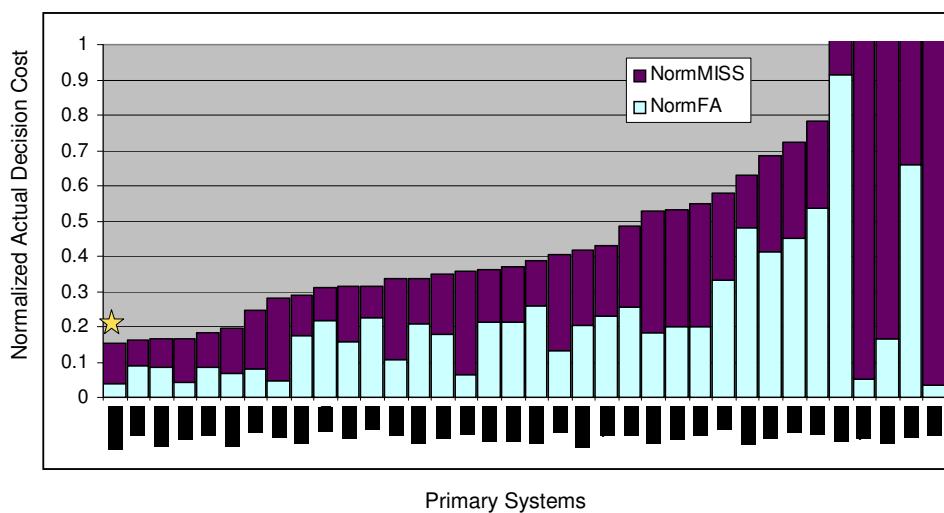
- The “required” test
- 35 participants submitted results, overwhelming MATLAB’s legend maximum
- Only several leading sites are identified
- Note that the best DET curve depends on which part of the plot one examines

## Common Test Condition

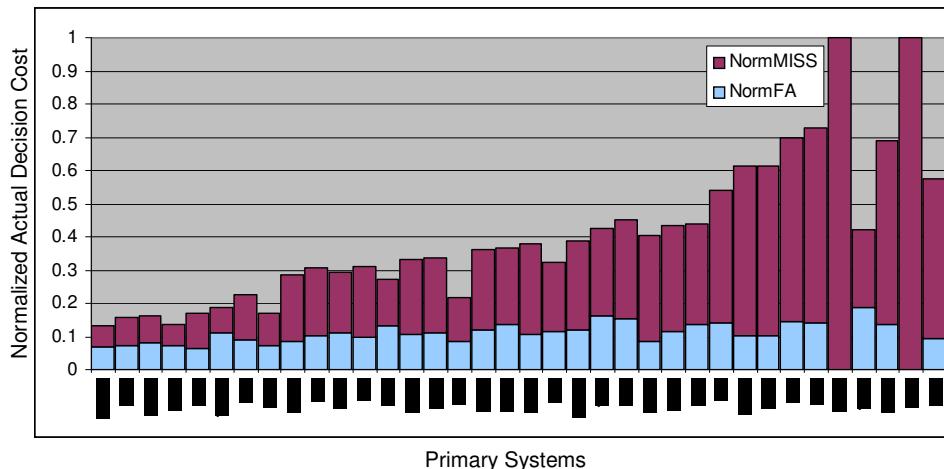
- Subset of the core test condition with restrictions
  - English only data for training and test
  - Pooled gender
- Treated as the official evaluation outcome

Targets			Non-Targets			
Trials (segs)	Speakers	Models	Trials (segs)	Model Speakers	Models	Segment Speakers
1854 (1691)	476	476	22159 (1862)	517	517	554

## Common Condition Actual Decision Costs

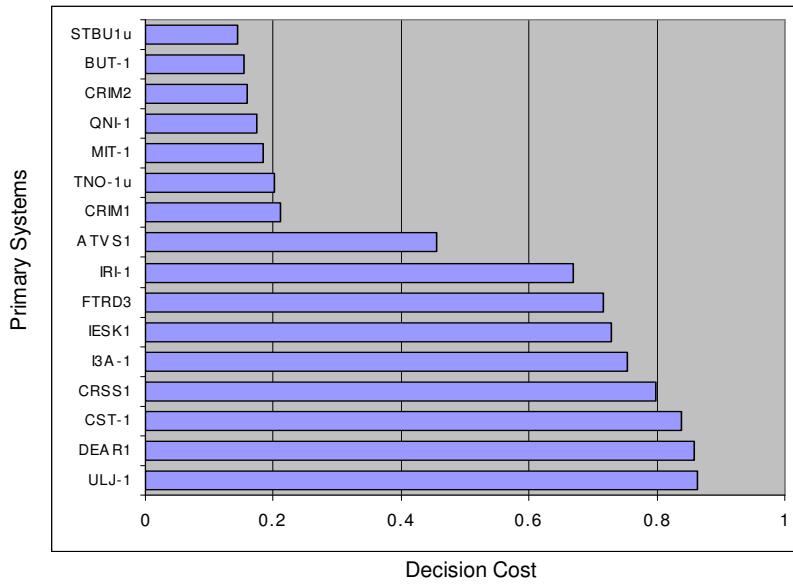


## Common Condition Minimum Decision Costs



- Systems ordered by increasing Actual Decision Cost (same order as in the previous slide)

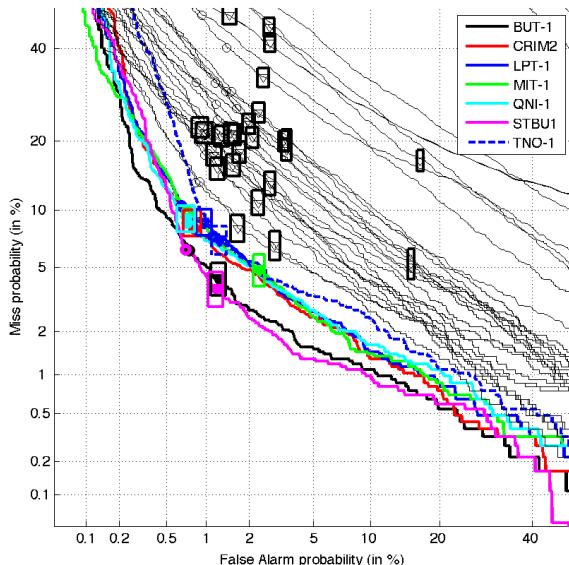
## Common Condition Cllr Scores



## Common Condition DET Plot

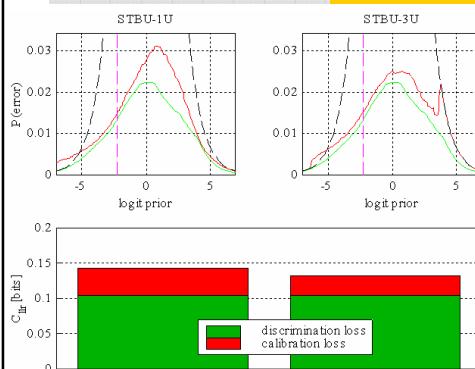
### 1conv4w-1conv4w, English only trials

COMPOSITE 2006 (1conv4w-1conv4w): DET 3 English Trials (Common Test) Primary Systems



- Most systems exhibit improved performance from the “All Trials” condition, but system ordering shows little change

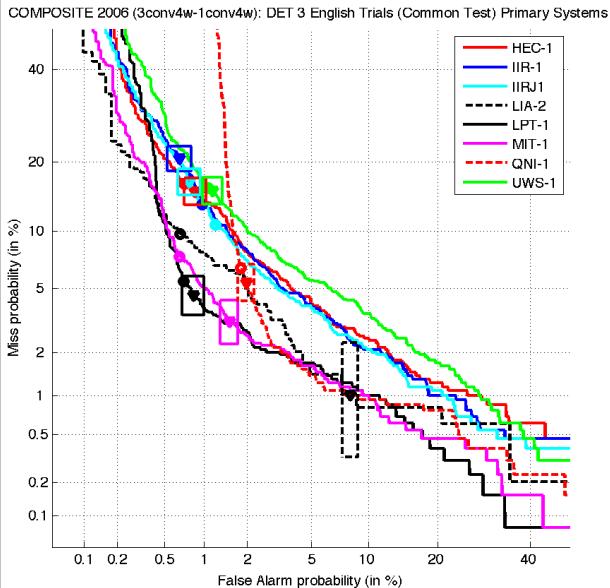
## APE Curves



- Red curve is for system as submitted, green for optimally calibrated one
- Bar graph heights are proportional to areas under curves
- Equal error rate corresponds to curve maxima, CDet to value at -2.29
- Thanks to Niko Brummer, who will explain APE curves further

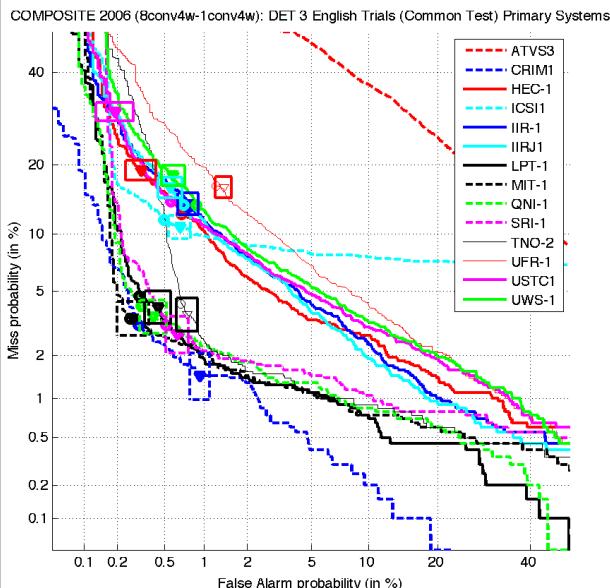
- Plot error rate against a range of  $llr$  values, where the error rate  $P_e$  is  $P_1 * P_{\text{miss}}(-r) + (1 - P_1) * P_{\text{fa}}(-r)$ ,  $P_1$  = probability corresponding to the  $llr$

## 3conv4w-1conv4w DET Plot (English only trials)



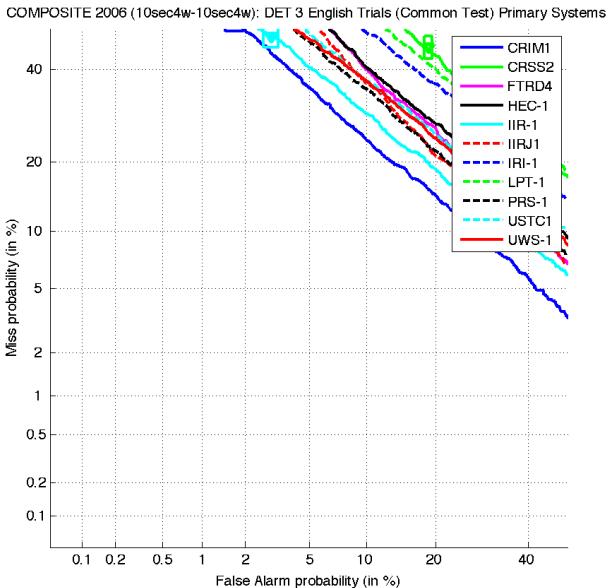
- 8 participants
- Four different systems contributed to the overall best DET

## 8conv4w-1conv4w DET Plot (English only trials)



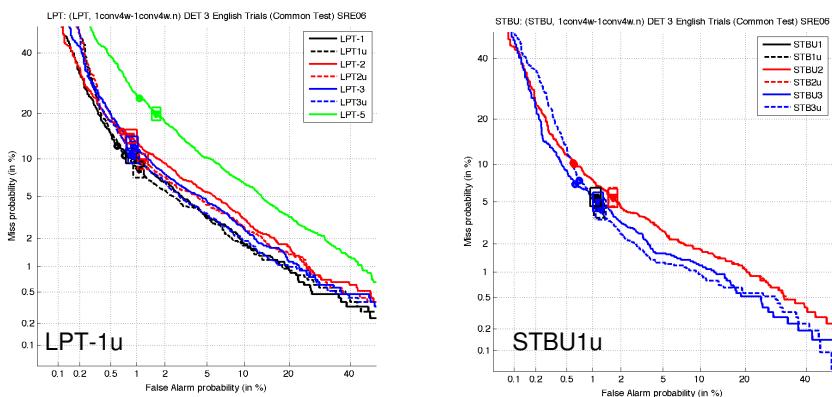
- 14 participants
- Condition with best overall performance (previously denoted extended data condition)
- CRIM and MIT contribute to best DET regions

## 10sec4w-10sec4w DET Plot (English only trials)



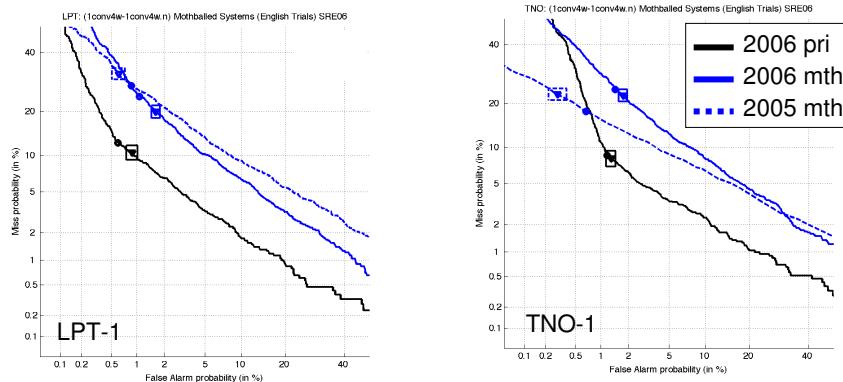
- 11 participants
- Difficult task, important for commercial applications
- Still plenty of room for improvement

## Unsupervised Adaptation



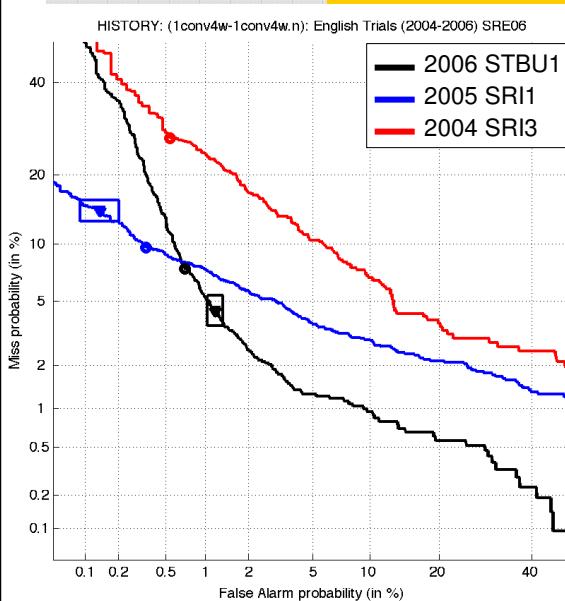
- LPT achieved some gains with unsupervised adaptation in the actual decision region
- Other sites had mixed results with gains only in some regions of the DET curve

# Mothballed Systems



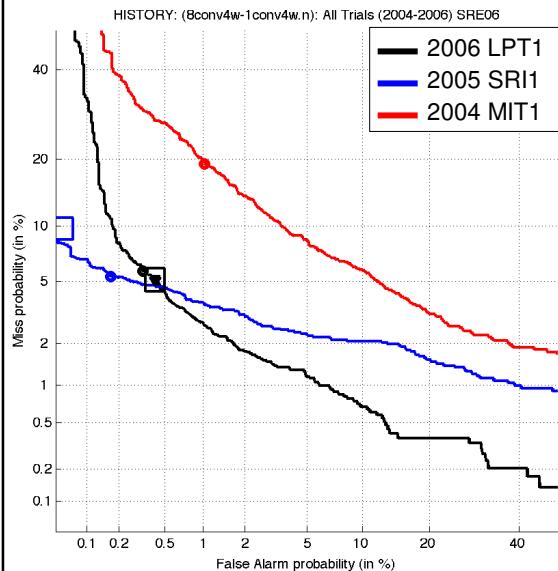
- LPT and TNO ran 2005 systems on 2006 data
- Plots show result on common condition (English only) trials
  - In both cases the 2005 and 2006 curves of the mothballed system intersect
  - 2006 test set appears to be no easier than 2005 in the upper left area
- Both sites had improved 2006 systems

# History – Common Condition



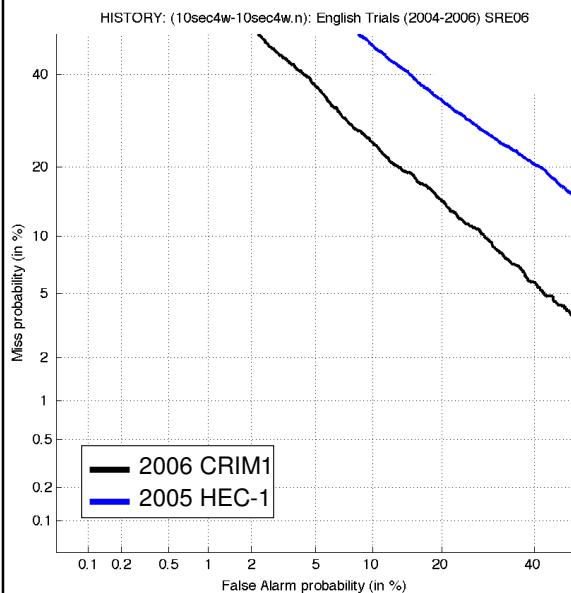
- Improvement in lower right part of the curve compared to 2005
- SRI had gentler slope in 2005
- As noted previously, the BUT curve (not shown) lies a bit below the STBU curve in the upper left part of the plot area

## History – 8conv4w Training all trials



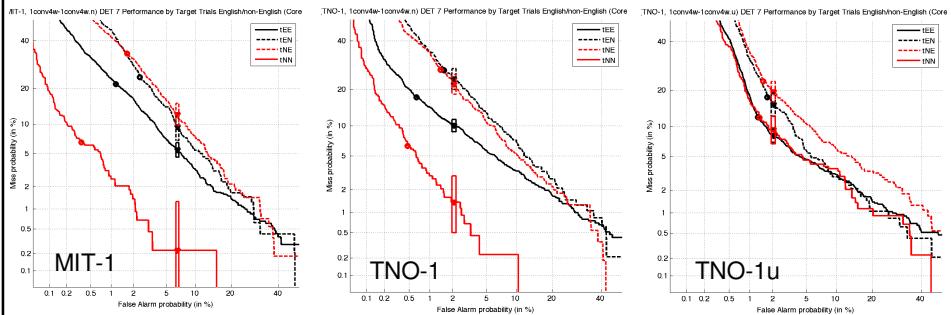
- Again 2006 had better performance on lower right but not upper left
- Also note that 2006 had more non-English trials than 2005

## History – 10-second Durations



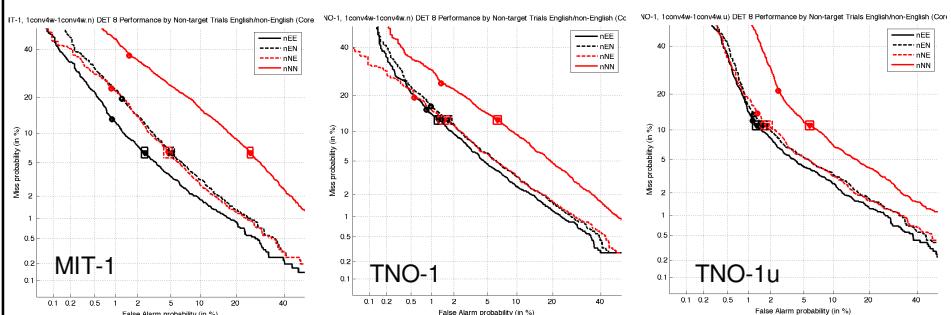
- Short training and test durations are important for many potential commercial applications
- Considerable improvement seen from 2005 to 2006

## Language Effects – Target Trials



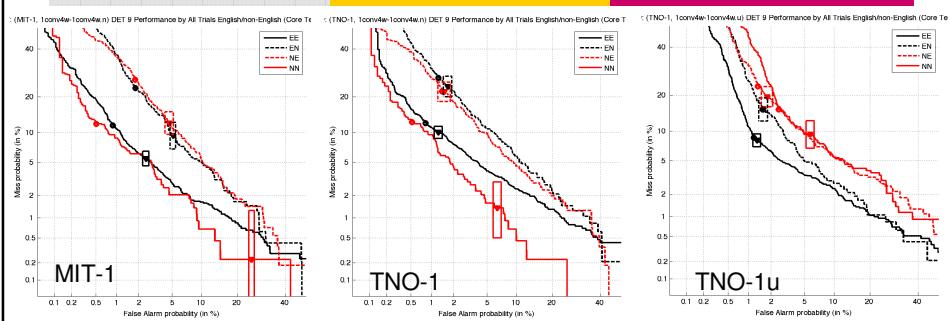
- Charts restrict target trials to four English/non-English train/test combinations, include all non-target trials
- Matched conditions give better performance, particularly non-English train and test
  - But unsupervised adaptation greatly limits this advantage, while helping a bit with English train, non-English test

## Language Effects – Non-Target Trials



- Charts restrict non-target trials to four English/non-English train/test combinations, include all target trials
- Here the matched non-English train/test condition performs worst
  - MIT unusual in doing rather better on matched English train/test condition than mixed conditions

## Language Effects – All Trials



- Charts restrict target and non-target trials to four English/non-English train/test combinations
- Putting both effects together, performance is best for matched conditions generally
- Unsupervised adaptation hurts matched non-English condition, but helps for English train, non-English test

## Summary

- Record number of participants
- Increased size and complexity of the evaluation has overloaded the infrastructure and led to the data problems this year noted previously
  - More time and effort needed to audit the data
- New scoring metric works well for sites providing likelihood ratios
  - Should such scores be further encouraged, or required?
- Some notable performance improvements