

# WP4: Joint Bi-Modal Authentication and Model Adaptation

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Presented by John Haddon



**MOBIO Review Meeting, Sep.16-17, 2009**

**EyePmedia – 1020 Renens**

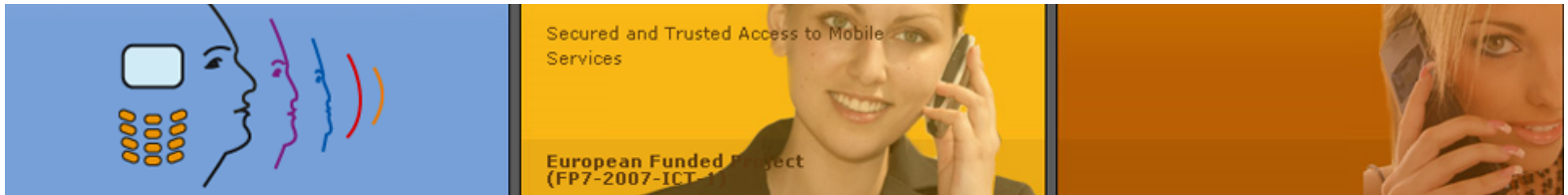


**MOBIO - Mobile Biometry**

Secured and Trusted Access to Mobile Services

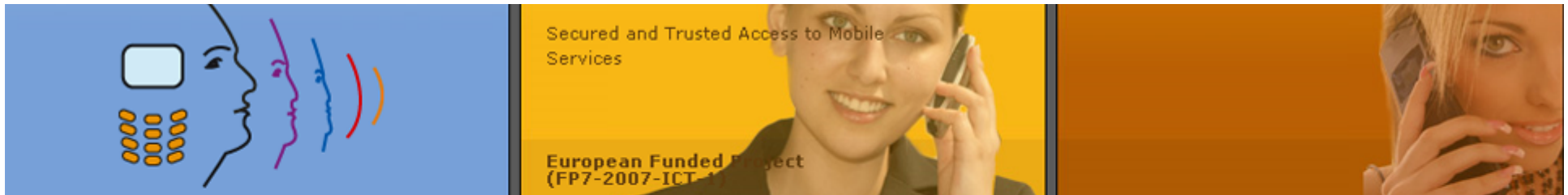
European Funded Project  
(FP7-2007-ICT-1)

**Be on the vibes**



# Project management

- Overview
  - develop novel joint face and speaker authentication techniques and to investigate model adaptation techniques
- Project Status:
  - Delivered:
    - D4.1 & D4.2: Baseline Bimodal Authentication
    - D4.5 & D4.6: Baseline Model Adaptation Systems
  - To complete
    - D4.3 & D4.4: Advanced Bimodal Authentication
    - D4.7 & D4.8: Advanced Model Adaptation Systems
    - Both on m30



## D4.1 & D4.2: Baseline Bimodal Authentication

### BANCA Bimodal Database

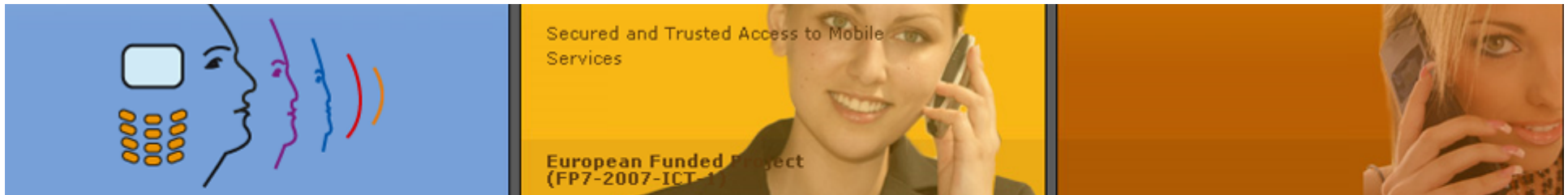


(a) Controlled

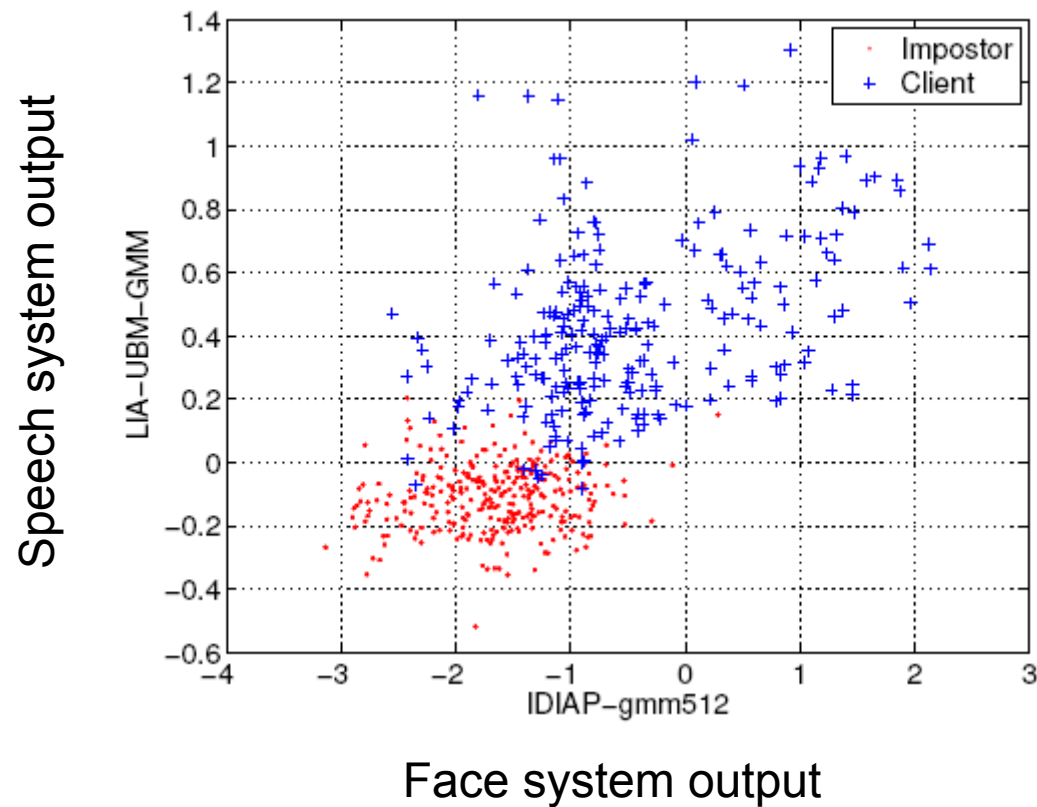
(b) Adverse

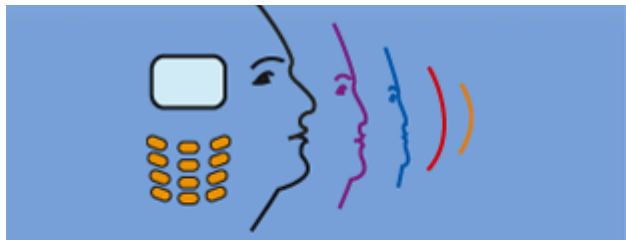
(c) Degraded

- Controlled – good lighting/exposure, clean background.
- Adverse – ‘natural’ setting, cluttered background etc.
- Degraded – as adverse but with lower quality camera, eg. Webcam.



# Combination of face and speech scores



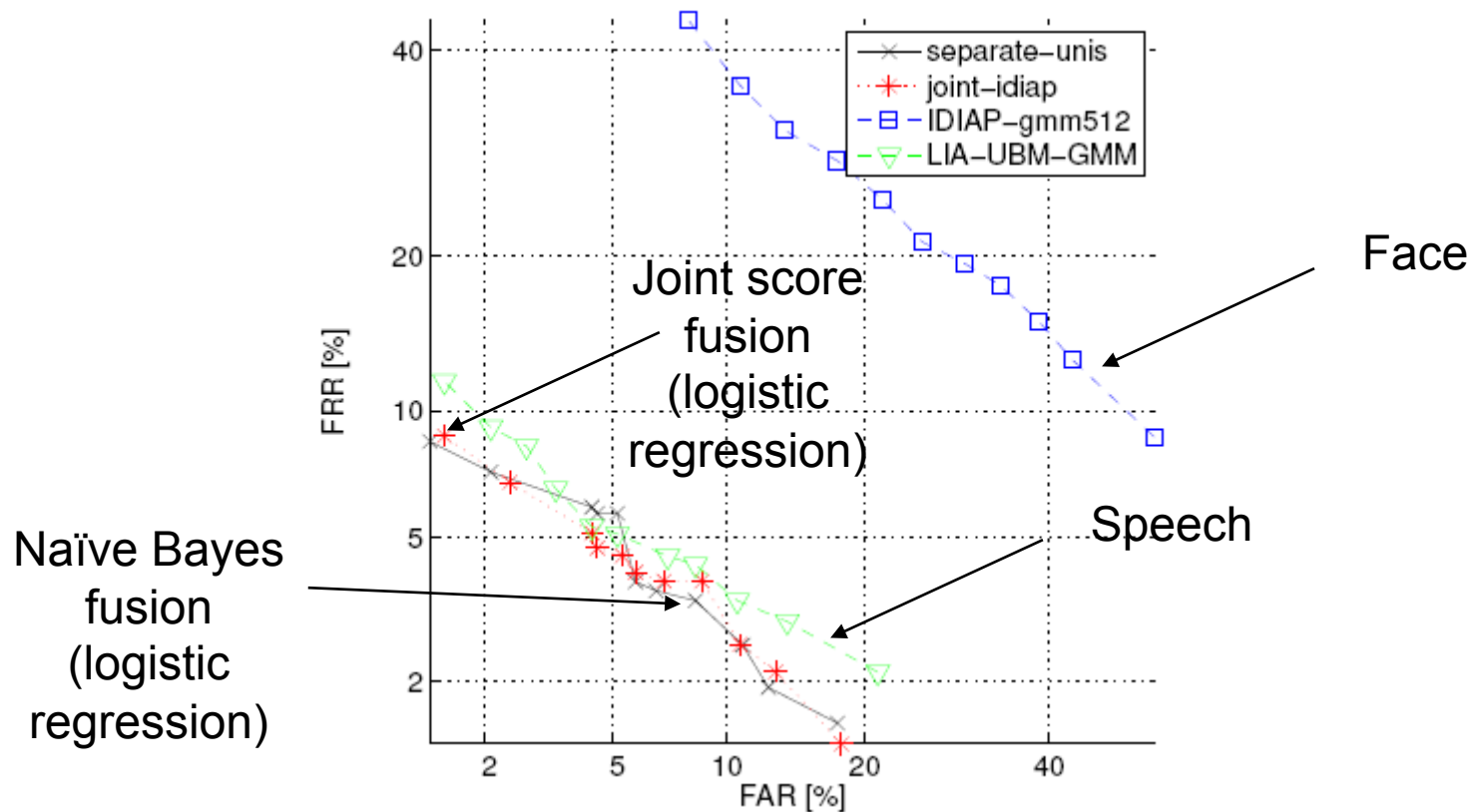


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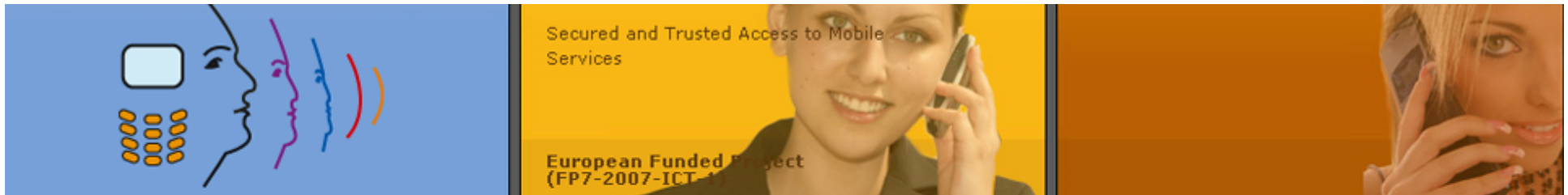
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# Results



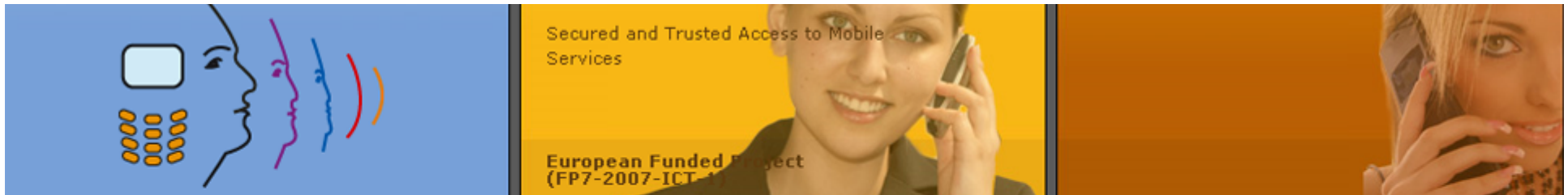
The combined system is better than any single modality



## D4.5 & D4.6: Baseline Model Adaptation Systems

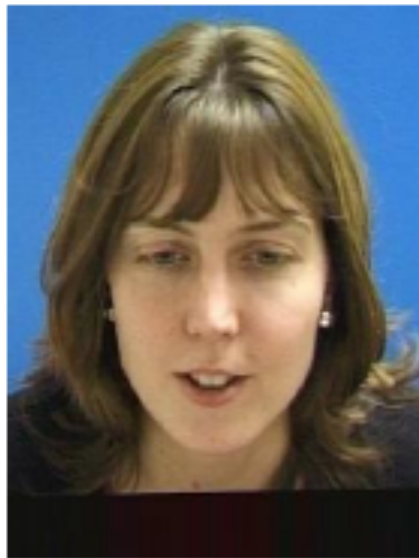
- Objective: Adaptive systems
  - To guard against the change of the quality of biometric samples, in particular, as a result of changing
    - acquisition environment
    - acquisition devices
      - i.e., matching between enrollment and query samples collected using different devices
- Two types of adaptation:
  - Model-level adaptation
    - Supervised adaptation (reference model contains the test conditions)
  - Score-level adaptation
    - Unsupervised (reference model was built in controlled conditions only)
    - Relying on additional operational data (made available at the training phase)





# The Three Conditions (Recall)

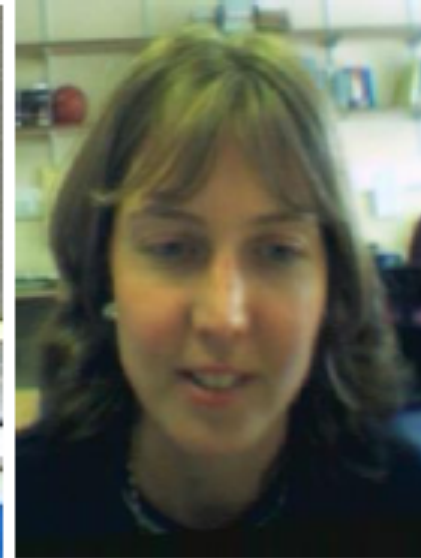
## BANCA Bimodal Database



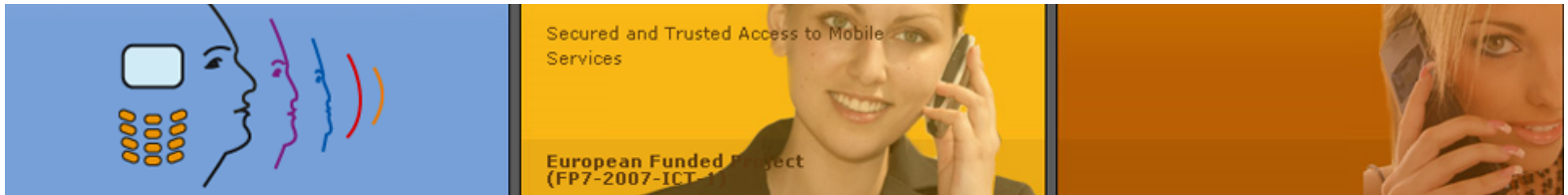
(a) Controlled



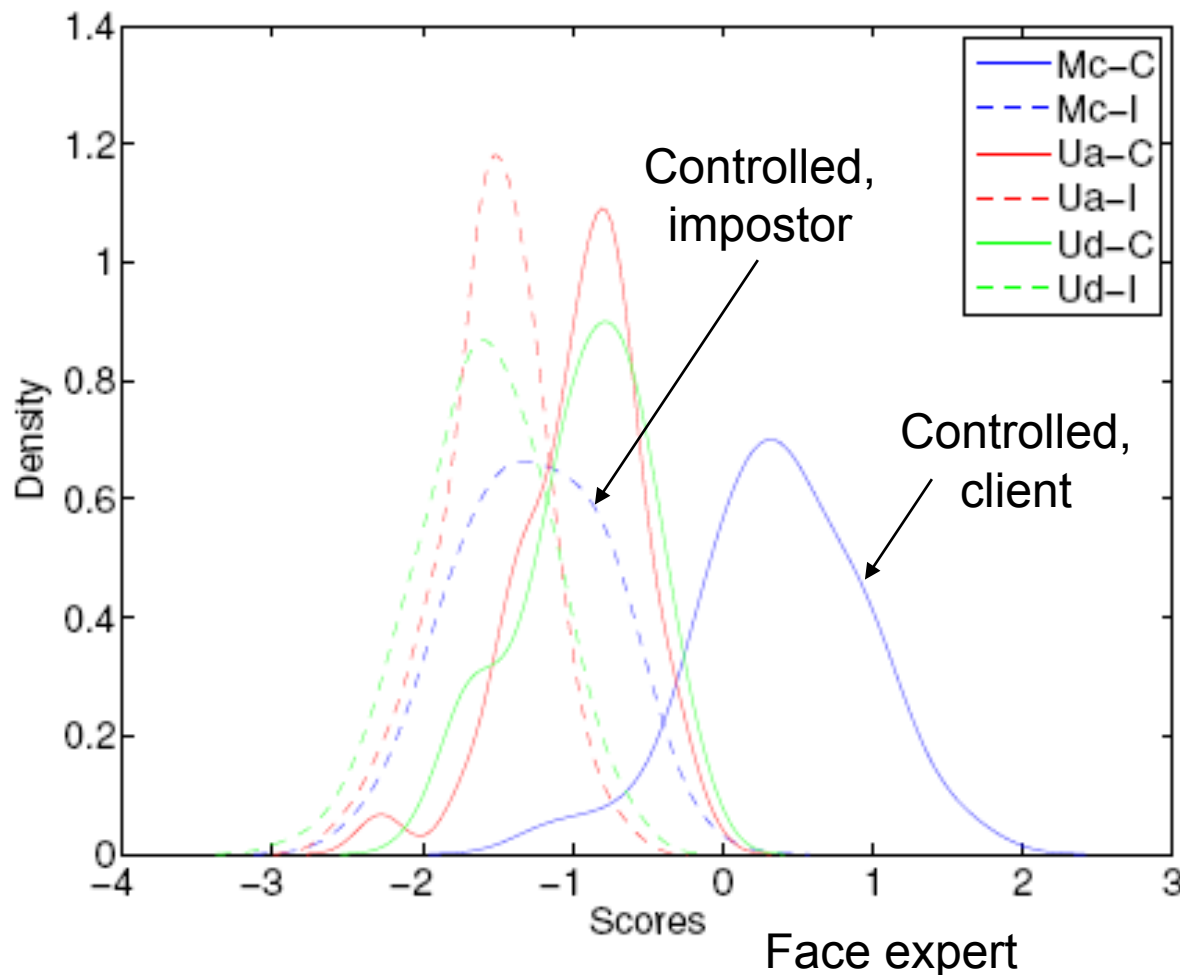
(b) Adverse



(c) Degraded



# Condition-Dependent Distributions (Image)



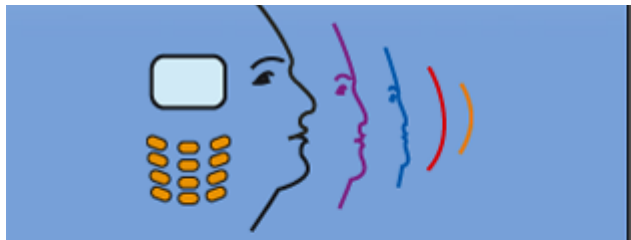
Controlled      Solid:      client  
                          Dashed:      Imposter

Adverse

Degraded

- The controlled client (solid blue) and imposter (dashed) curves are better separated than other pairs.
- Degradation and adverse conditions reduce the client/imposter separation.
- Imposter curves change a little as imaging conditions change.



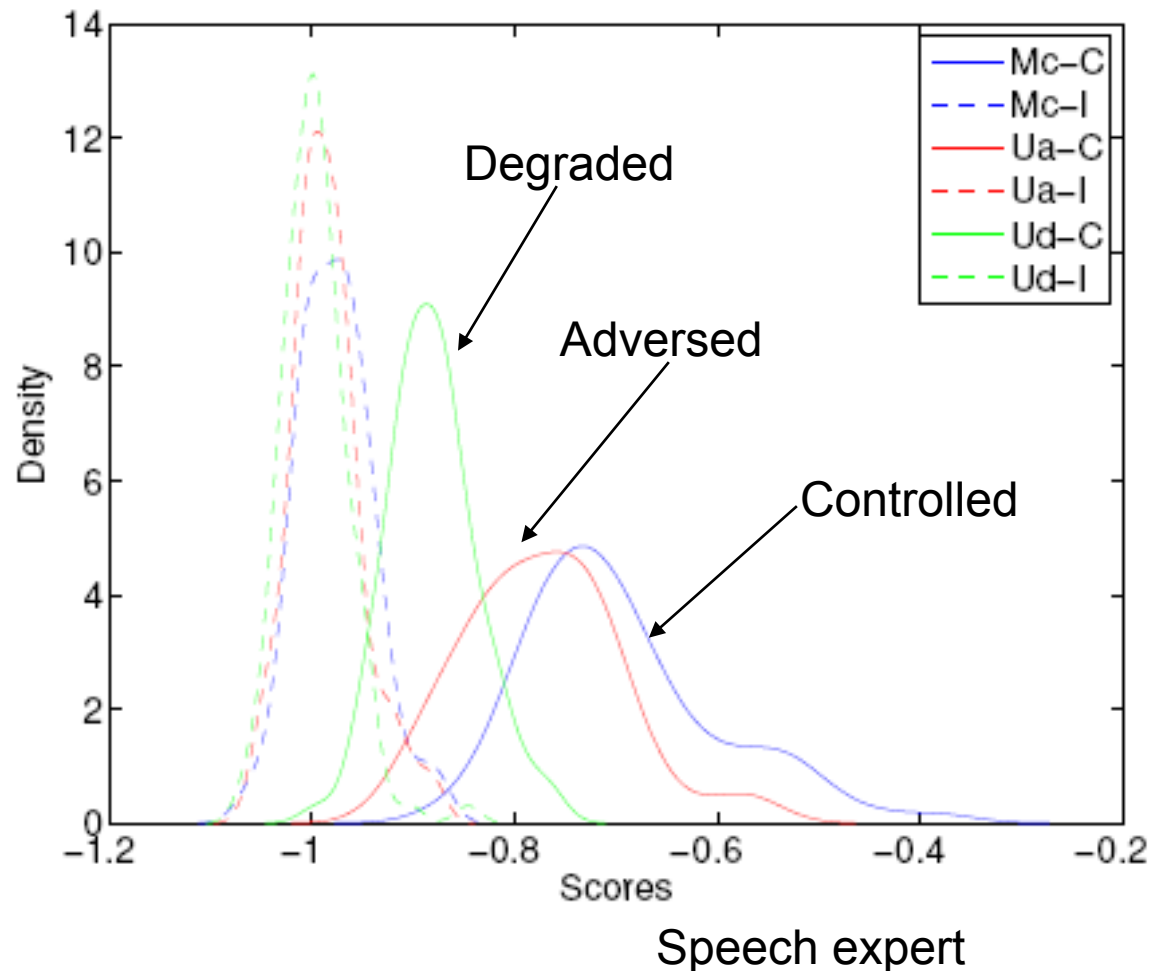


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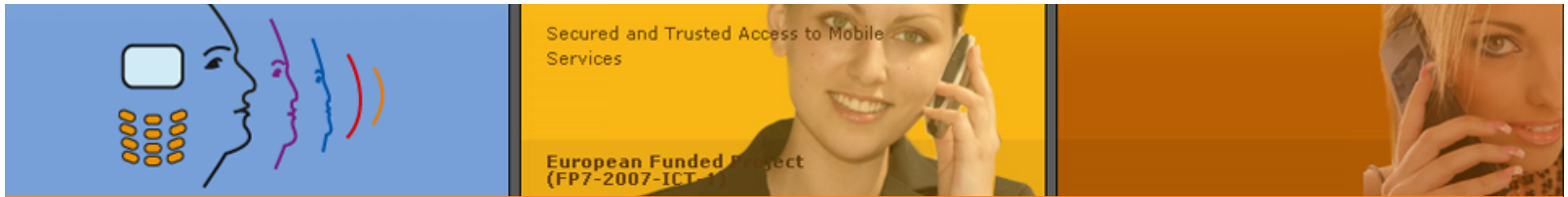
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# Condition-Dependent Distributions (Sound)



- As recording conditions change (to adverse and then degraded), the client likelihood scores decrease in value, moving closer to the impostor scores.
- Imposter scores do not change in line with recording conditions.
- Leads to graceful degradation in performance.



# Score adaptation strategy

- Intuitively, one applies a normalization for each condition.
- Formally, we applied logistic regression as a normalization procedure:

$$P(\mathbf{G}|y, Q) = \frac{1}{1 + \exp(-(g_Q(y)))}$$

where  $g_Q(y) = w_1^{(Q)}y + w_0^{(Q)}$

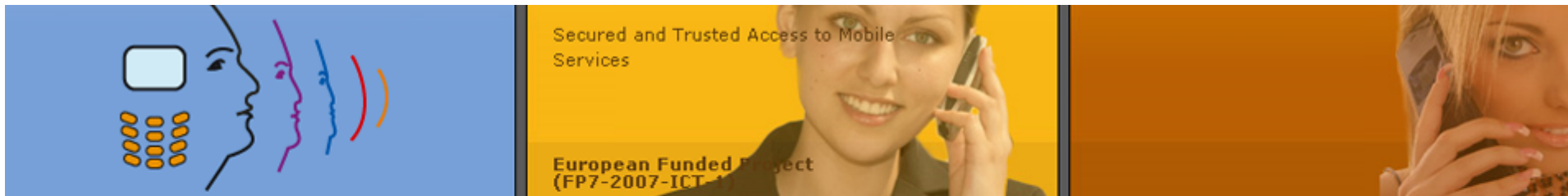
Scaling factorshift

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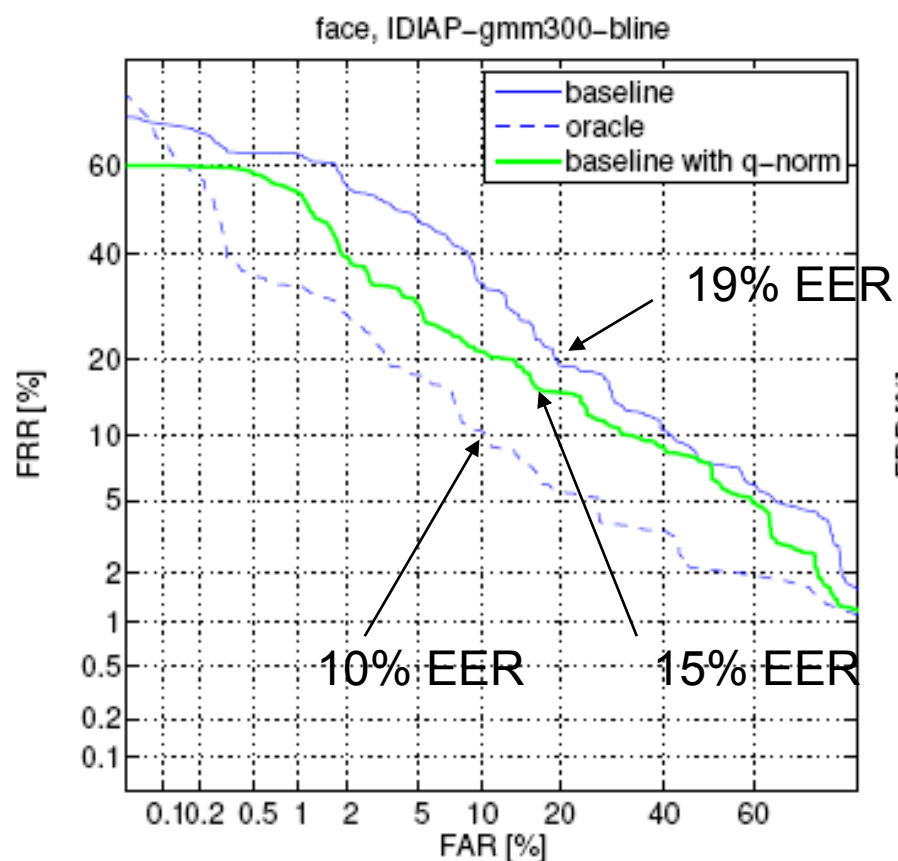
Both are dependent on the condition,  $Q$

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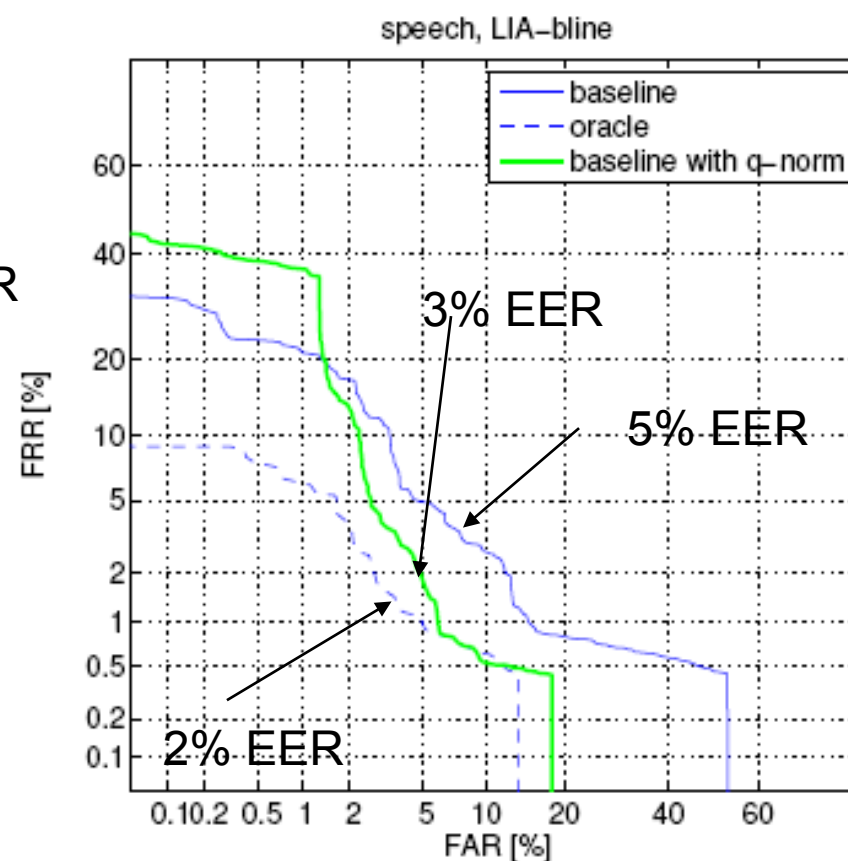
Can extend to unknown condition easily:  $P(\mathbf{G}|y, q) = \sum_Q p(\mathbf{G}|y, Q)P(Q|q)$



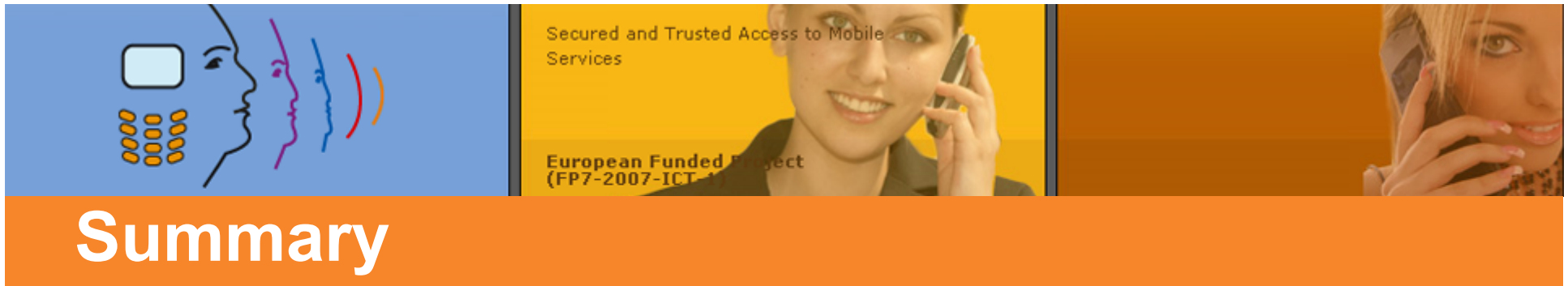
# Results



(a) Face

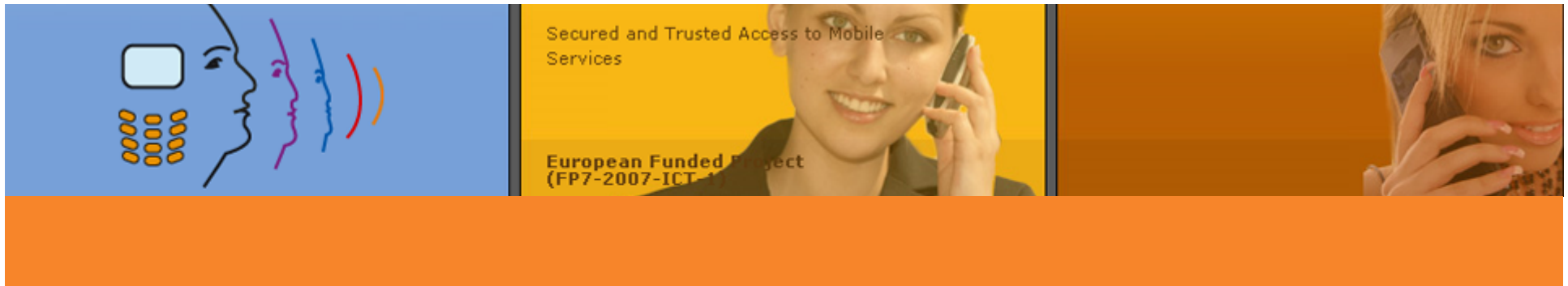


(b) Speech



# Summary

- Supervised model adaptation performs the best
  - But this is the most optimistic scenario
    - Not achievable in practice
- Score-level adaptation is promising
  - Baseline models unchanged
  - Only requires operational data
  - In an experimental setting, the acquisition conditions are known; for unknown conditions, they can be inferred probabilistically (extension)



**Thank you for your attention**