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Introduction

- I3A has submitted several systems to NIST SRE2010:
- core-core/coreext-coreext:
- 1 Fusion of JFA-SVM and JFA-LLR, both Gender Dependent (GD)
- 2 JFA-SVM Gender Dependent
- 3 JFA-LLR Gender Dependent
- \Rightarrow core-10sec/10sec-10sec:
- 1 Fusion of JFA-LLR and iVectors, both Gender Dependent
- 2 JFA-LLR Gender Dependent
- core-summed
- 1 JFA-LLR Gender Independent (GI)

Feature Extraction

- \Rightarrow 19 MFCC + C0 + Δ + $\Delta\Delta$
- ⇒ VAD comparing the Long-Term Spectral Divergence (LTSD) against a threshold.
- ☐ Crosstalk removal in phonecall using non target channel
- ☐ Interviewer removal using ASR labels
- ⇒ Short Time Gaussianization with a 3 seconds window.

Summed Channel Speaker Segmentation

- First Viterbi segmentation using 20 speaker factors, calculated using 12 MFCC and 256 Gaussians, as features and modeling each speaker with a Gaussian.
- Two Viterbi re-segmentations using 12 MFCC as features and modeling each speaker with a GMM.
- ⇒ Softclustering in the second re-segmentation.
- ⇒ Every output stream is short time Gaussianized separately.

Classification

- ⇒ 2048 GMM *UBM* trained on SRE04, SRE05, SRE06 telephone data.
- → *JFA* Hyperparameters:
- $\Box v$ (300 speaker factors), u_{phn} (100 channel factors) and d from tel data in SRE04, SRE05 and SRE06
- $\square u_{mic}$ (100 channel factors) from mic data in SRE05, SRE06 and 50 speakers from SRE08.
- \Rightarrow JFA-LLR
 - □ Speaker mean supervector given by the speaker factors (y,z) MAP estimates:

$$M_s = m_{UBM} + vy + dz (1)$$

□ Scoring is performed using first order Taylor approximation of the LLR:

$$LLR \approx (vy_{trn} + dz_{trn})^t \Sigma^{-1} (F_{tst} - N_{tst} ux_{tst})$$
(2)

- □ GD ZTNorm using telephone segments from SRE04,SRE05 and SRE06 (2363 male and 3318 female)
- \Rightarrow JFA-SVM
 - □ Enrollment and scoring is done by an SVM with the following kernel:

$$k(x_1, x_2) = (vy_1 + dz_1)^t \Sigma^{-1} (F_2 - N_2 u x_2) + (vy_2 + dz_2)^t \Sigma^{-1} (F_1 - N_1 u x_1)$$
(3)

GD SVM Background and ZTNorm using tel and mic segments from SRE04, SRE05, SRE06 and 50 speakers from SRE08 (4241 male and 5400 female)

$\Rightarrow iVectors$

- $\Box T$ (400 total variability factors), LDA (200 dimensions) and WCCN trained from telephone data in SRE04,SRE05 and SRE06.
- □ Scoring is done by Cosine distance between enrollment and testing iVectors
- □ GD ZTNorm using telephone segments from SRE04,SRE05 and SRE06 (2363 male and 3318 female)

Calibration and Fusion

Core-core

- → Calibration
- □ Dev trial list including most of the common conditions included in SRE2010.
- All training vs. all testing short, long and follow-up SRE08 English data keeping out the 50 speakers used in JFA training (4M male trials and 10M female trials).
- □ Calibration has been done by linear logistic regression using FoCal package.
- ☐ We do multiple condition calibration iteratively until convergence:
- 1 Gender dependent (male, female)
- 2 Channel dependent (mic-mic same channel, mic-mic different channel, mic-phn, phn-phn)
- 3 Length dependent (short-short, long-long, long-short, short-long)
- ⇒ Same/Different Microphone detection
- □ iVectors like system using mic channel factors as features.
- ☐ We train LDA (12 dimensions) and WCCN using SRE08 mic data from the 50 keep out speakers.
- ☐ The scores are normalized using SNorm and calibrated to provide a soft decision probability.
- ⇒ Fusion: The calibrated systems are channel dependent fused.

Non core-core

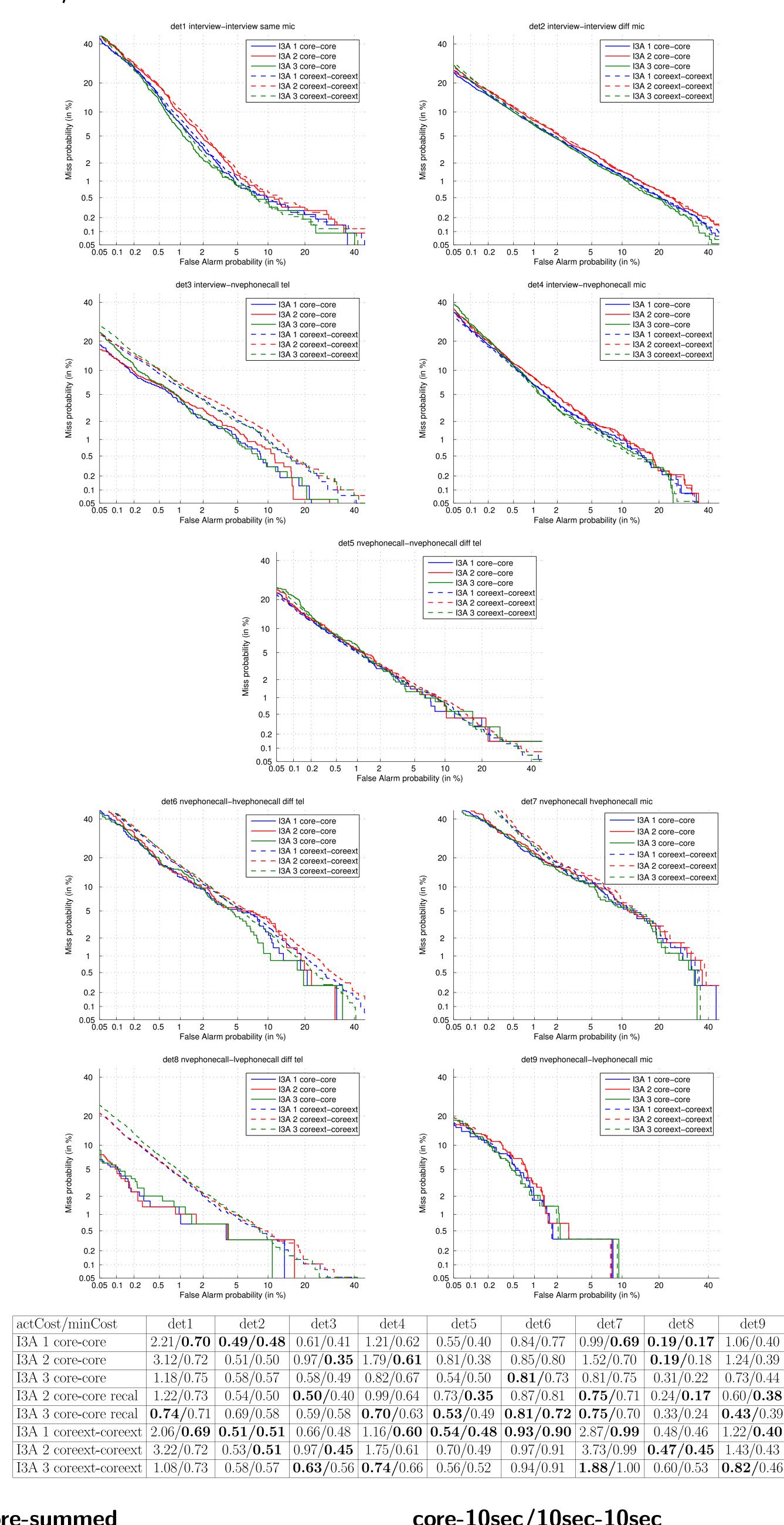
⇒ Gender dependent calibration and fusion using the det7 matching conditions of SRE08.

Acknowledgments

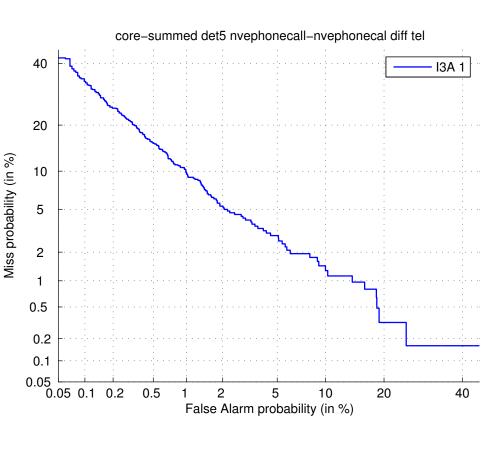
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Results

core-core/coreext-coreext



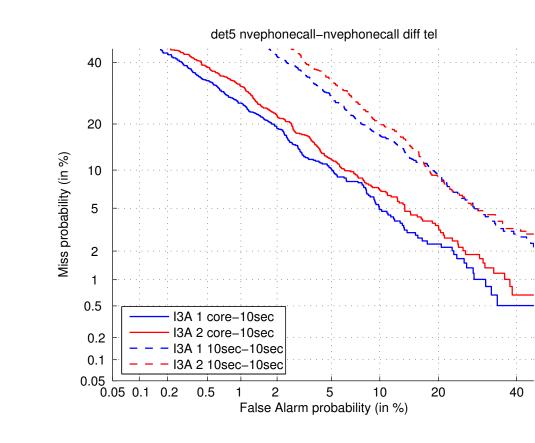
core-summed



actCost/minCost

I3A 1

core-10sec/10sec-10sec



actCost/minCost	det5 core-10sec	det5 10sec-10sec
I3A 1	0.36/0.35	0.64/0.61
I3A 2	0.40/0.39	0.69/0.66

Conclusions

- ⇒ We have built state of the art systems with good performance in most of the conditions
- ⇒ Especially good results for summed channel and 10sec conditions.

 $\det 5$

0.20/0.19

⇒ SVM system has better minDCF than LLR but it is more difficult to get a robust calibration.

 \Rightarrow Score shift between same/diff mic conditions difficults calibration \Rightarrow Need channel detector.

- Need of big number of non target trials without key errors for robust calibration in the new operating point.
- ☐ Improvement in actCost recalibrating after correcting SRE08 key errors.
- ⇒ High vocal effort speech degrades performance considerably.