

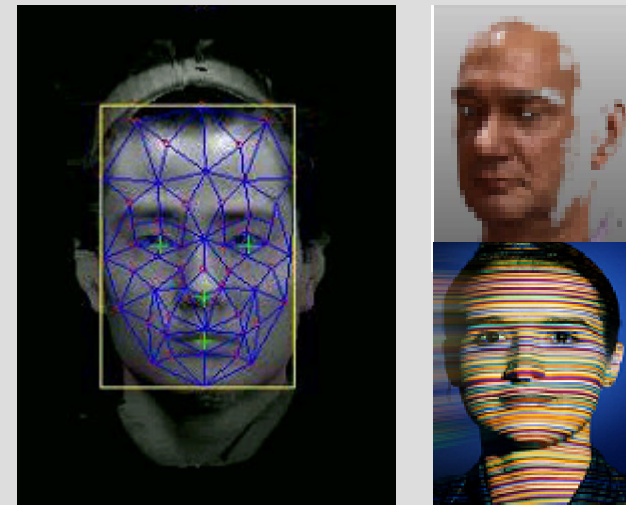
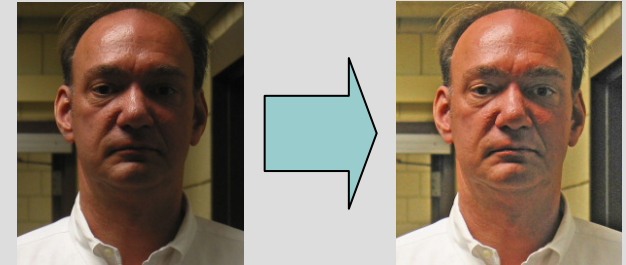
Systematic Analysis of Facial Recognition Improvements in Multiple FRGC Challenges

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Viisage Technology

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Outline

- **Scanner Characteristics & Illumination Correction**
- **3D Face Recognition**
- **High Resolution Data**
- **Overview to all Challenges**
- **Conclusions & Outlook**
- **References**





→ **Scanner Characteristics & Illumination Correction**

Image Preprocessing

Color Conversation (Minolta Scanner)

Observations

- R, G, B, and 3D scan not recorded at same time resulting in motion artifacts (e.g. pose correction)
- G, B rather dark

Corrective Actions

- Modification of standard RGB to grey conversion, i.e. only use of R channel
- Application of illumination correction algorithms
- Mixed dataset experiments (Exp. 5 & 6) must be handled separately

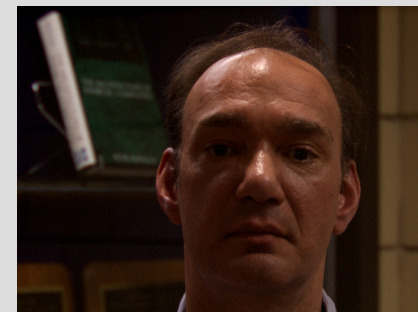


Image Preprocessing - Results

Results

- Exp. 3t: Accuracy on single channels – R>G>B
- Exp. 5: Some overexposure on red channel of **controlled** dataset, R only is worse than RGB to grey conversion $[(2R+7G+1B)/10]$
- Exp. 6: Underexposure in all channels of **uncontrolled** dataset, R better than RGB to grey conversion $[(2R+7G+1B)/10]$

	$(2R+7G+1B)/10$	R	G
Experiment 3	-	1.2% / 96.7%	2.7% / 92.4%
Experiment 5	4.2% / 79.3%	4.1% / 76.5%	-

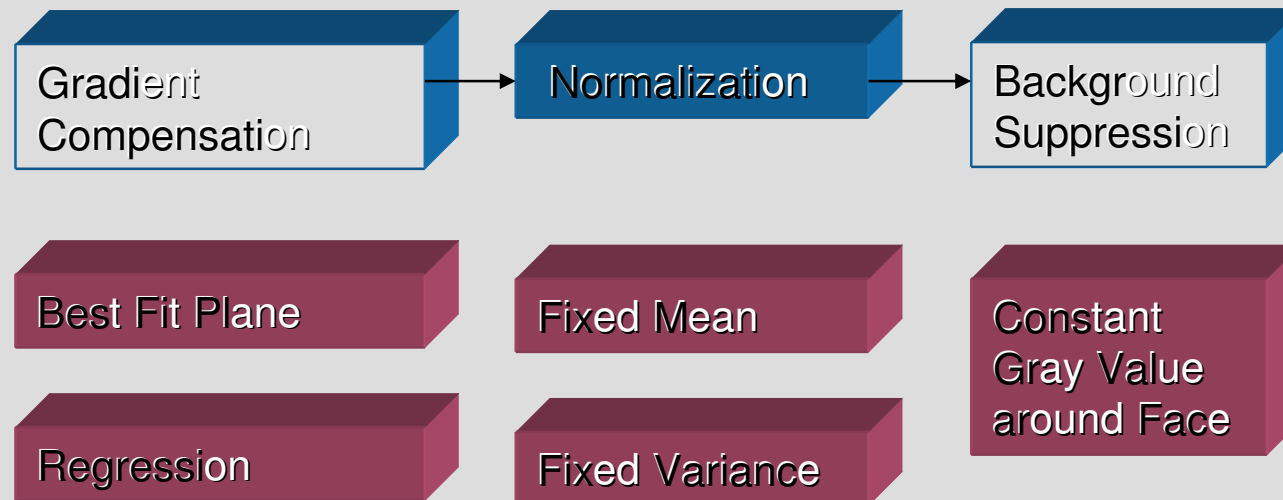
* EER / Verification@FAR 0.1%



Illumination Correction (I)

Regression Over Grey Level Values in Facial Area

- Symmetry assumption, compensates for the slant of the regression plane
- Standardized image to fixed mean value and fixed variance



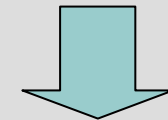
Illumination Correction (II)

Neighborhood Dependent Approaches

- Cooperation with Prof. Vijayan Asari, Old Dominion University
- Two approaches evaluated and optimized
 - HPSRR [Asari, Seow, 2004]
 - INDANE [Tao, Asari, 2004]

Experimental Setup

- Subset of FRGC Experiment 4
 - Gallery: 466 controlled images
 - Probe: 958 uncontrolled images
 - Training: 400 controlled, 400 uncontrolled images



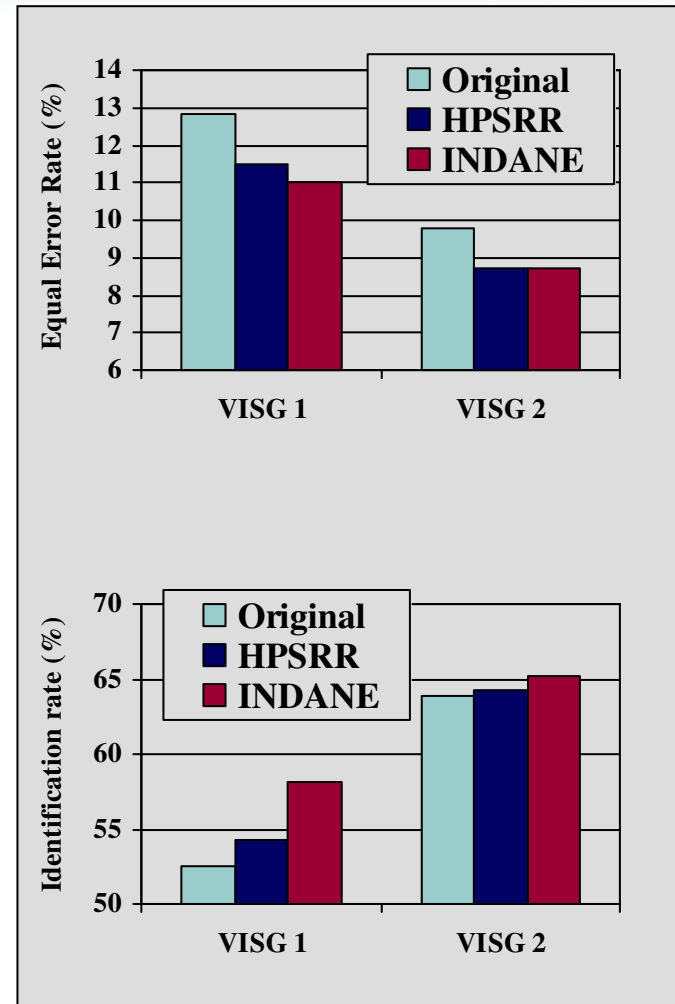
Experiments & Results

➤ Evaluation Methods

- Two different recognition engines
- VISG 1: FaceTOOLS 3.2 (2004)
- VISG 2: Viisage's Lab engine (2004)
- Enhanced images are used as input to recognition engine
- Verification and identification scenario

➤ Results

- Both illumination correction methods improves Viisage's FR accuracy
- INDANE better than HPSRR (HPSRR annihilates small features)
- Improvement higher with VISG1 (VISG2 already contains regression based illumination correction)





→ **3D Facial Recognition**

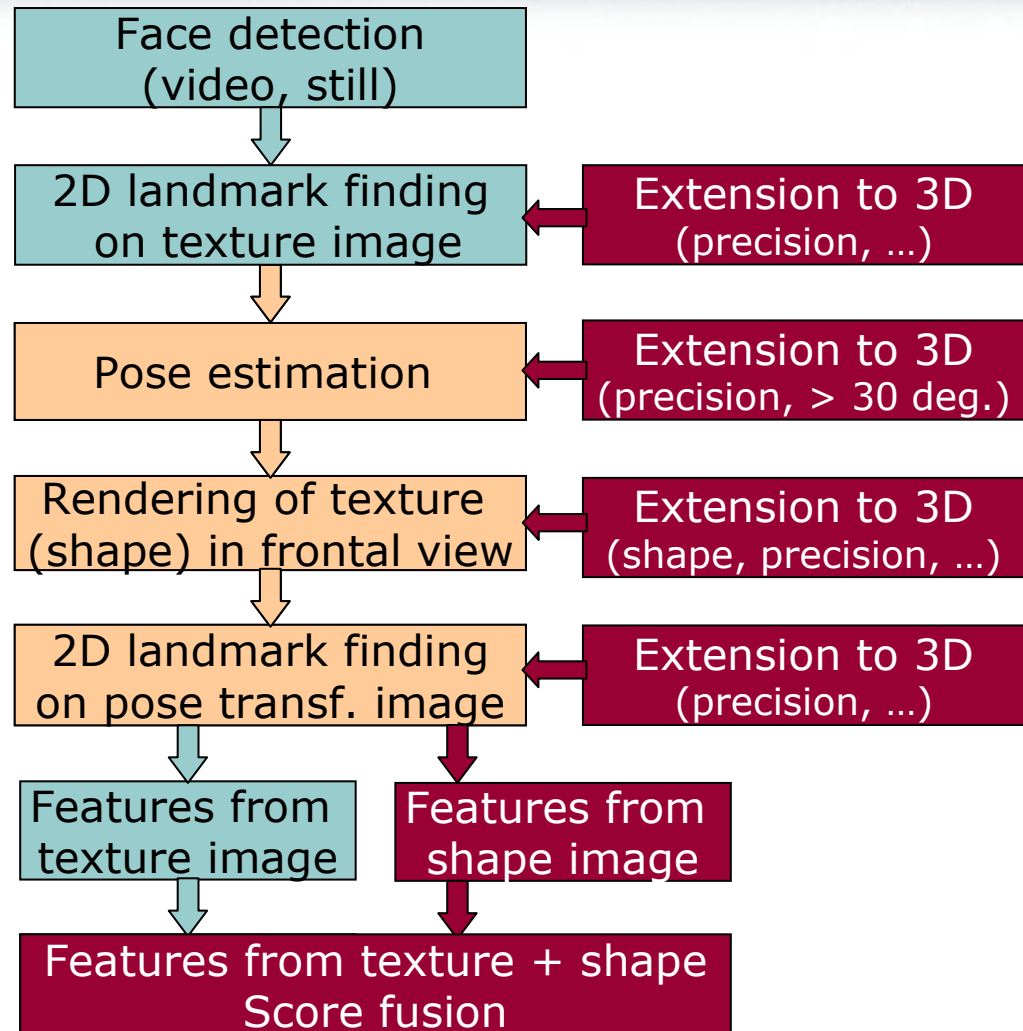
Fusion Strategies for 2D/3D Algorithms

Fusion on algorithmic level

- Landmark finding (2D, 3D)
- Pose estimation (2D, 3D)
- Pose correction (2D, 3D)
- ...

Fusion on score level

- Shape and texture yield independent scores and quality (confidence)
- Fusion of scores



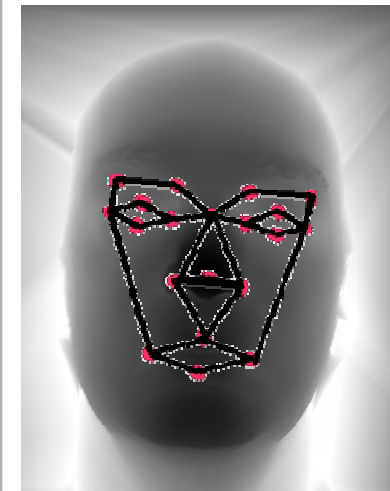
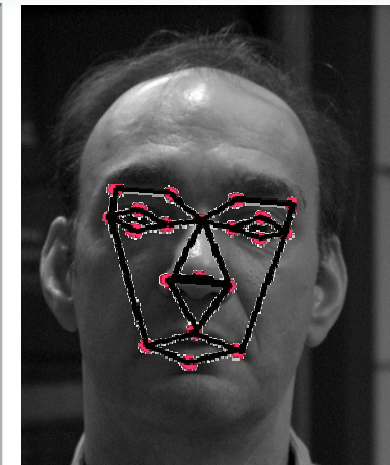
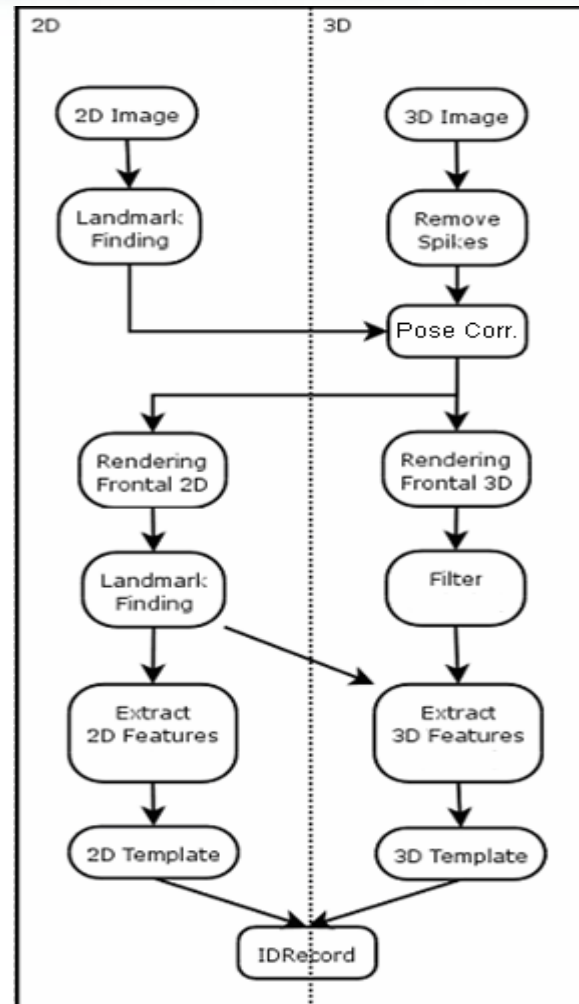
Viisage's 3D Approach (DICAR)

Foundation – HGM

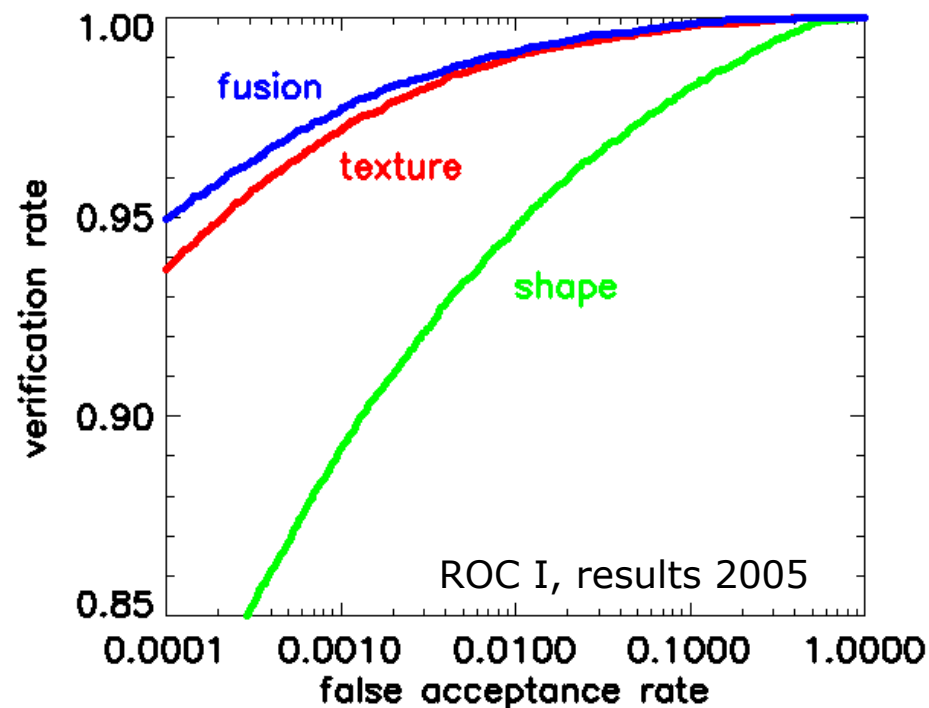
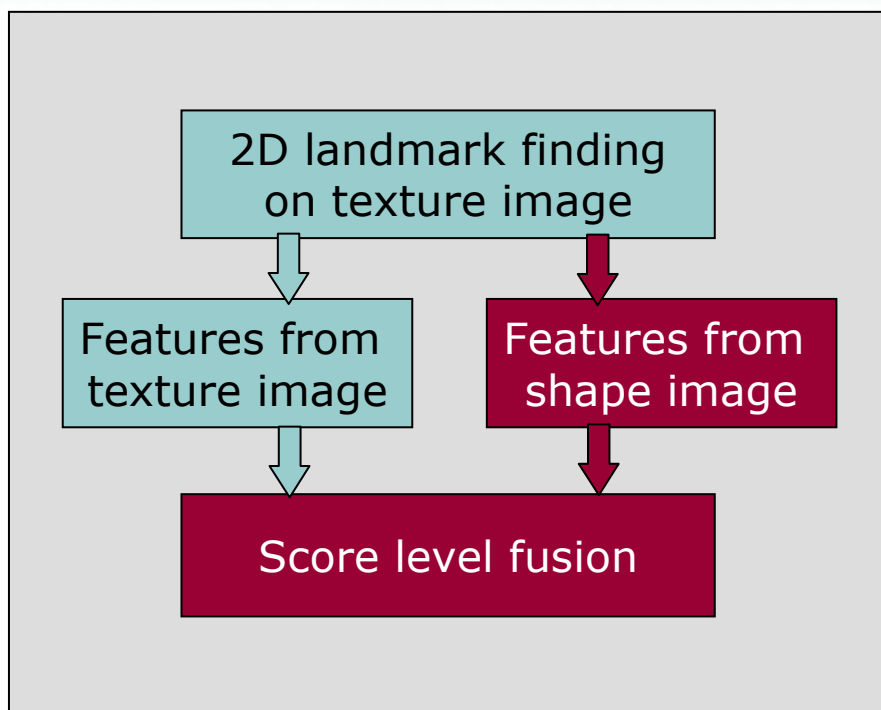
- Graph is automatically located to landmarks
- Optimized features are extracted at the landmark positions -> facial template
- Correlation in feature space determines the similarity between faces

Extension to 3D

- Extension from texture to depth images
- Additional feature extraction on surface data
- Fusion of texture and shape results on score level

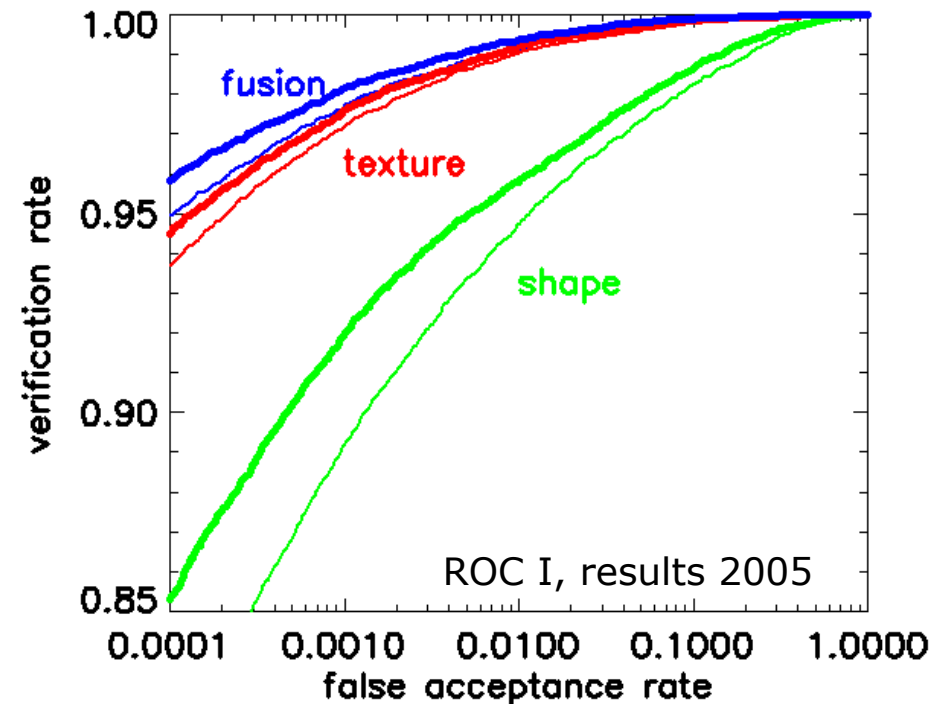
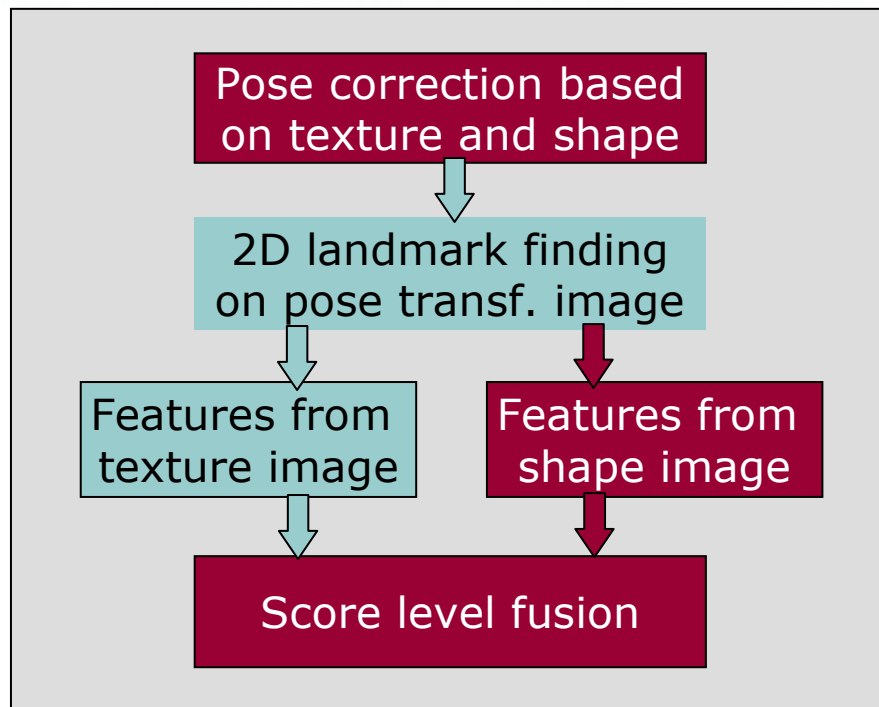


Results of Score Fusion



- Texture strongly outperforms shape, even in spite of unbalanced illumination
- Score level fusion yields the best results

Fusion of Algorithms and Scores

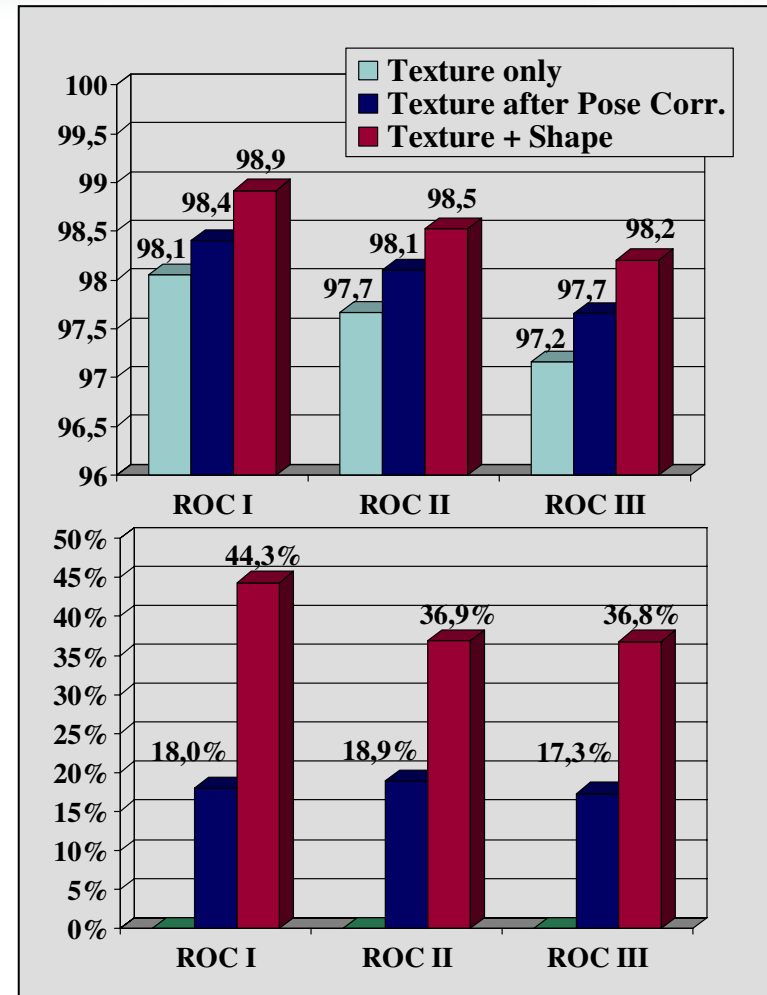


- Pose correction yields further improvement in both modalities and after fusion

3D Results on Actual Engine

Results of 2005 are confirmed

- 2D HGM engine only performs at level of 97–98% correct verification rate @ FAR of 0.1%
- Pose correction using 3D shape improves verification rate by approx. 18 % in comparison to 2D engine
- Combined pose correction, HGM on shape and score fusion of shape and texture improves verification rate by 37-44% in comparison to 2D engine
- Absolute differences are less than 1% in verification rate





→ **High Resolution Data**

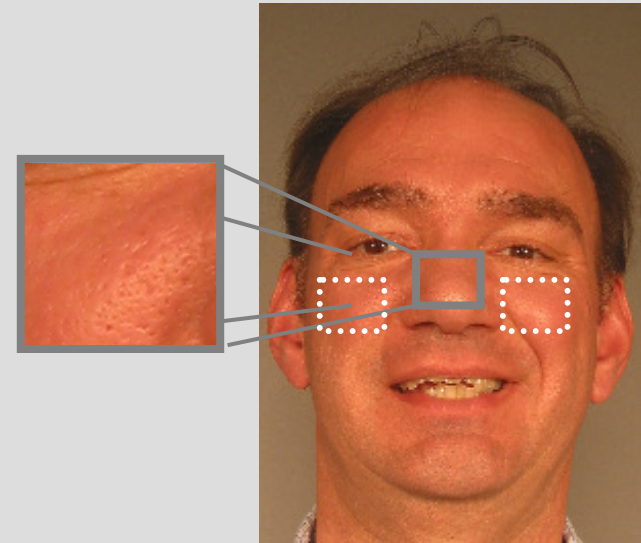
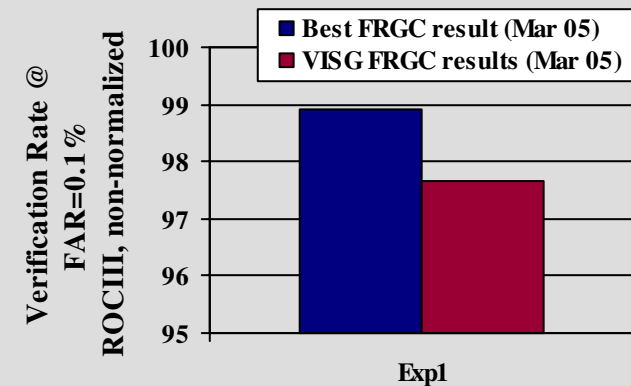
High Resolution Data

Motivation

- Analysis of FRGC results (2005)

Solution

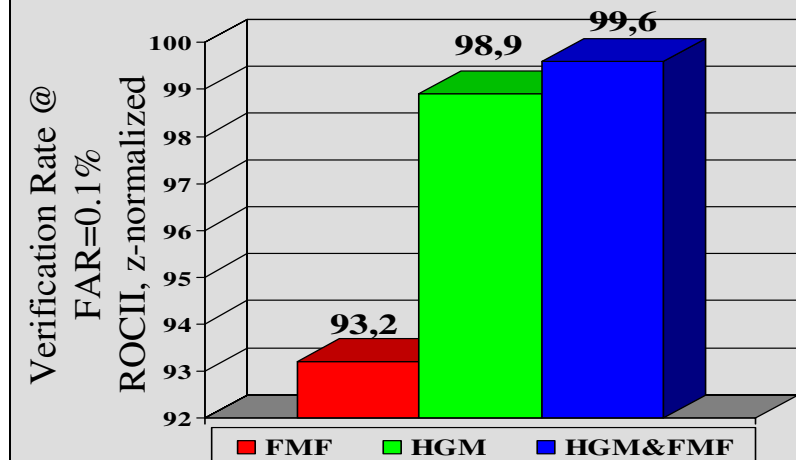
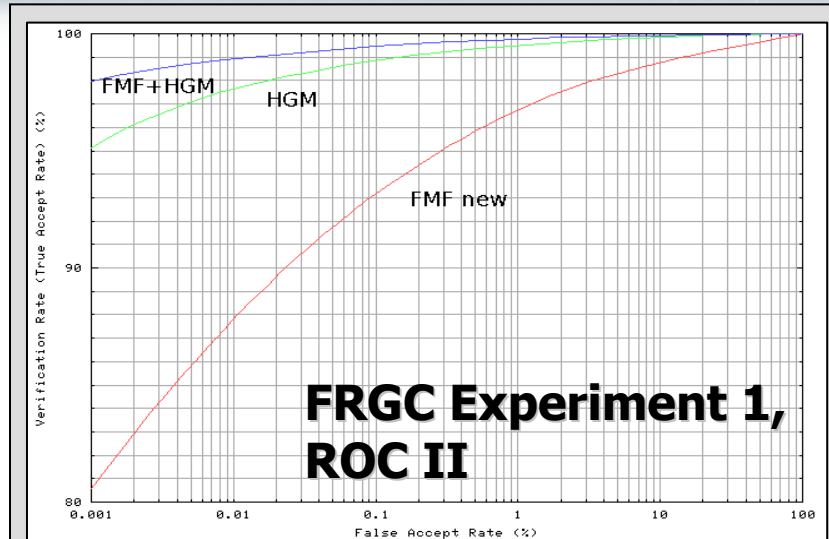
- Correlation based method to exploit additional information in high resolution images
- Selection of appropriate areas, where facial micro features are invariant to pose, illumination and expression
- Fully integrated into Viisage's core FR engine
 - Landmark/region finding
 - Score fusion HGM/Facial Micro Features



Facial Micro Features (FMF)

Results

- Successfully tested on multiple data sets (e.g., FRGC, FERET)
- Significant improvement of accuracy on high resolution images (FRGC experiment #1)
- Unchanged accuracy on insufficient images
- Low matching speed for large scale tests -> hierarchical matching implemented
- Small additional template size (~3kB)

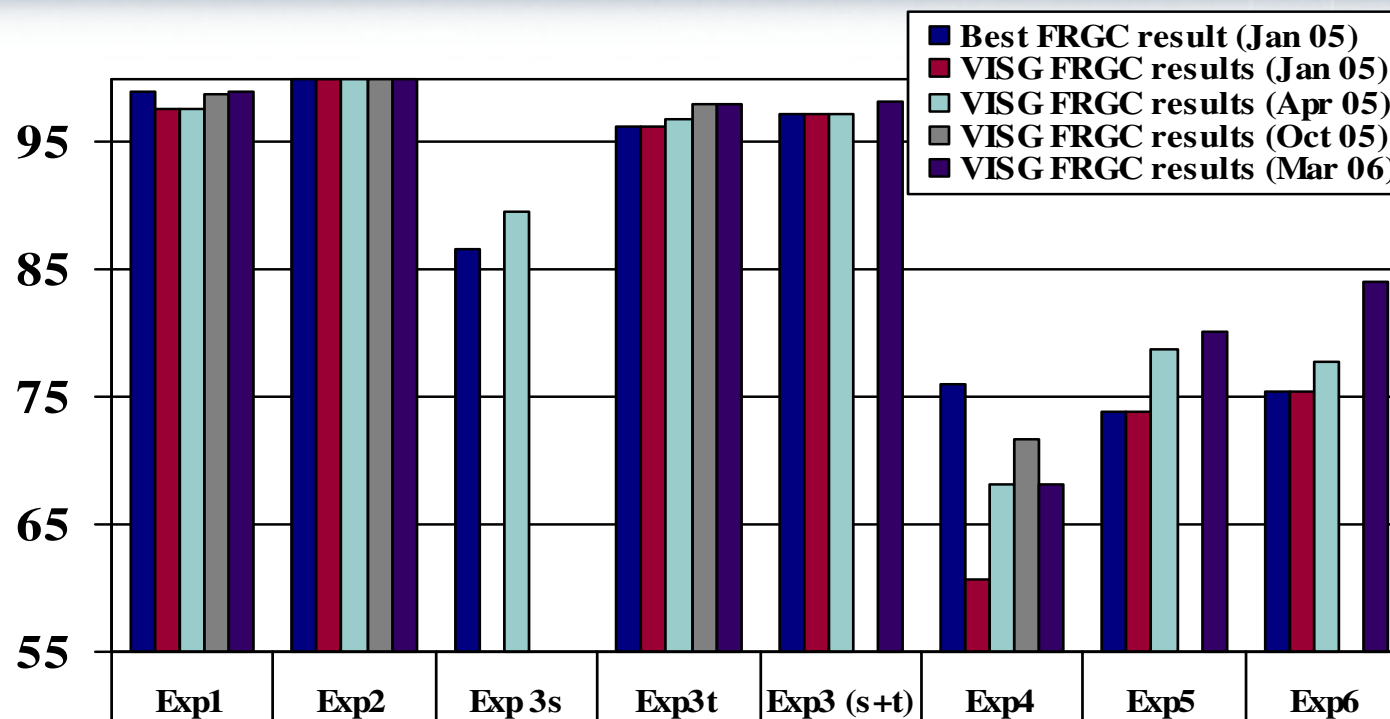




→ **Overview to all Challenges**

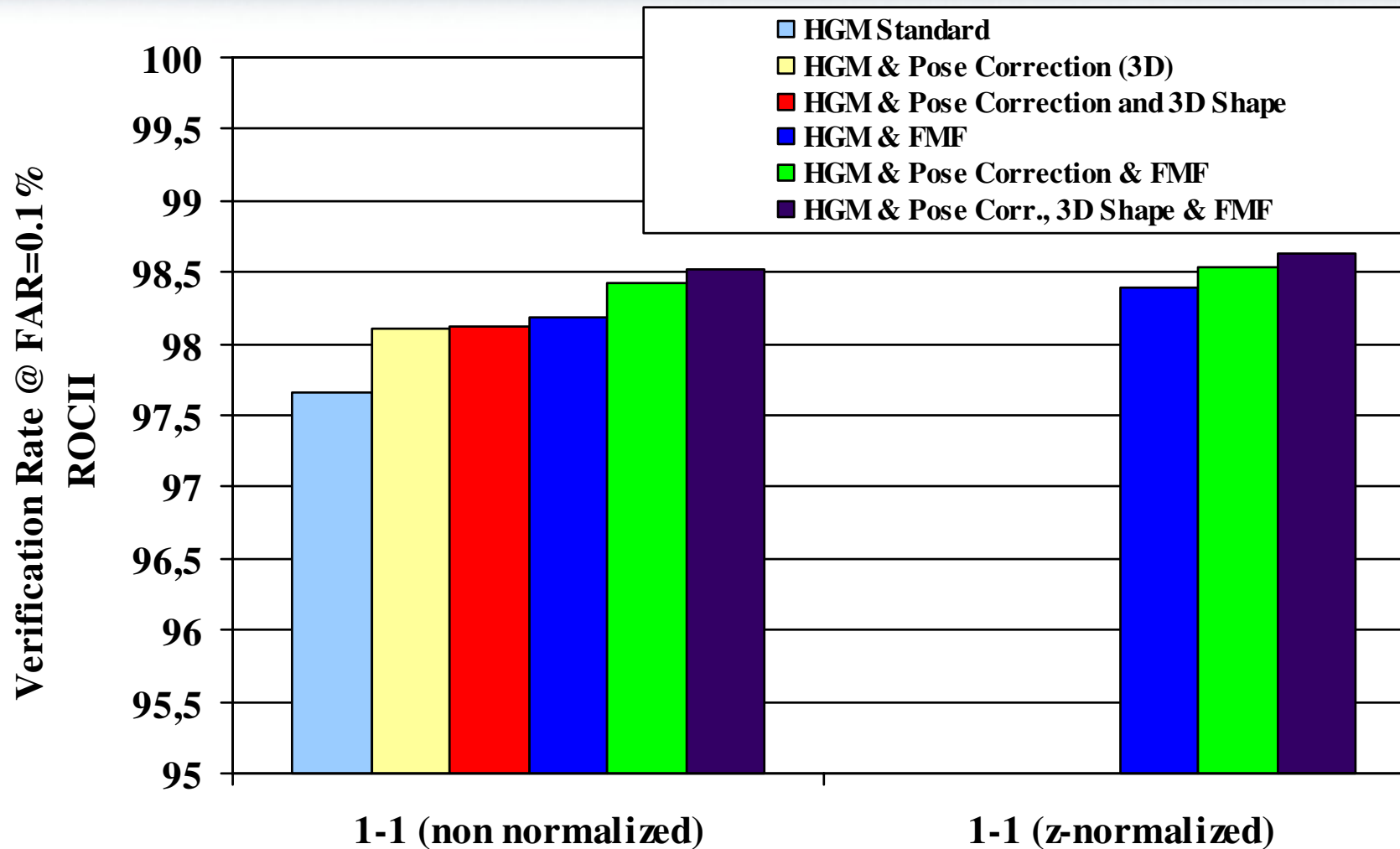
Evolution of FR Performance (FRGC data)

Verification Rate @ FAR=0.1%
ROCIII, non-normalized



	Exp1	Exp2	Exp 3s	Exp3t	Exp3 (s+t)	Exp4	Exp5	Exp6
Best FRGC result (Jan 05)	98,92	100	86,55	96,22	97,28	76	73,9	75,5
VISG FRGC results (Jan 05)	97,64	99,96	---	96,22	97,28	60,65	73,90	75,50
VISG FRGC results (Apr 05)	97,64	99,96	89,56	96,88	97,28	68,10	78,75	77,72
VISG FRGC results (Oct 05)	98,78	100,00	---	98,11	---	71,75	---	---
VISG FRGC results (Mar 06)	98,98	99,91		98,06	98,21	68,12	80,18	84,06

3D vs. Micro Features on Exp. 3





→ **Conclusions & Outlook**

Conclusions and Outlook

Summary

- ✓ Illumination correction greatly improves recognition on uncontrolled images
- ✓ High resolution works well for cooperative scenarios
- ✓ High resolution adds more than 3D
- ✓ We used a general purpose FR system in contrast to prior submissions

Outlook

- ✓ **FRGC** provided a cornerstone to improve FR systematically
- ✓ **FRGC** focused on specific aspects (high resolution, 3D)
- ✓ There are scenarios like low resolution, images with pose , and video processing that have been left untouched
- ✓ **FRGC II** may focus on those
- ✓ Thanks to Jonathon Philips and TSWG
- ✓ **Thanks** to all people, that contributed to the collection of datasets either with their faces or their heads.

THANK YOU!

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