Human Assisted Speaker Recognition (HASR) in NIST SRE10

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Introduction

How can human experts effectively utilize automatic speaker recognition technology?

*Much discussed .. little tested*

- SRE10 included HASR \( (Human\ Assisted\ Speaker\ Recognition) \) tests to begin addressing this question – a pilot test

  The HASR Task: Given two different speech segments determine whether they are both spoken by the same speaker

- HASR included a subset of trials from the SRE10 core test
  - HASR1 – 15 trials & HASR2 – 150 trials

- HASR implies human listening to assist in making a decision
  - System descriptions provided to describe processing techniques

- Participation open to all who might be interested, ranging from “experts” to “naïve” listeners
Preliminary Experiment

• A preliminary experiment was designed to test protocols for a proposed HASR study

• Identified confusable speaker pairs from SRE08
  – Used results from the full matrix runs of 150 speakers
  – Automatic systems identified speaker pairs (using ROVER)
    • 47 pairs found with multiple system errors
  – Listened to interview sessions of all these pairs
    • Selected 10 pairs as most difficult to distinguish

• (8) Non-target trials were selected from these 10 pairs

• (7) Target trials were selected from among the speakers included in the 47 identified pairs
  – Selected target trials whose two segments sounded most different

• Subject lavalier channel used in all cases
Preliminary Experiment (cont’d)

• 14 human evaluators listened to these trials
  – Volunteers involved in the project (Gov./Data providers)
  – Permitted unrestricted listening to both train and test

• Evaluators provided
  – Actual decision (required)
  – A confidence score (optional)
Correct and incorrect decisions over all evaluators
- Overall miss rate > 18%
- Overall false alarm rate > 36%

Some trials were very challenging
- (3) had more errors than correct decisions
- (3) others had more than 1/3 errors
- Only (1) target and (1) non-target trial had no errors
Preliminary Experiment – Results

Errors by Evaluator

• Shows FA’s (solid red) and misses (outline) for each evaluator
  – All had FA errors
  – Half had total error rate of 1/3 or more

• Most trials proved quite challenging
• Experiment supported the idea a meaningful HASR test could be created with as few as 15 trials
  – Several potential sites were reluctant to do more
  – Limited statistical significance recognized
  – Decided to have both 15 trial (HASR1) and 150 trial (HASR2) tests
The SRE10 HASR Evaluation
HASR Protocols

- Trials consist of “training” and “test” speech segments
- Trials to be processed separately and independently
  
  \[ \text{Humans memory makes this difficult} \]
  
  - Automated email used to submit each trial’s output before next trial was accessible
  - Unlimited listening (in whatever order) permitted for training and test data
- Human listeners could be one person or a panel
- A decision and a likelihood score were required for each trial
- Decisions could be made from:
  - A combination of automatic processing and human expertise, or
  - Solely based on human listening
- Scoring
  - Count number of Misses and False Alarms
Trial Selection - HASR1  (15 Trials)

- Sought “difficult” cross-channel trials from the Mixer 6 Corpus
  - Training data from interviews included various room mic channels
  - Test data from phone calls included some with high or low vocal effort
- An automatic system* processed the “full matrix” of trials

**Non-target Speaker Pairs**: Ran full matrix of possible interview-train, interview-test non-target trials over all speaker pairs
37 speaker pairs identified using a threshold of 6 scores (of 9 possible) in the top 1% of scores for trials run against the specific target

**Non-Target trials**: Listened to all potential interview-train/phone-call-test trials for each pair
9 such trials judged most similar were selected

**Target trials**: Ran full matrix of potential interview-train/phone-call-test target trials over all speakers
30 such trials with lowest scores were selected and listened to, and the 6 such trials judged most dissimilar were selected

* Thanks! to Howard Lei at ICSI for assisting us with processing the full matrix of trials
Trial Selection - HASR2

• HASR1 trials were the first 15 HASR2 trials
• Speaker pairs selected as in HASR1, except that:
  – A threshold of 4 high scores was used (rather than 6)
  – Specific trial segments were then chosen at random for the 90 same-sex speaker pairs selected
• 45 low scoring target trials selected from the “full matrix” run
  – Human listening eliminated all trials with anomalous segments
HASR Participation

- 20 systems from 15 sites for HASR1
- 8 systems from 6 sites HASR2
- Most sites also participated in the main SRE10 evaluation
- Academic and government organizations from six countries participated
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**KEY**

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**Number of Errors**

|        | 8 | 14 | 8 | 8 | 11 | 11 | 7 | 9 | 2 | 15 | 7 | 8 | 4 | 13 | 46 | 87 | 133 |
### HASR2 Participants & Results Summary

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Correct and Incorrect Decisions Across All Participating Systems

15 HASR1 Trials – 20 Systems
- Cumulative Miss Rate ≈ 38%
- Cumulative FA Rate ≈ 47%

135 Other HASR2 Trials – 8 Systems
- Cumulative Miss Rate ≈ 35%
- Cumulative FA Rate ≈ 41%
Correct and Incorrect Decisions
Across All Participating Systems

15 HASR1 Trials – 8 Systems
- Cumulative Miss Rate ≈ 38%
- Cumulative FA Rate ≈ 69%

135 Other HASR2 Trials – 8 Systems
- Cumulative Miss Rate ≈ 35%
- Cumulative FA Rate ≈ 41%
HASR2 Systems
HASR1/HASR2 DET Points
Red dots represent decision points (on DET plot) of HASR1 systems. Note that extreme points represent systems tuned to different tradeoffs between miss and FA rates. Leading automatic systems’ DETs compare favorably with HASR decision points on HASR1 trials.
HASR2 and **Leading** SRE10 Automatic Systems

- 135 HASR2 trials
- Six HASR systems (thin lines)  
  *one system = decision only*
- Six Automatic systems (thick lines)
HASR2 and Corresponding Automatic Systems

- 135 HASR2 trials
- Five HASR systems (thin lines)
- Five Corresponding Automatic systems (thick lines)
Summary

• Effort to select challenging HASR trials was successful
  – HASR2 trials only somewhat less challenging than HASR1 trials

• Performance of HASR systems did not compare favorably with that of automatic systems on HASR trials

• If HASR evaluation is deemed valuable, how should this pilot be extended?
  – Test protocol?
  – Trial selection?
  – Statistical significance?