

# Face & Ocular Challenges (FOCS)

**Dr. P. Jonathon Phillips**  
NIST



# Collaborators

- Ross Beveridge
- Soma Biswas
- David Bolme
- Kevin Bowyer
- Rama Chellappa
- Bruce Draper
- Patrick Flynn
- Geof Givens
- Patrick Grother
- Fang Jiang
- Yooyoung Lee
- Yui Man Lui
- Alice O'Toole
- George Quinn
- Vishal Patel
- Todd Scruggs

# **MBE 2010 Still Face**

# Problem Definition

- Frontal Faces
- One Face Image per Person

## Problem 1: Controlled Studio Environment



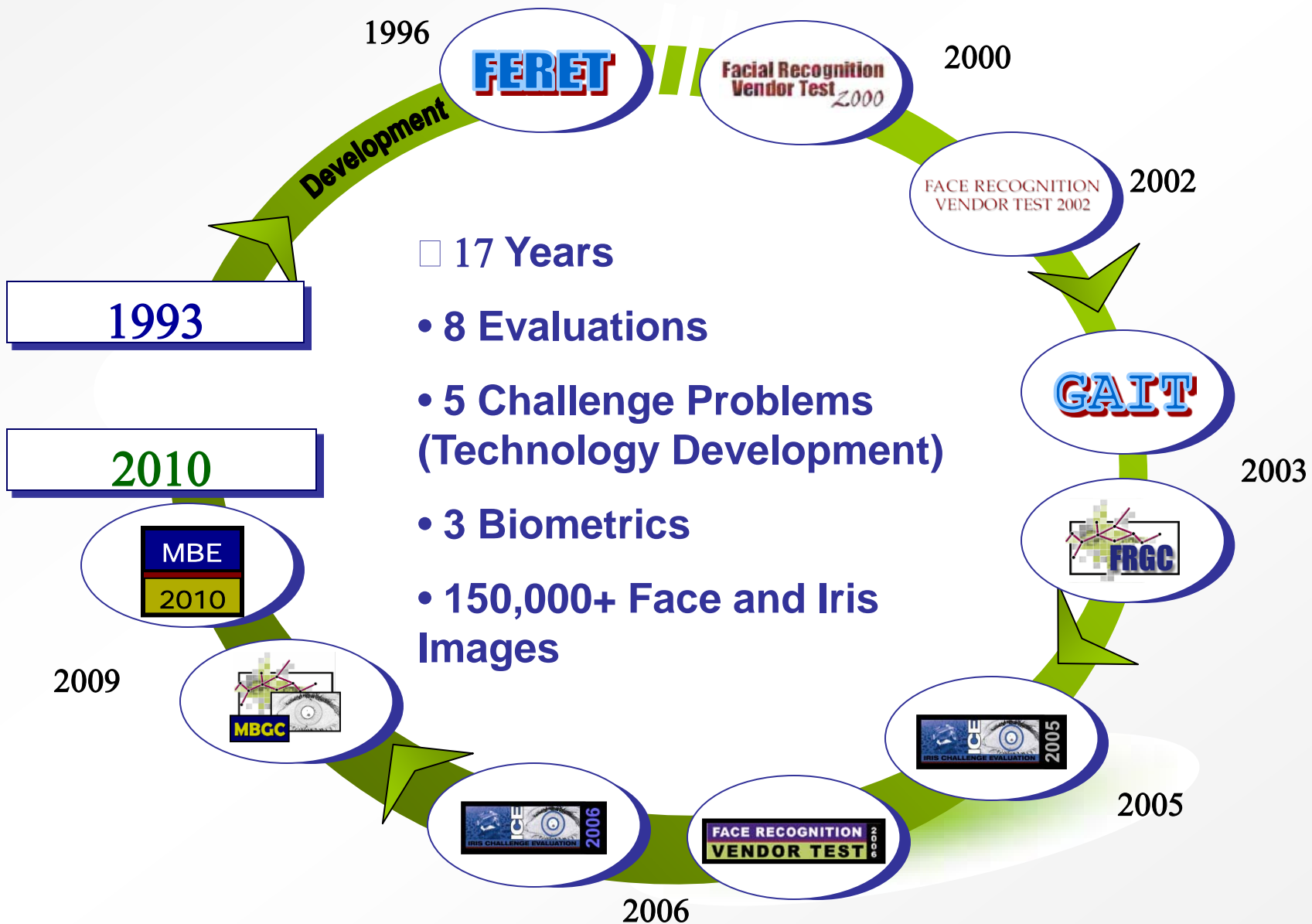
## Problem 2: Studio vs. Ambient Lighting



or



# Technology Progress



# Goals of MBE 2010 Still Face Track

- Evaluation period: Jan – May 2010
  - Measure progress since FRVT 2006
  - Leverage massive operational data corpora.
  - To evaluate face recognition technologies in a proper one-to-many identification mode.
- *Multiple Biometric Evaluation 2010: Still Face Report*, P. Grother, G. Quinn, and P. J. Phillips, NISTIR 7709, 2010, <http://face.nist.gov>

# From FERET to MBE 2010

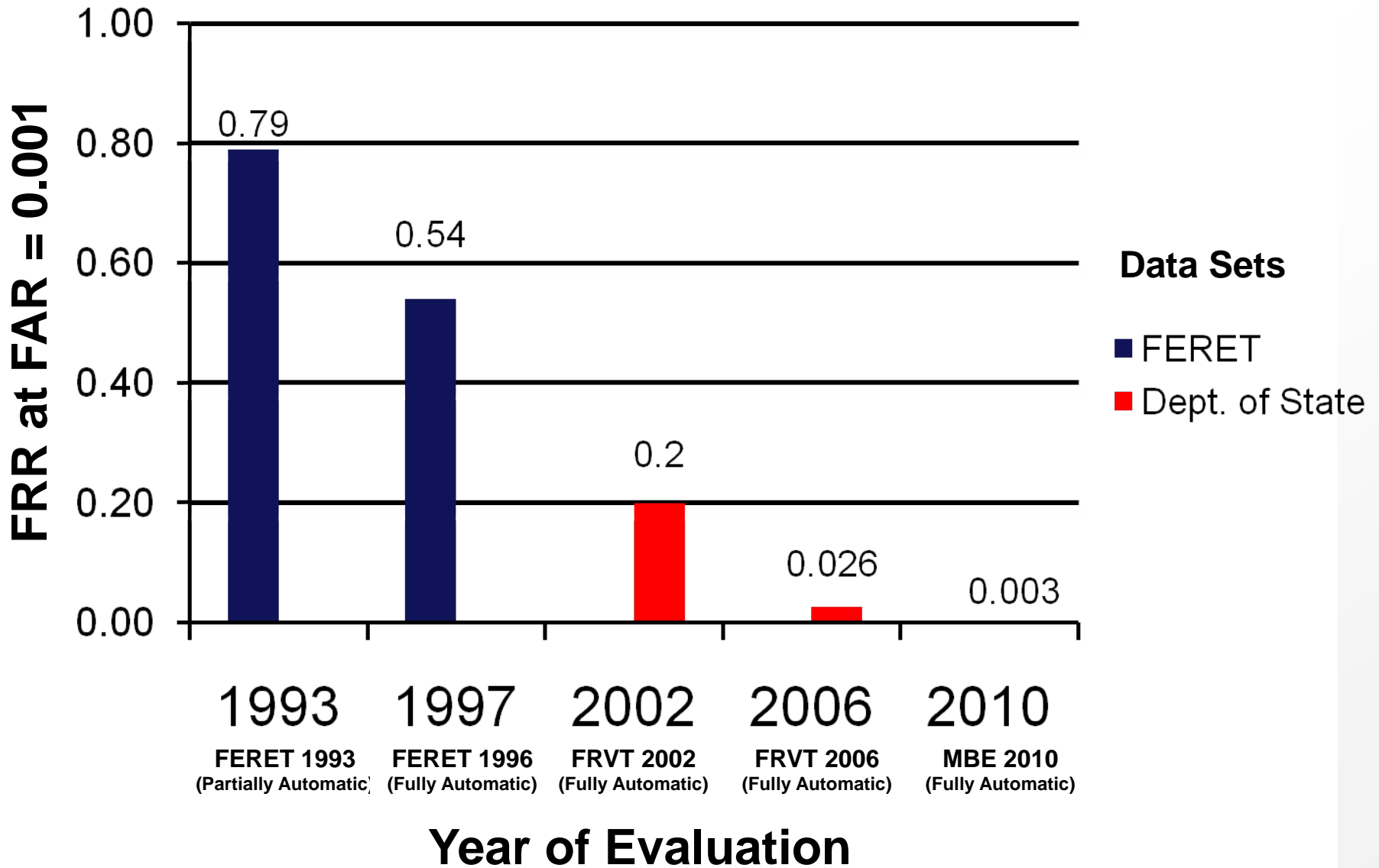
- One Face Image per Person

**Problem 1: Controlled Illumination vs. Controlled Illumination**





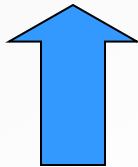
# From FERET to MBE 2010





# Closed-set Identification

Large Gallery (1.6 million)

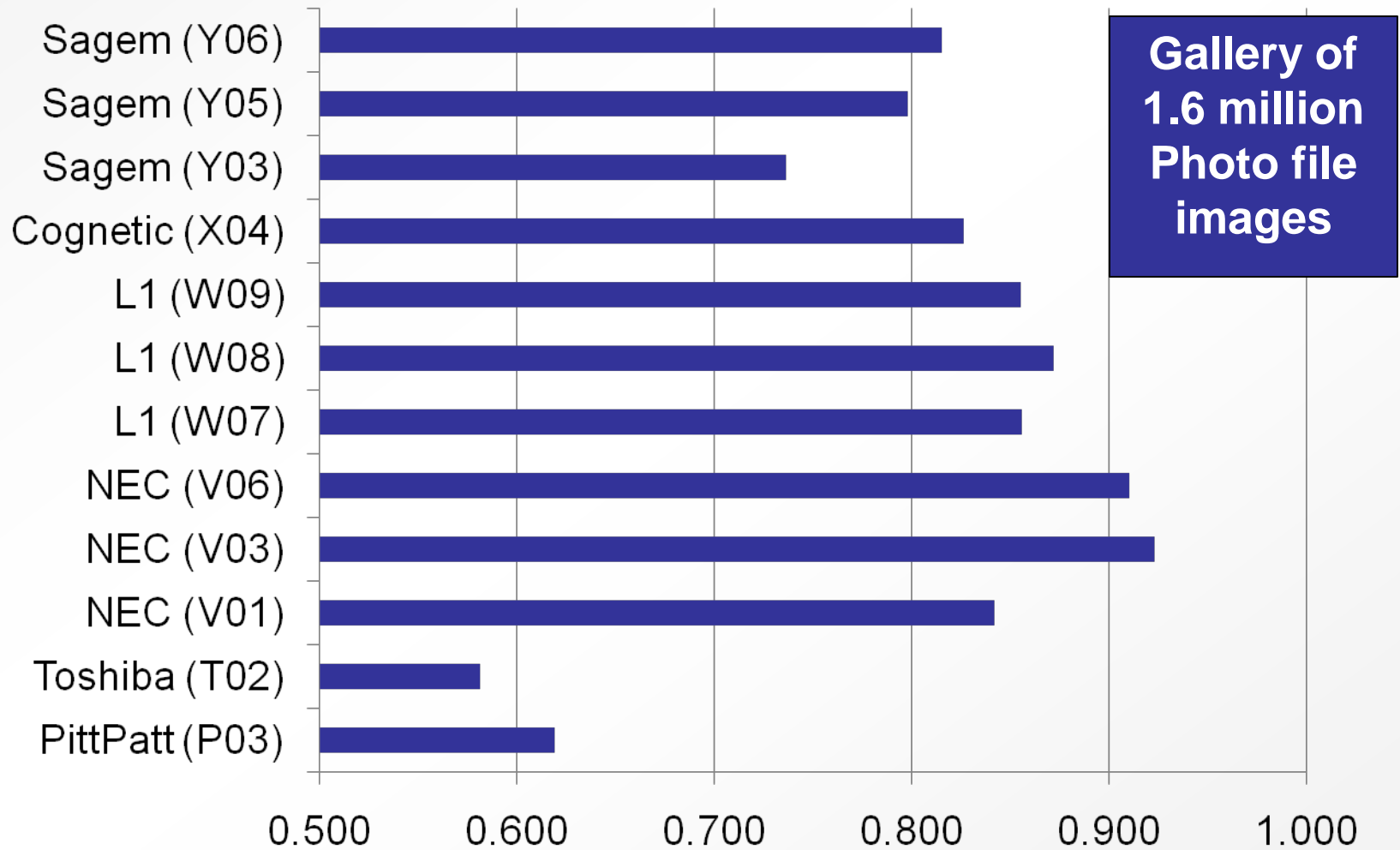


Who is this person?

- All probes in gallery
- Score: Rank 1 Identification
- Selectivity: Number of average matches returned

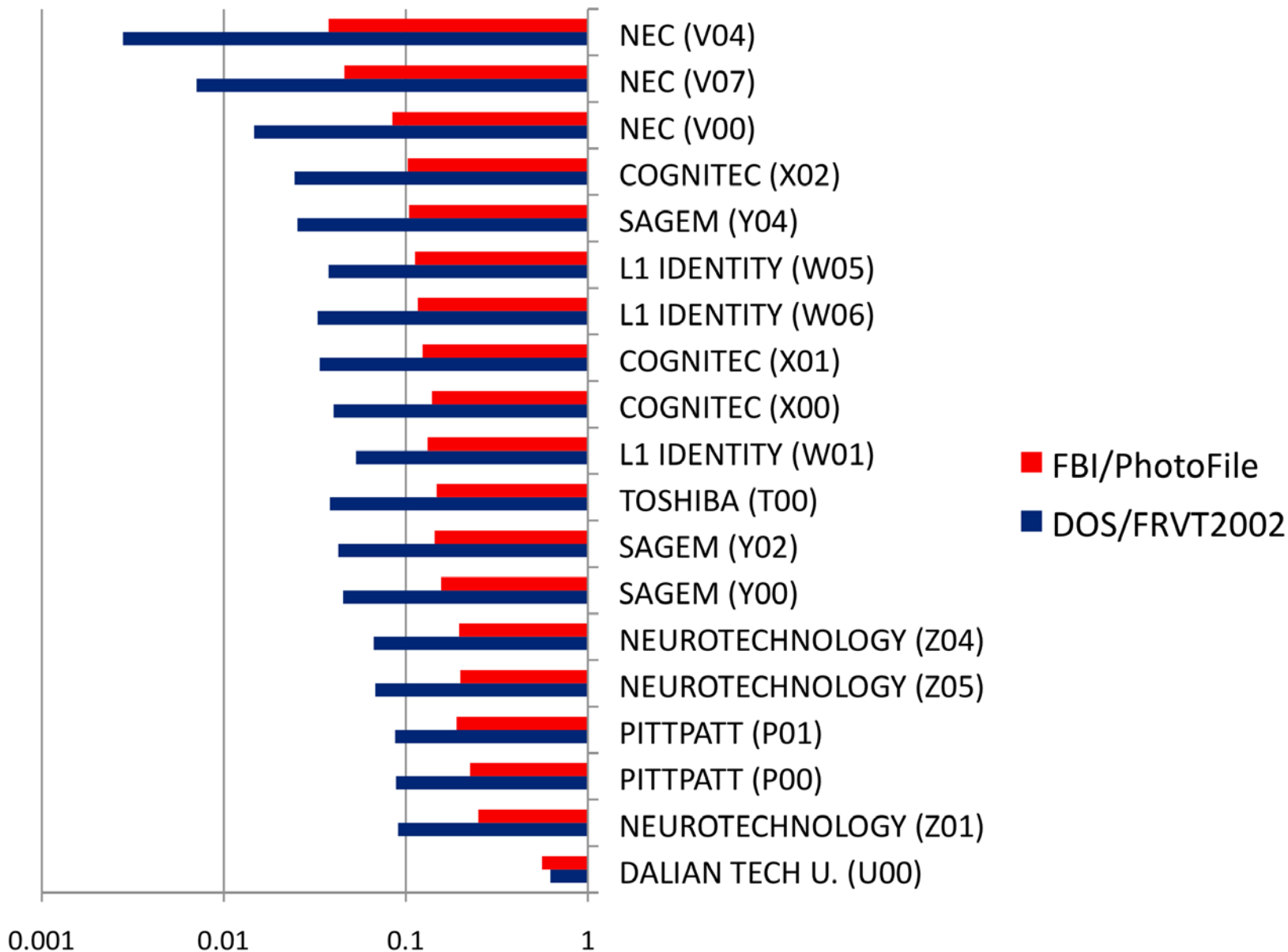
# Closed-set Identification

## Rank 1 Identification



SDK

NIST



False Reject Rate at False Alarm Rate = 0.001

# Main Results

- Improvements in 1-1 verification
  - Three order improvement since 1993
  - FRR = 0.003 at FAR of 1 in 1,000
- Closed Set Identification
  - Gallery of 1.6 million faces
  - Rank 1 ID = .93
- Is face recognition solved?
  - Not for unconstrained environments

# Face & Ocular Challenges (FOCS)

- Video
- The Good, the Bad, & the Ugly
- NIR Ocular
- Performance Prediction

# **Video**

**(MBGC ver2)**

# Walking vs. Activity

## Activity vs. Activity

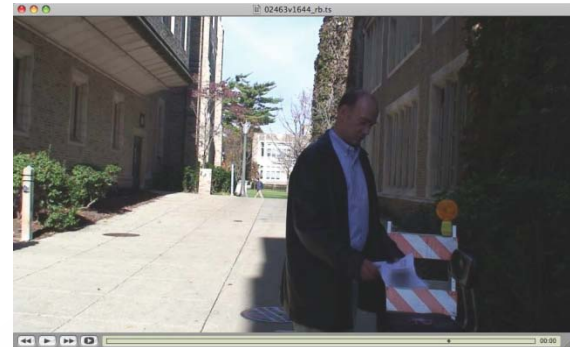
*Walking*

*976 sequences*



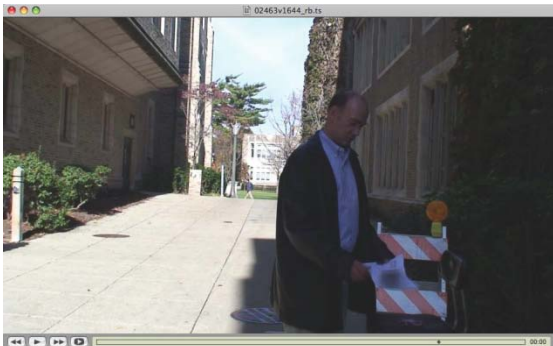
*Activity*

*784 sequences*



*Activity*

*784 sequences*



*Activity*

*784 sequences*





# Human Performance on Video

□Recognizing people from dynamic and static faces and bodies: Dissecting identity with a fusion approach ,” P. J. Phillips, A. J. O’Toole, S. Weimer, D. Roark, J. Ayadd, R. Barwick, J. Dunlop, Vision Research, in press, 2010.

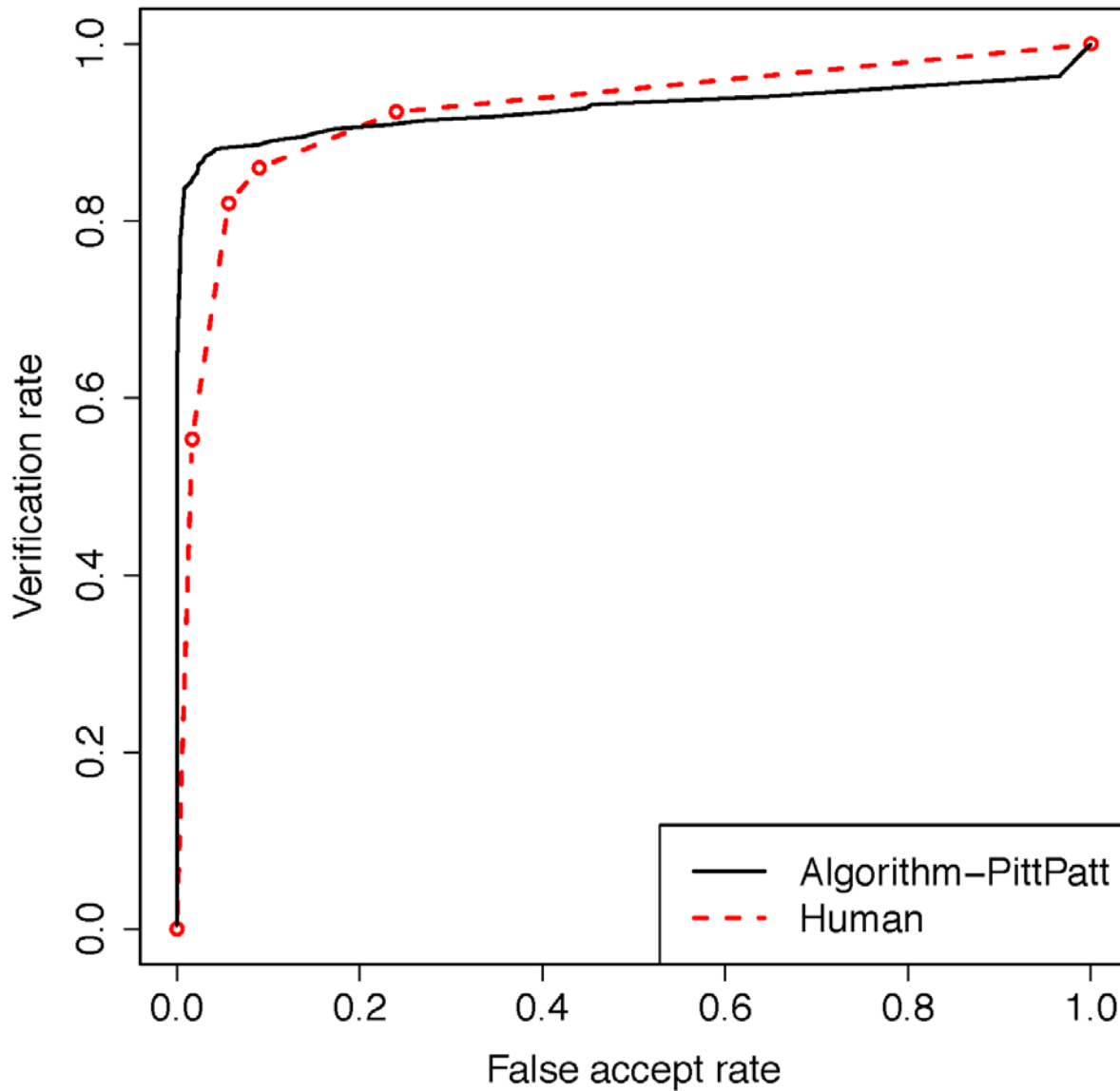
# Video: Walking vs. Walking



- **Human subject raters respond...**
  - 1. sure they are the same person
  - 2. think they are the same person
  - 3. not sure
  - 4. think they are not the same person
  - 5. sure they are not the same person

# Video: Human & Machine Performance

UT Dallas--Walking to Walking



# Video: Walking vs. Conversation



- **Human subject raters respond...**
  - 1. sure they are the same person
  - 2. think they are the same person
  - 3. not sure
  - 4. think they are not the same person
  - 5. sure they are not the same person

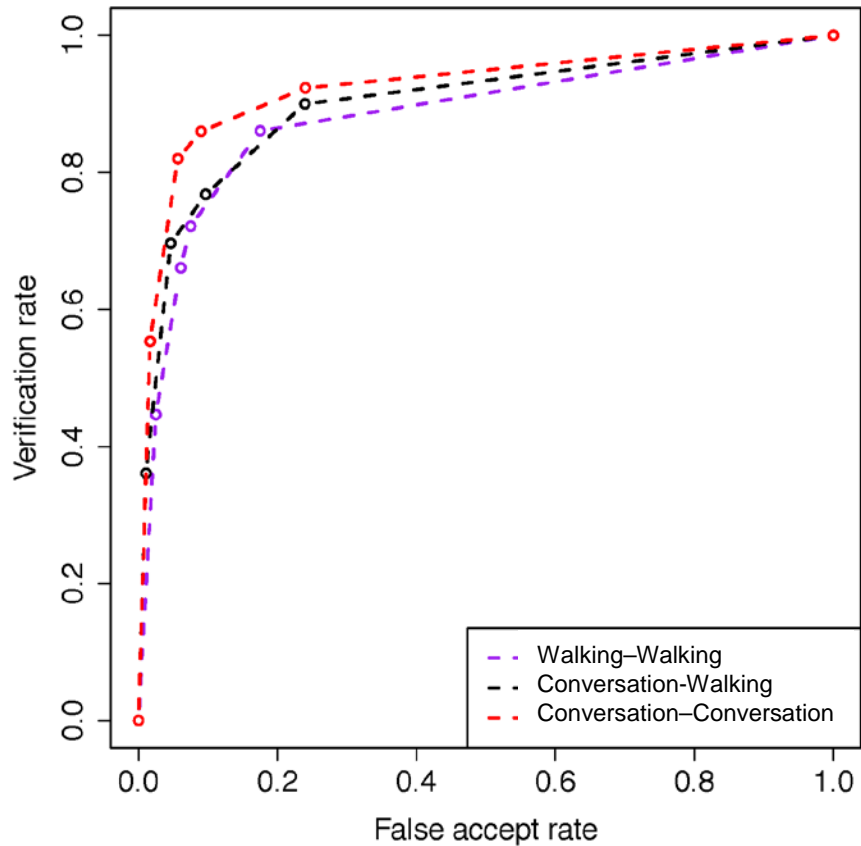
# Video: Conversation vs. Conversation



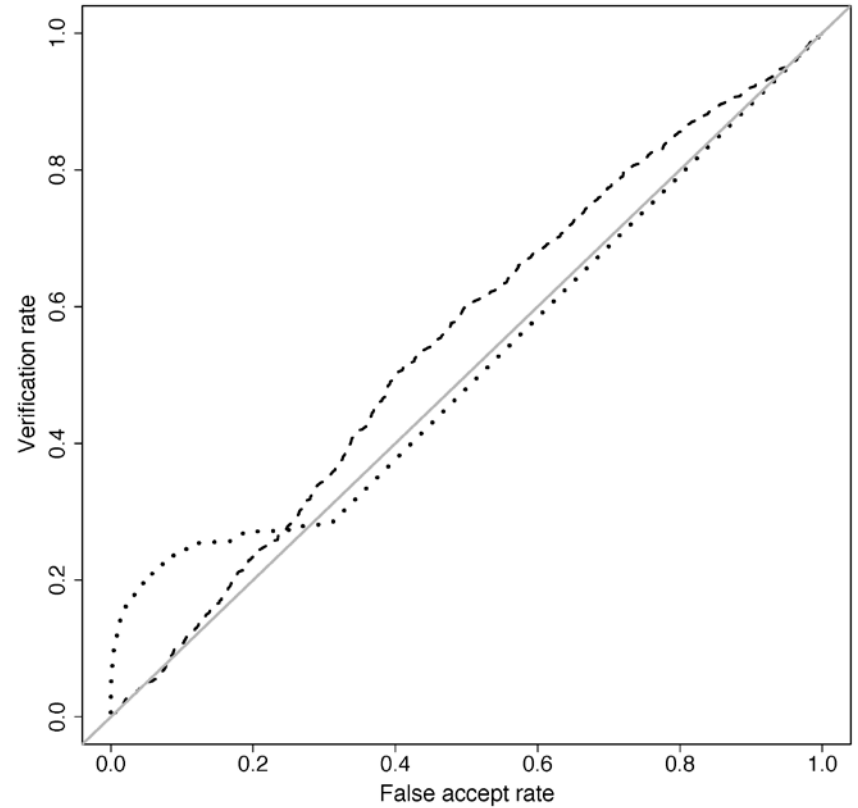
- **Human subject raters respond...**
  - 1. sure they are the same person
  - 2. think they are the same person
  - 3. not sure
  - 4. think they are not the same person
  - 5. sure they are not the same person

# Video: There is Head Room

## Human Performance



## Machine Performance





# Gait Experiments

**gait video**



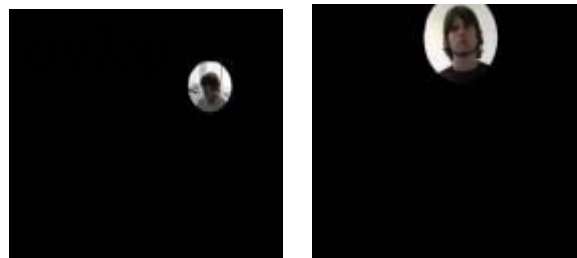
**conversation video**



**body only**

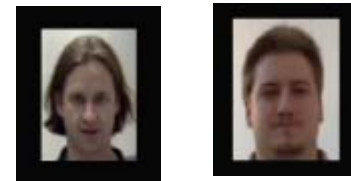


**face**

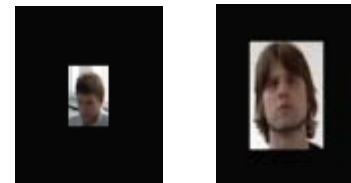


**Static Face**

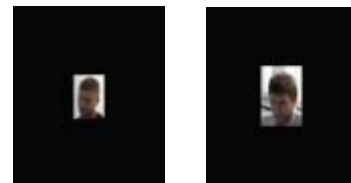
**GG**



**CG**



**CC**





# Next Directions

- In hard cases (poor viewing conditions), humans take advantage of video, face, & video
- Evidence: algorithms do NOT take advantage of video, face, & body/gait
- Learn from the human visual system.
- Incorporate into algorithm design.

# **The Good, the Bad, and the Ugly Still Face Challenge**

# Goal of GBU

- Encourage development of “hard” still frontal face recognition algorithms
- Improvement not at expense of “non-hard” images
- Three performance levels
  - Good
  - Bad
  - Ugly
- Discover the “phantom” covariates to which humans appear immune.

# Experiment Specifics

- Nikon D70-6 Mpixels
- Uncontrolled images
  - Indoors
  - Outdoors
- 9,307 pool of images
- 437 qualified subjects
- Images in MBGC
- Images included in FRVT 2006
- Select by FRVT 2006 algorithms

# Experiment Specifics

- Same number of images per subject
  - Each Sig Set
  - Each Partition
- Variation in performance on image attributes

<i>Data Set</i>	<i>Target Size</i>	<i>Query Size</i>
The Good	1085	1085
The Bad	1085	1085
The Ugly	1085	1085

# Face Pairs



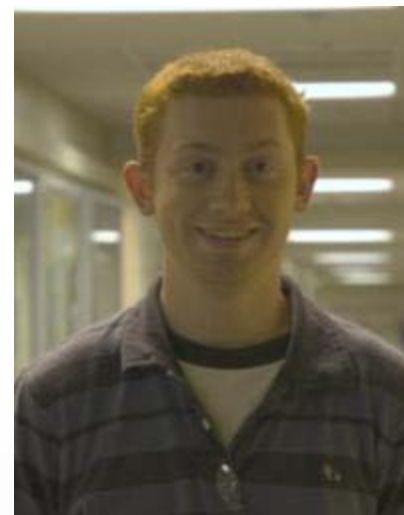
*Good*

*Challenging*

*Very Challenging*



# Face Pairs



*Good*

*Challenging*

*Very Challenging*



# Face Pairs

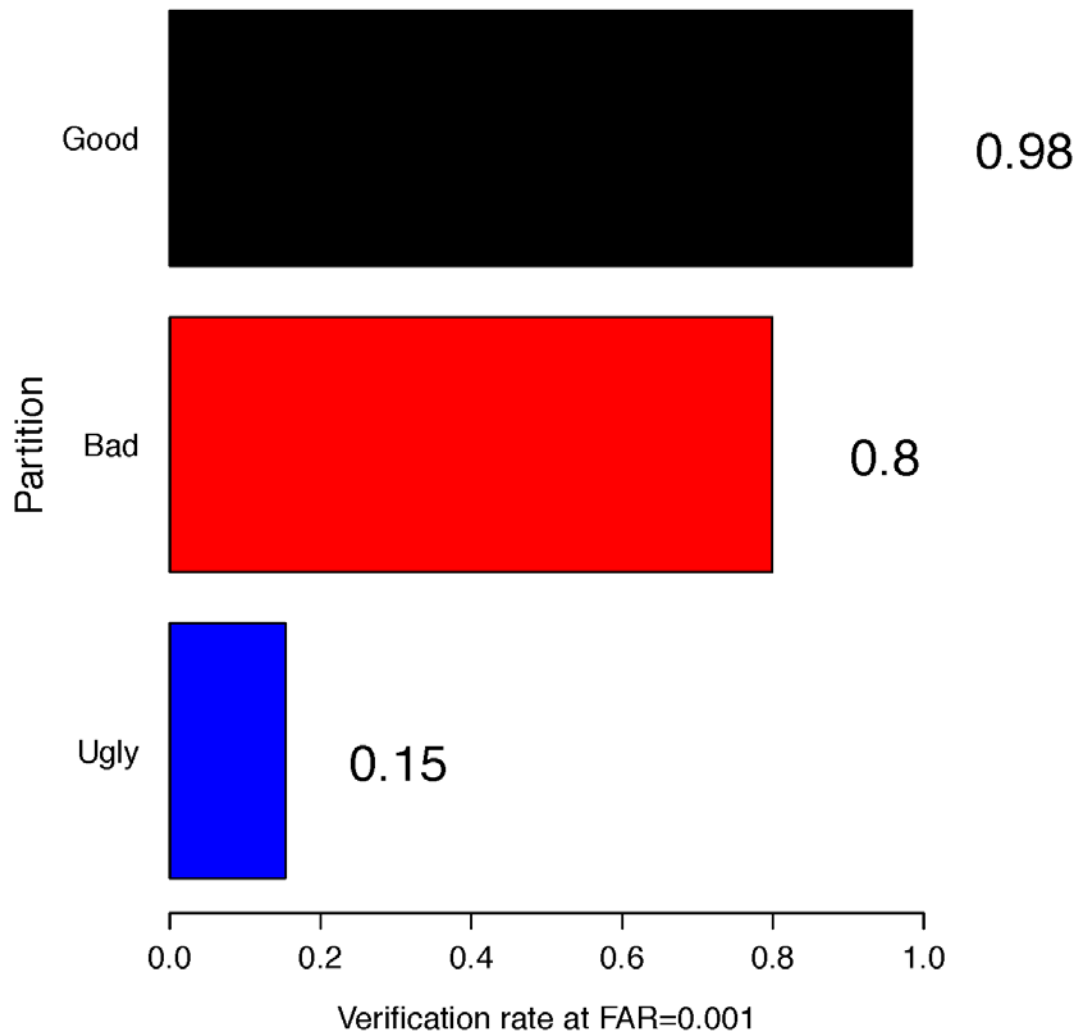


*Good*

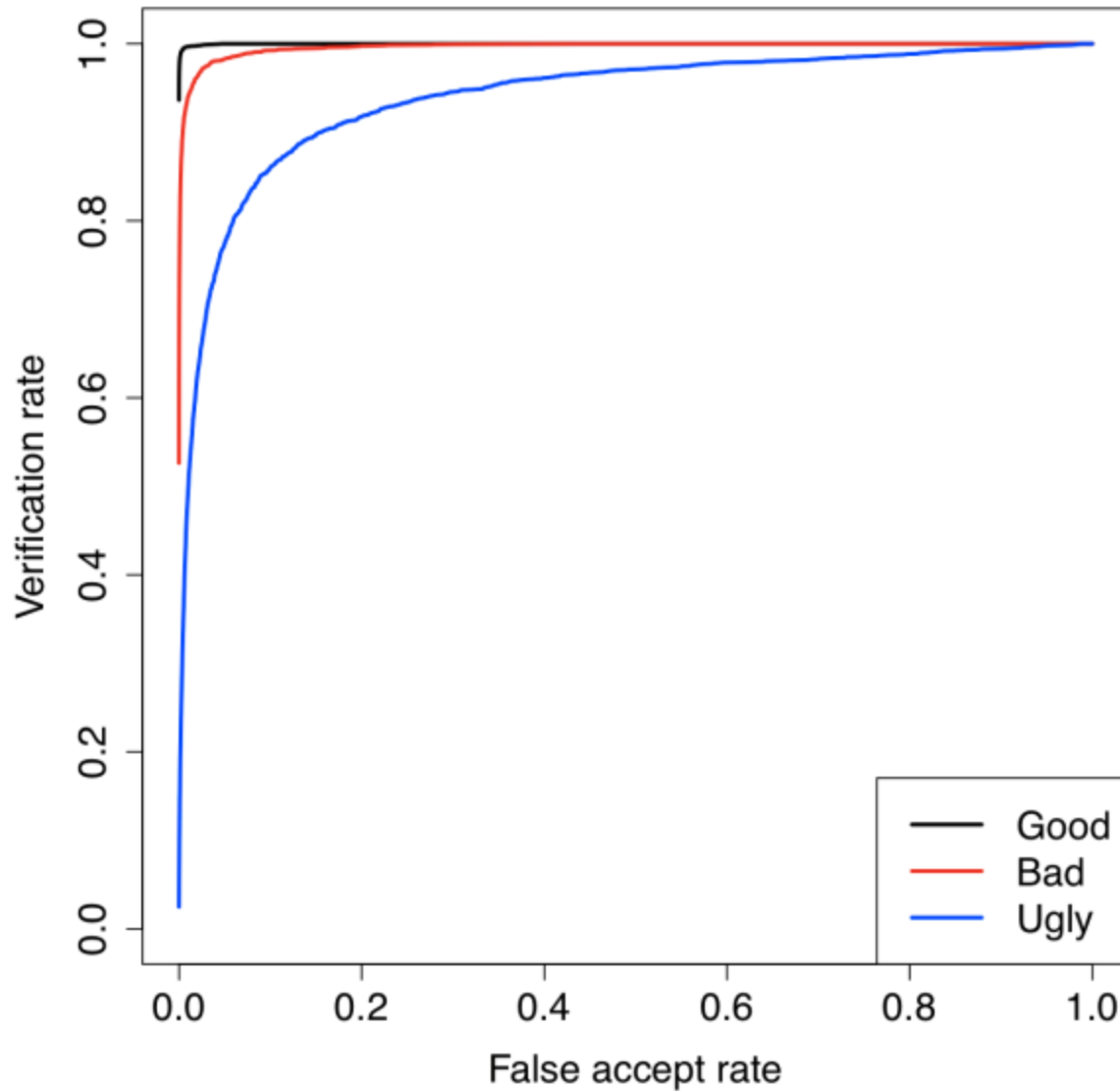
*Challenging*

*Very Challenging*

# Good, Bad, Ugly Performance



# GBU Fusion ROC



# Big “Four” Problems in Face Recognition

**A** – Aging (time lapse)

**P** – Pose

**I** – Illumination

**E** - Expression

# “Four” Big Problems in Face Recognition

~~A~~ Aging

Collected same academic yr

~~P~~ Pose

All frontal images

I – Illumination



E - Expression



# Lighting & Expression

Same lighting, Same expression



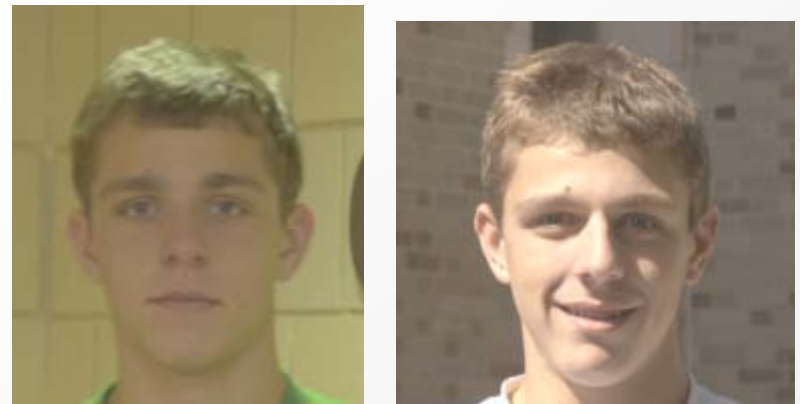
Different lighting, Same expression



Same lighting, Different expression



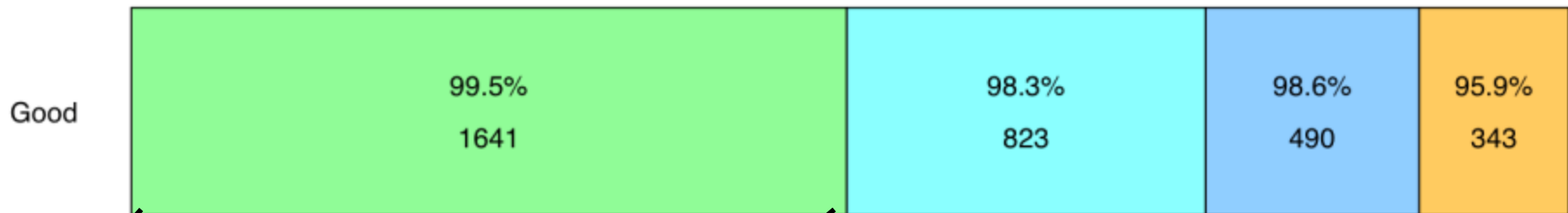
Different lighting, Different expression





# Lighting & Expression

Verification rate @ FAR = 0.1%



Same lighting, Same expression



Different lighting, Different expression





# Lighting & Expression

Verification rate @ FAR = 0.1%

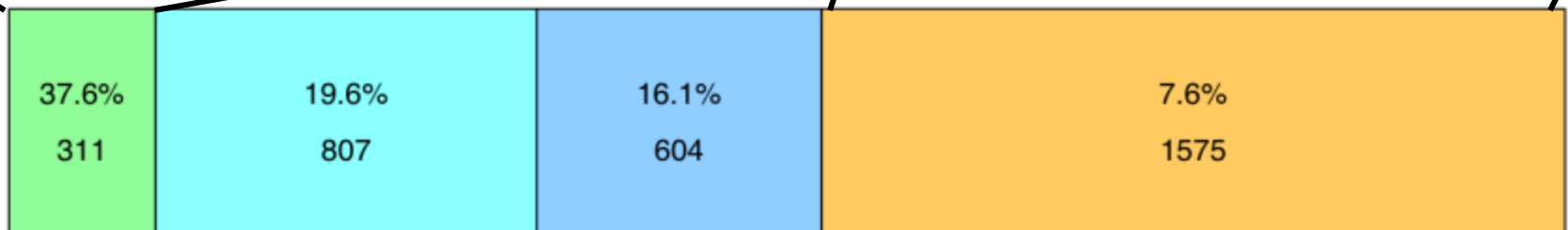
Same lighting, Same expression



Different lighting, Different expression

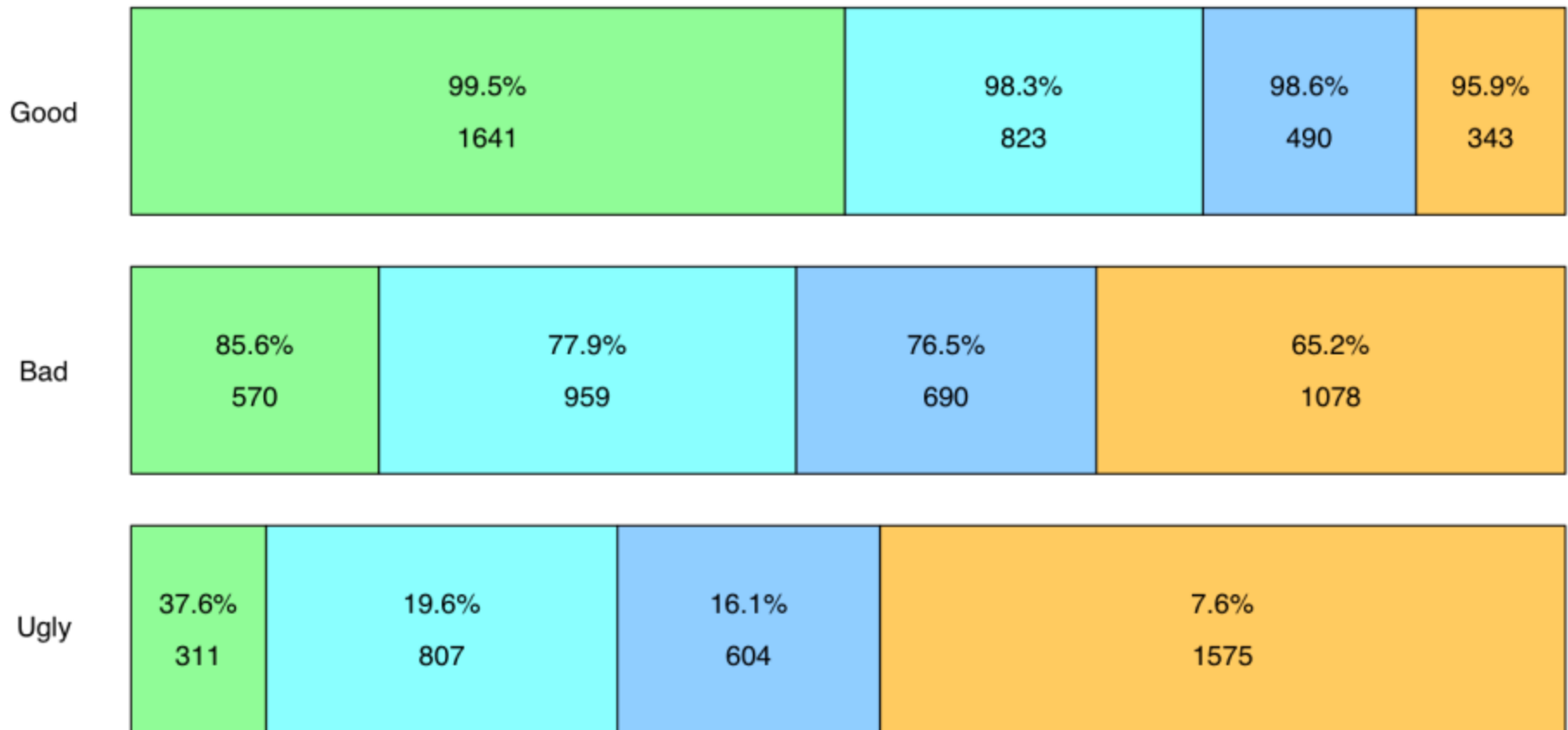


Ugly



# Lighting & Expression

Verification rate @ FAR = 0.1%

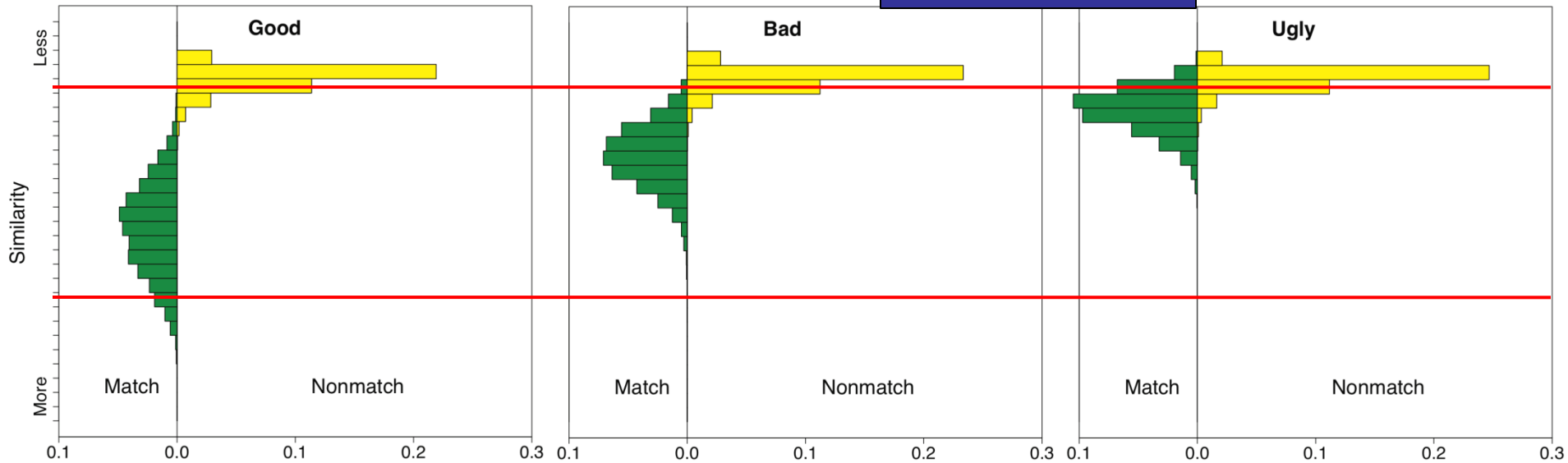


# What is the quality of these images?



# Hard and Easy to Match

*Hard to Match*



*Easy to Match*

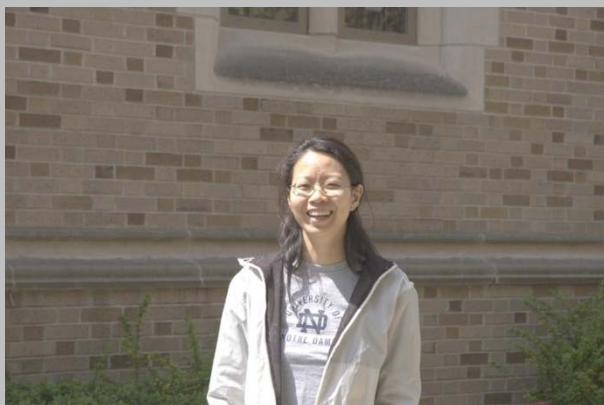
# Quality comes in Pairs



*Hard to Match*

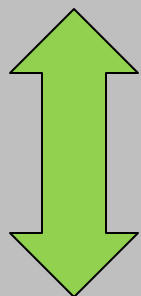


*Hard to Match*

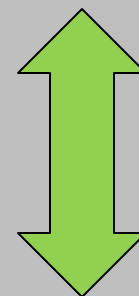




# Quality comes in Pairs



*Easy to Match*



*Easy to Match*

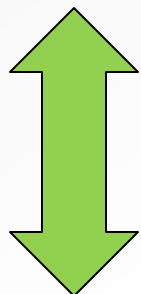
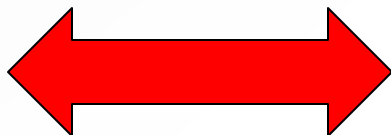




# Quality comes in Pairs

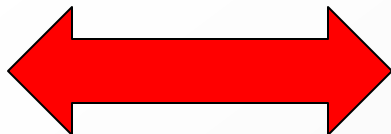
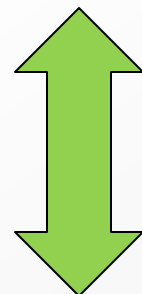


*Hard to Match*



*Easy to Match*

*Easy to Match*



*Hard to Match*



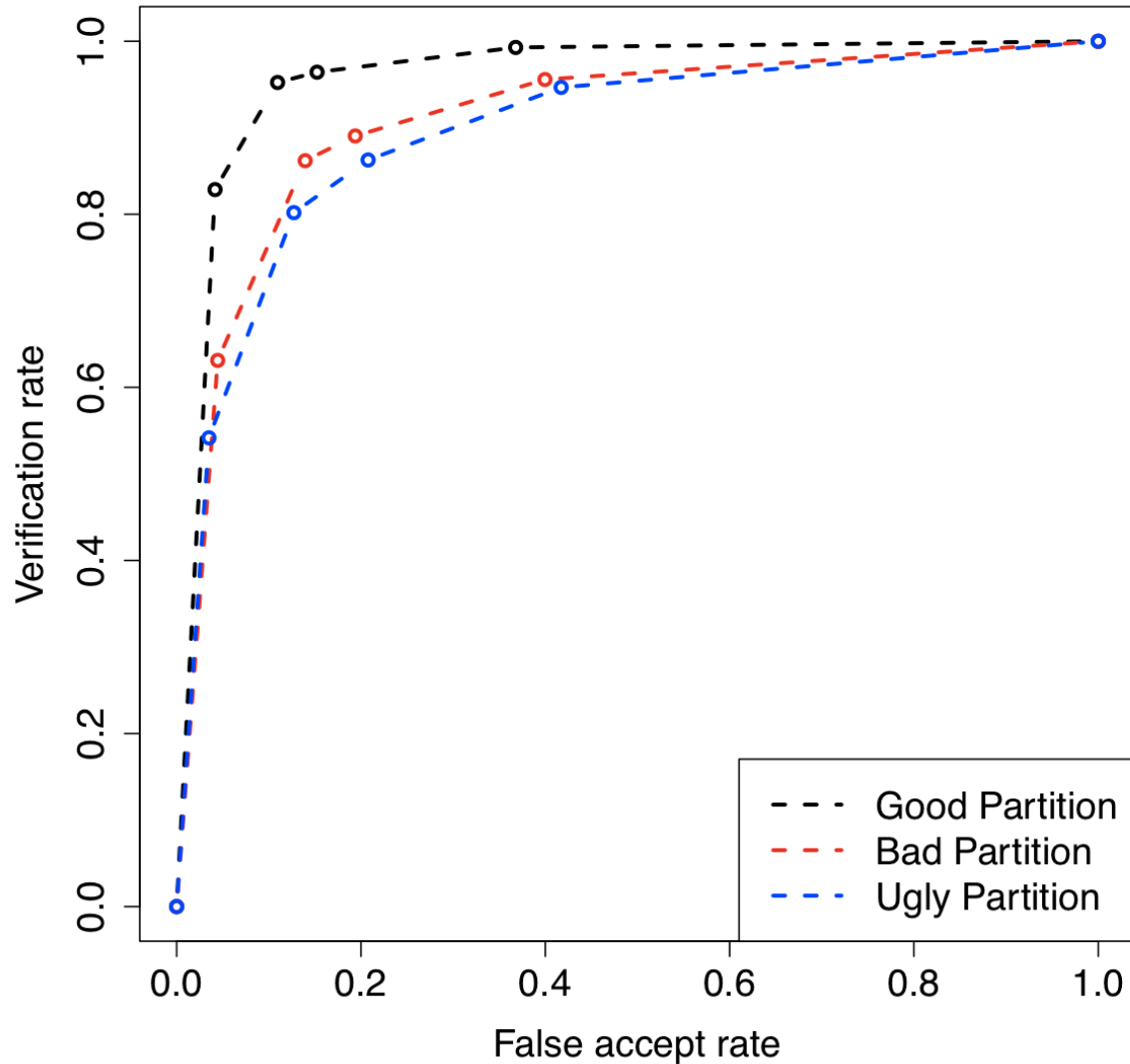
# Human Performance Procedure



- Human subject raters respond...
  - 1. sure they are the same person
  - 2. think they are the same person
  - 3. not sure
  - 4. think they are not the same person
  - 5. sure they are not the same person

# GBU Human Performance

Human Performance on Good, Bad, & Ugly Challenge

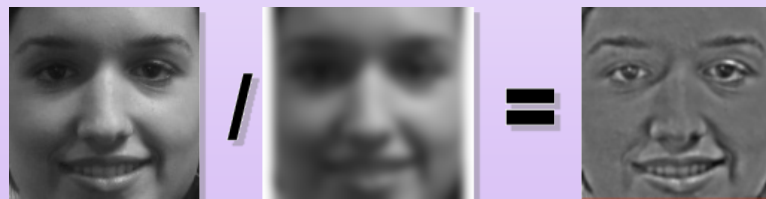


# CSU/NIST GBU Baseline Algorithm

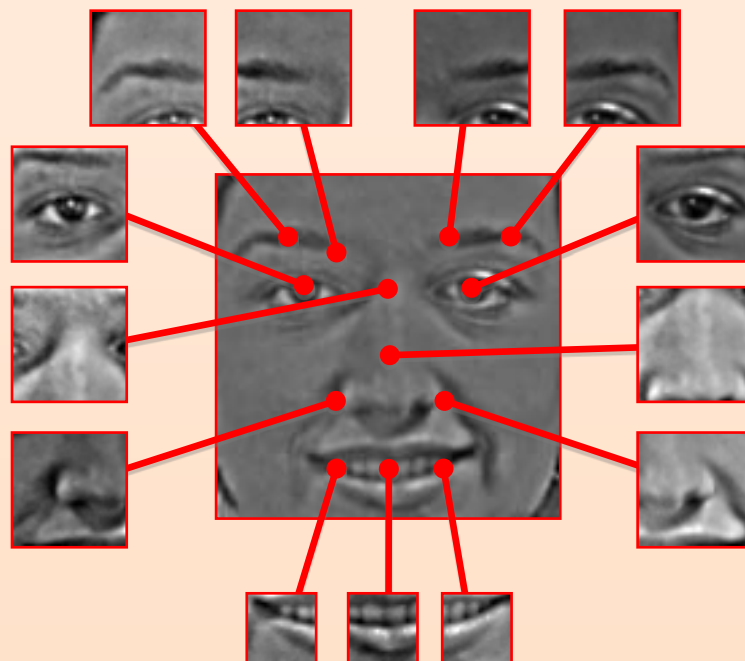
## Local Region PCA Algorithm

- 13 Local Features + Whole Face
- Self Quotient - Lighting Removal
- PCA based whitening
  - 250 basis vectors per feature.
  - 3500 total basis vectors.
- Fisher Criterion Weighting
- All features combined
- Similarity based upon Correlation

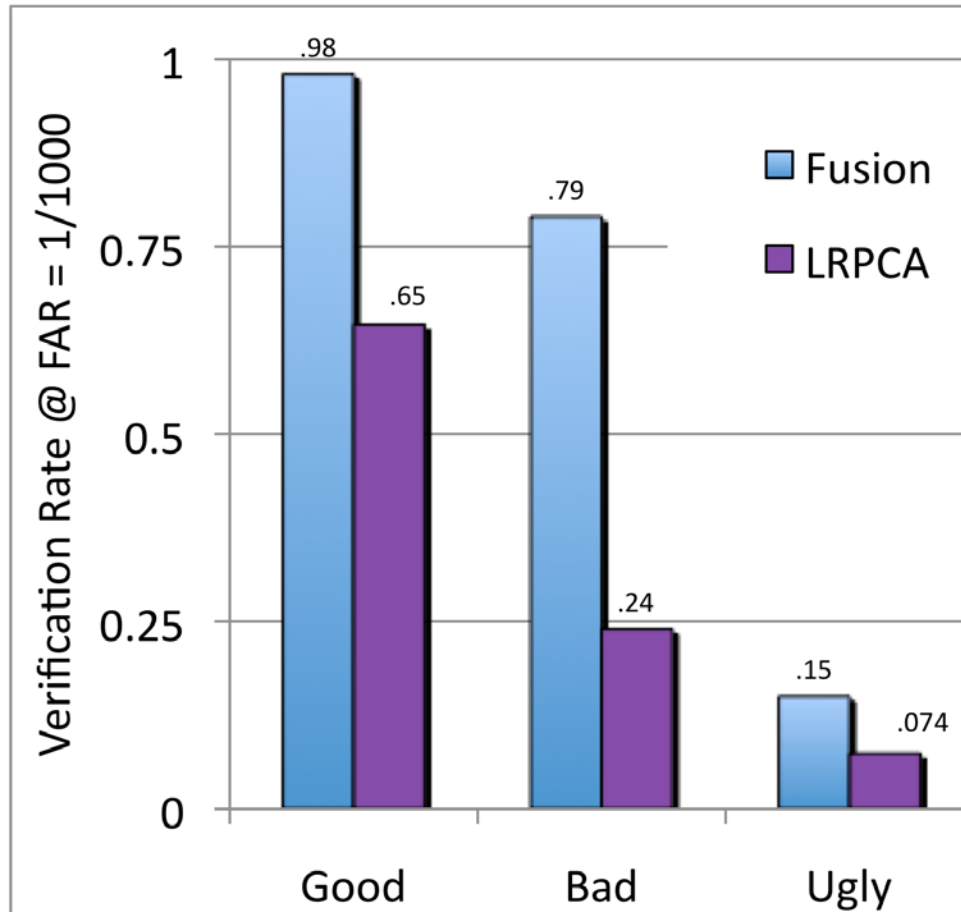
## Self Quotient Preprocessing



## Local Regions



# Performance on GBU



*Sample match from Good Data*



*Sample match from Challenging Data*

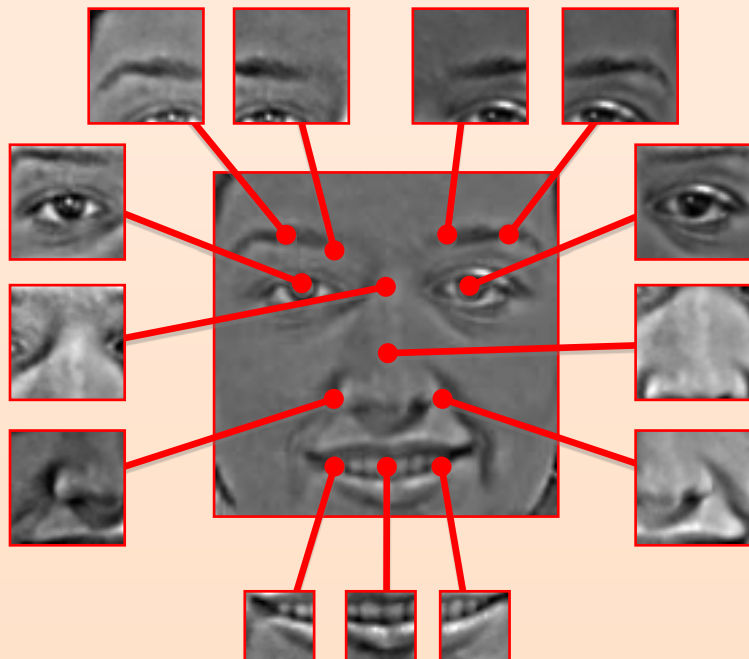


*Sample match from Very Challenging Data*

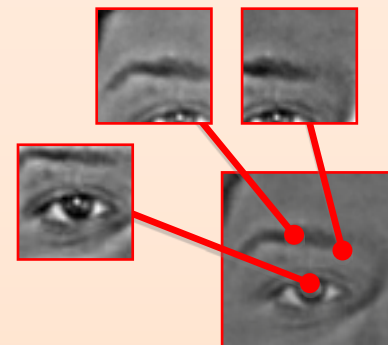


# From Face to Ocular GBU Baseline Algorithm

*Whole Face 14 Local Regions*



*Left Ocular 3 Local Regions*





## Matching Pursuit Filters Applied to Face Identification

P. Jonathon Phillips, *Member, IEEE*

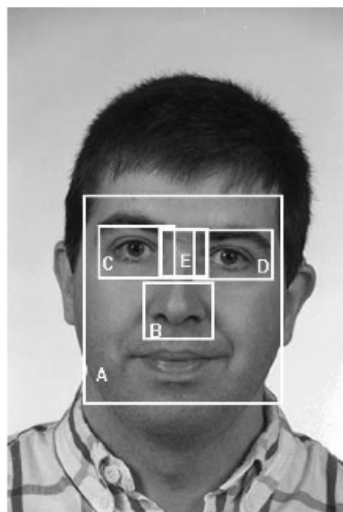
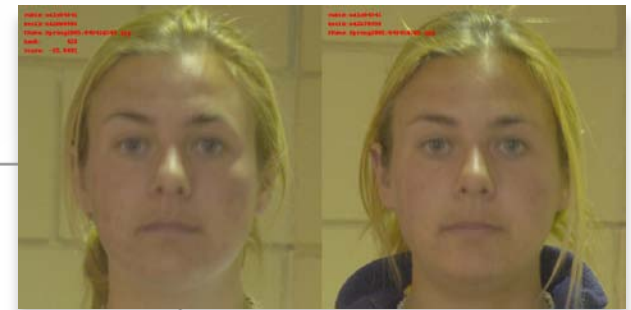
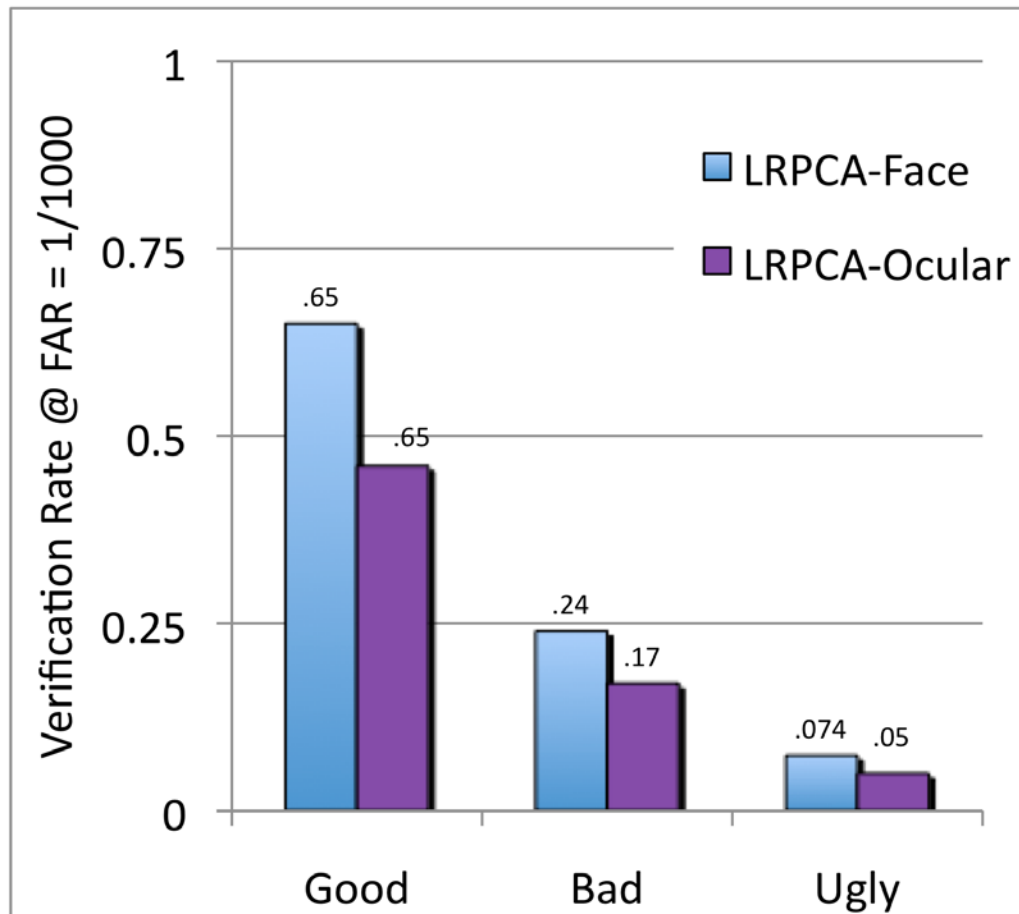


Figure 3.2: The facial features used. A is the interior the face. B is the tip of the nose. C and D are the left and right eyes. E is the bridge of the nose.

Top match	Left & Right Eyes	Tip of Nose & Left Eye	Left Eye Only
1	87.1%	89.4%	81.4%
2	88.7%	91.3%	85.5%
3	88.7%	93.2%	86.8%
4	88.7%	93.4%	88.4%

# Performance on GBU



Sample match from Good Data



Sample match from Challenging Data



Sample match from Very Challenging Data

# GBU Performance

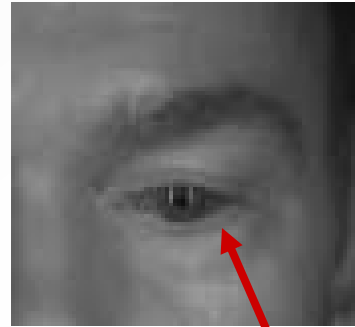
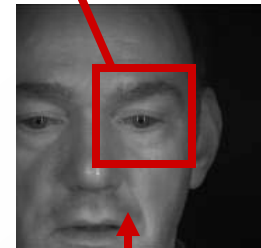
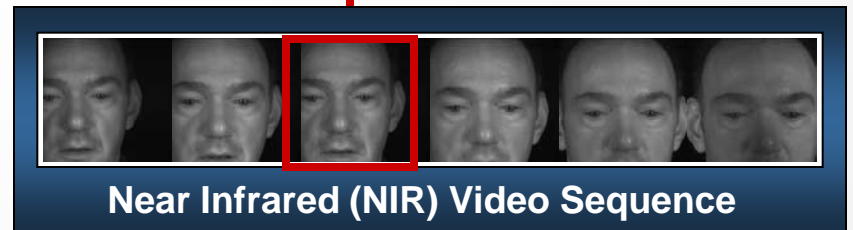
- Three partitions
  - Same subjects
  - Differences are image covariates
  - More than expression and lighting direction
- Human Performance
  - Bad & Ugly partitions statistically not different
- Machine Performance
  - Bad & Ugly partitions different
- Humans “Blind” to Algorithm Differences
- Human Performance as Benchmark

# Ocular

# Ocular Data

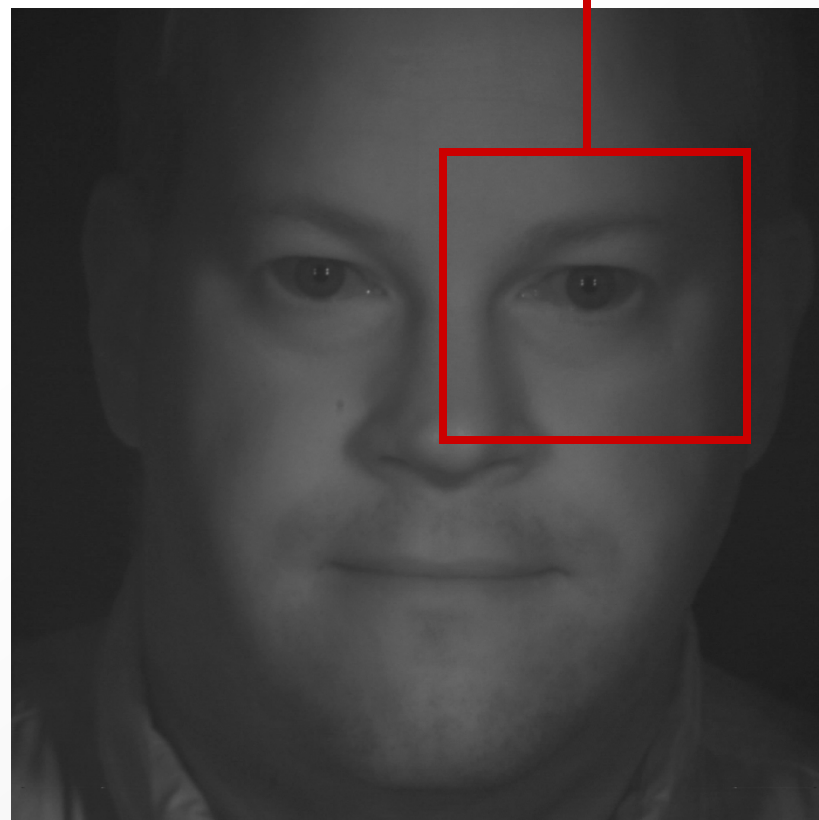
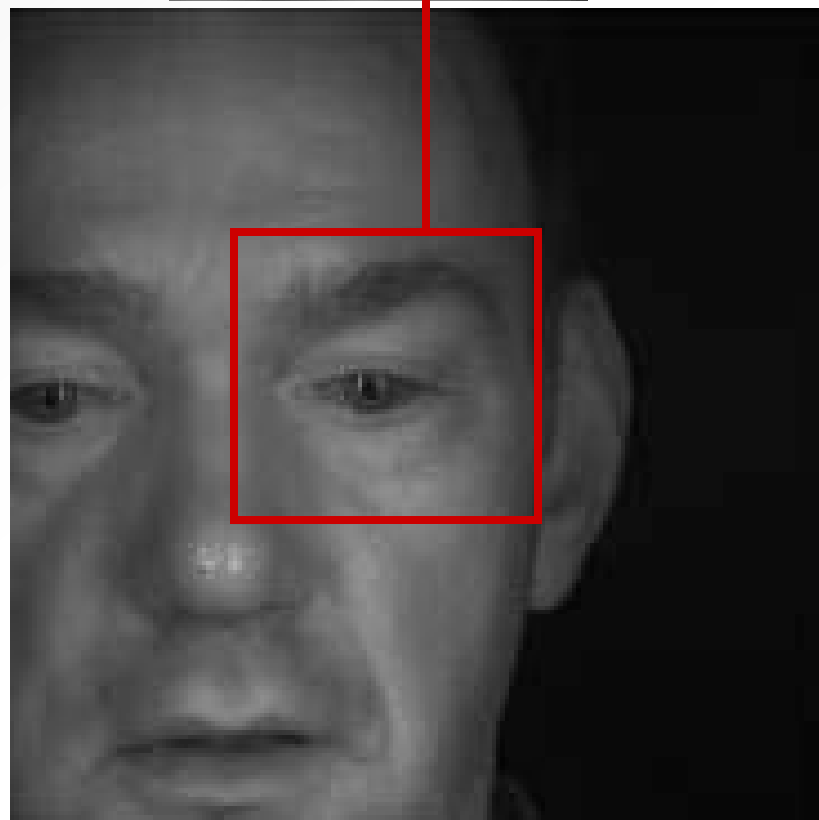
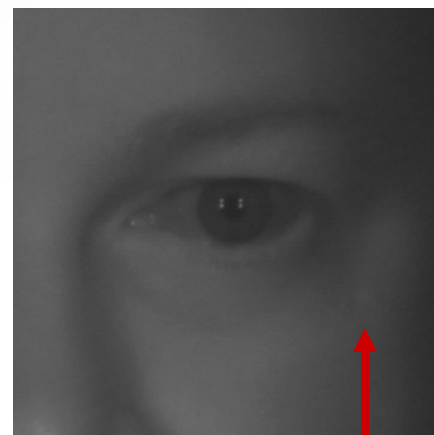
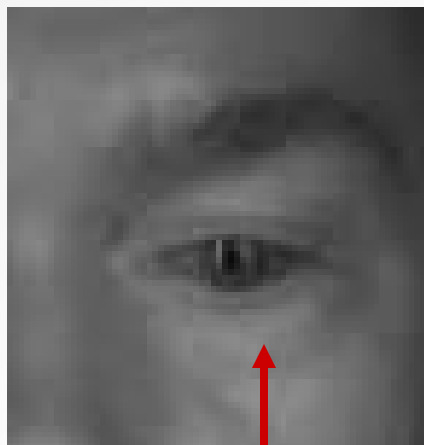
- Individual frames of IOM data can be used increase or decrease the level of difficulty in ocular recognition.
- Measure improvement over iris only recognition algorithm.

# Ocular data from IOM

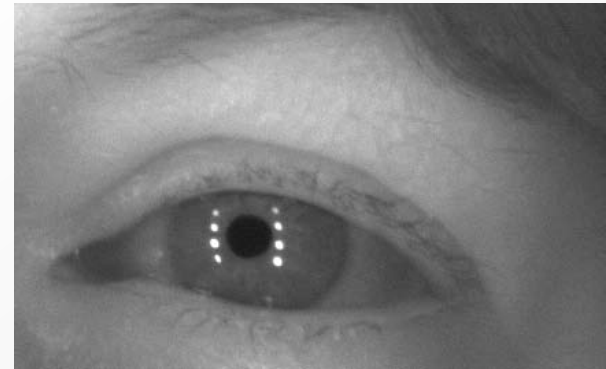
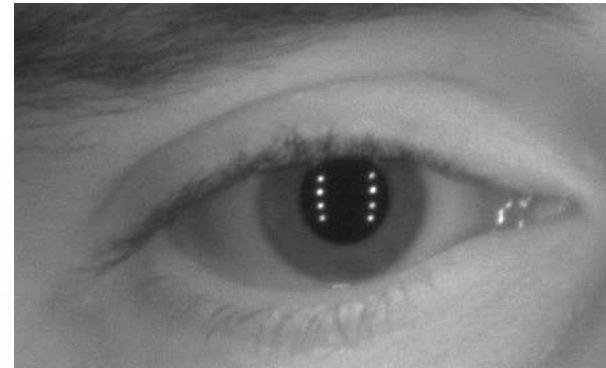
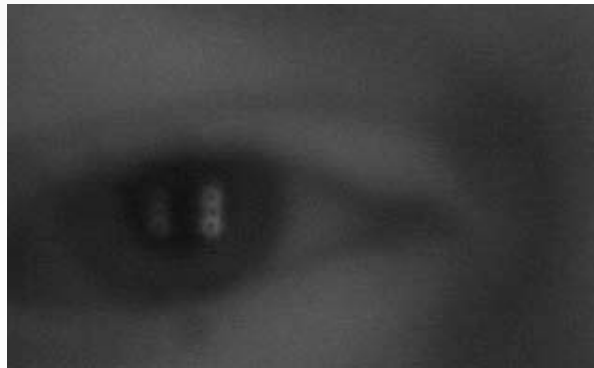
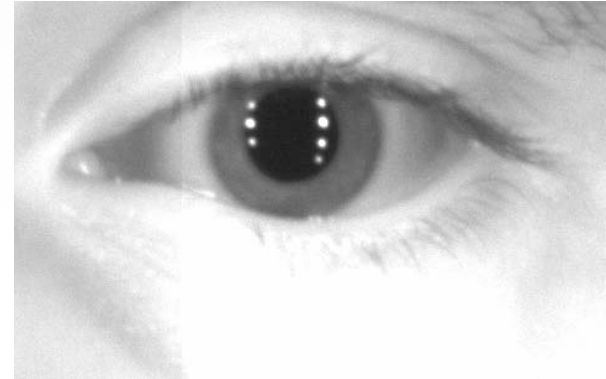
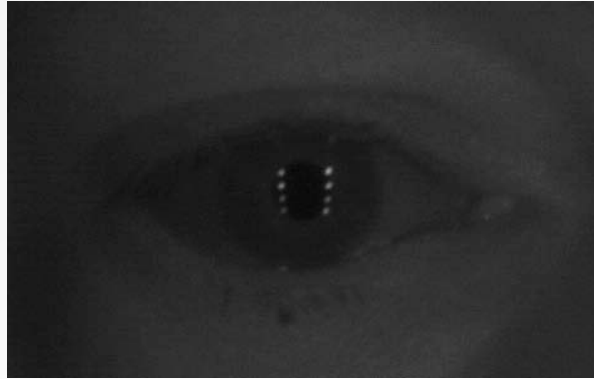




# Ocular data difficulty



# Recognition performed across all combinations

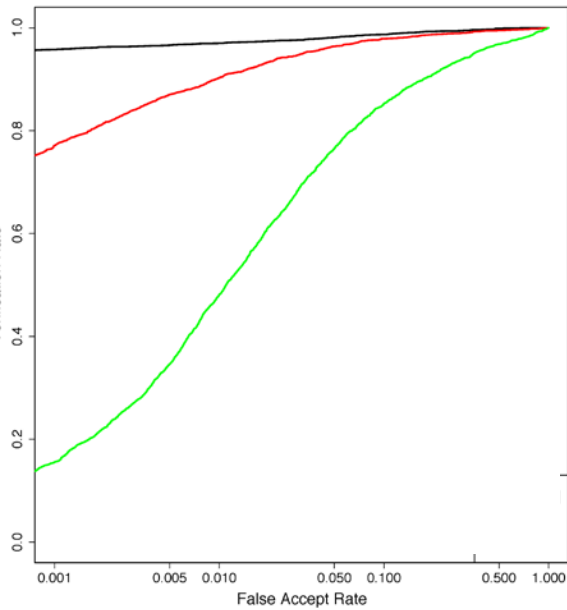


# Predicting Performance

# Predicting Performance

Target Set

Query Set



New Target Set

New Query Set



# Levels of Predictions

- General Assessment
- Measuring Improvement
- Ranking of Algorithms
  - Relative performance
  - Ranking stable across data sets
  - Limited success
- Predict Performance

# Considerations

- Modeling
  - Demographics
  - Acquisition conditions
  - Queries to be processed
- Deep questions
  - Ability to generalize?
  - Specific to algorithm?
  - Specific to task?
- Links
  - Quality
  - Failure/error analysis
  - Biometric-completeness



# Conclusions

- Challenges in Unconstrained Face Recognition
  - Video: MBGC Video Challenge
  - Still: Good, Bad, & Ugly
- Ocular
  - Visible: GBU
  - NIR: At a distance sequences
- Performance Prediction

**Questions?**