

# ICE Phase I test Results Using Multiscale Variable Multisector Method

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# The Object of This Presentation

- Establish the bottom line performance yardstick
- Investigate how enabling algorithms affect the accuracy
  - Iris & Pupil Border Detection
  - Occlusion Location Estimation
  - Image Quality Measure
- Examine the accuracy and robustness of iris recognition algorithms under various circumstances
- Study how to reject bad images in order to achieve (almost) separation

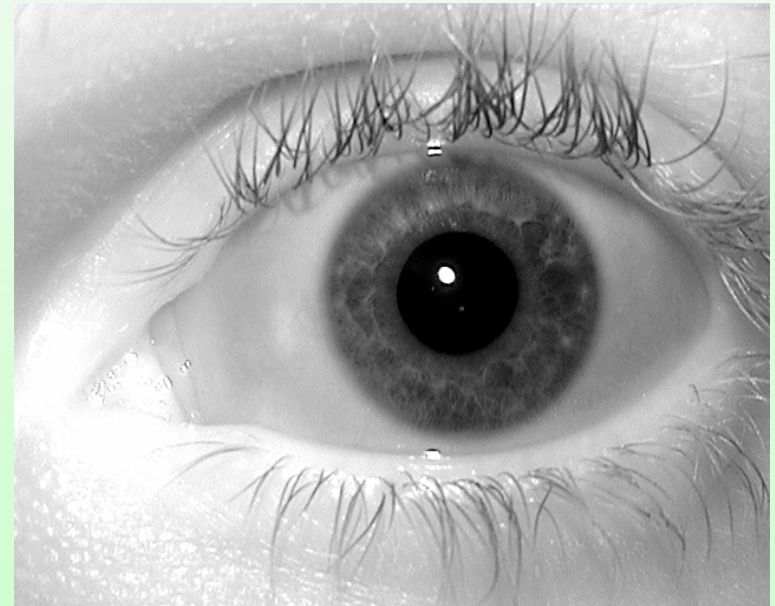
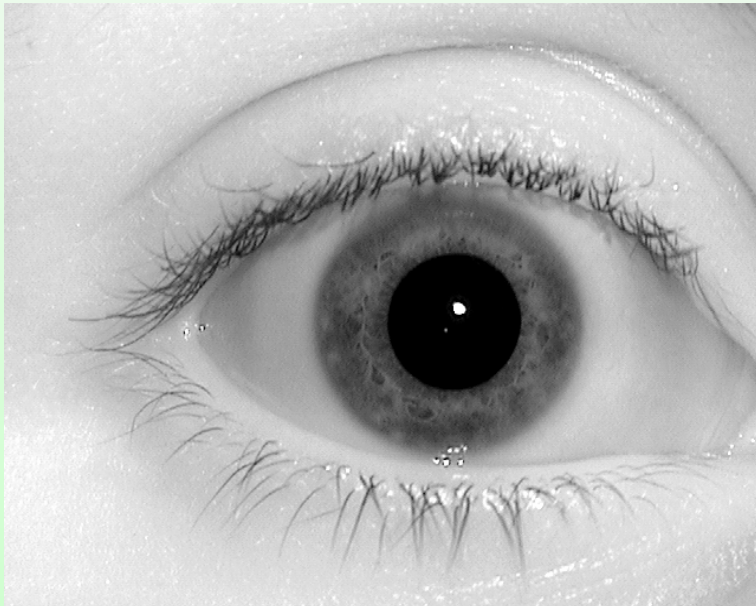
# Classification of Tests

	Iris & Pupil Border Detection	Occlusion Location Estimation	Image Selection
Type A	Manual	Manual	Manual
Type B	Automatic	Manual	Manual
Type C	Automatic	Manual	Automatic by IQ Measure
Type D	Automatic	Automatic	Automatic by IQ Measure

# Image characteristics

» Diverse image qualities

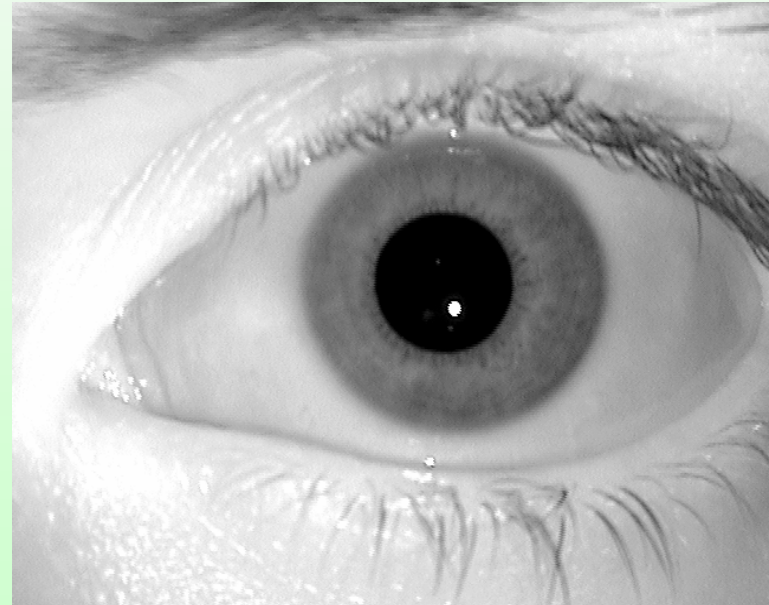
- Sharp



# Image characteristics

» Diverse image qualities

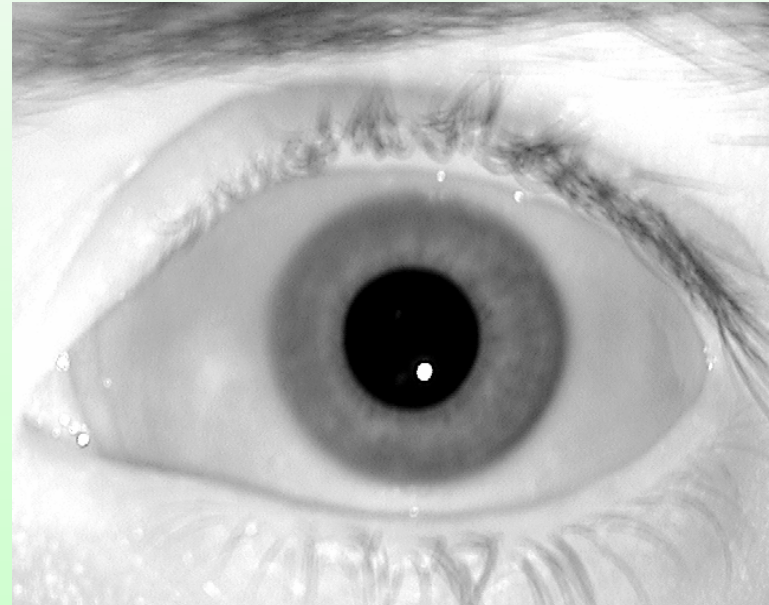
- Reasonably Sharp



# Image characteristics

» Diverse image qualities

- Reasonably Blurry



# Image characteristics

» Diverse image qualities

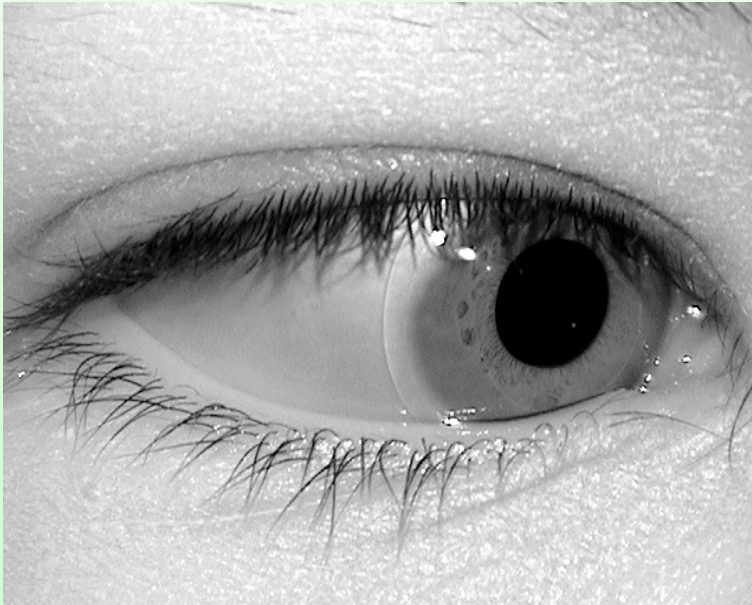
- Quite Blurry



# Image characteristics

» Diverse image qualities

- Side Gazing





# Image characteristics

» Diverse image qualities

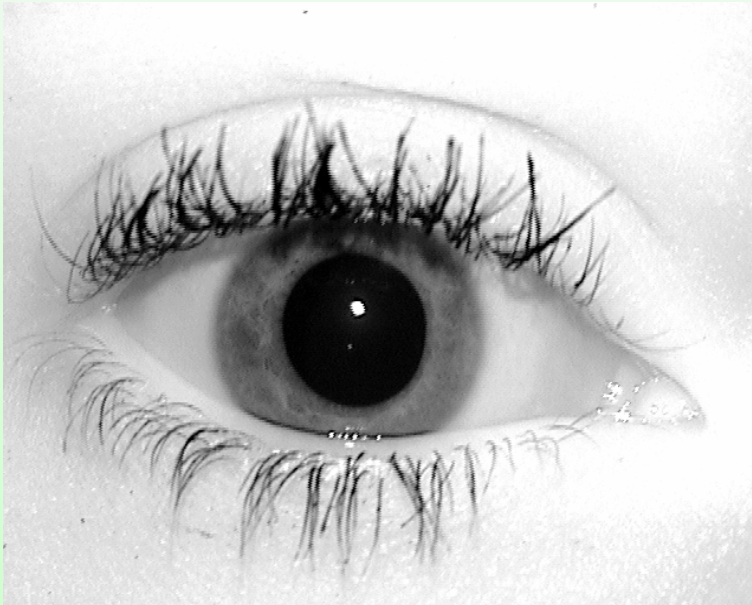
- Wearing Contact Lenses



# Image characteristics

» Diverse image qualities

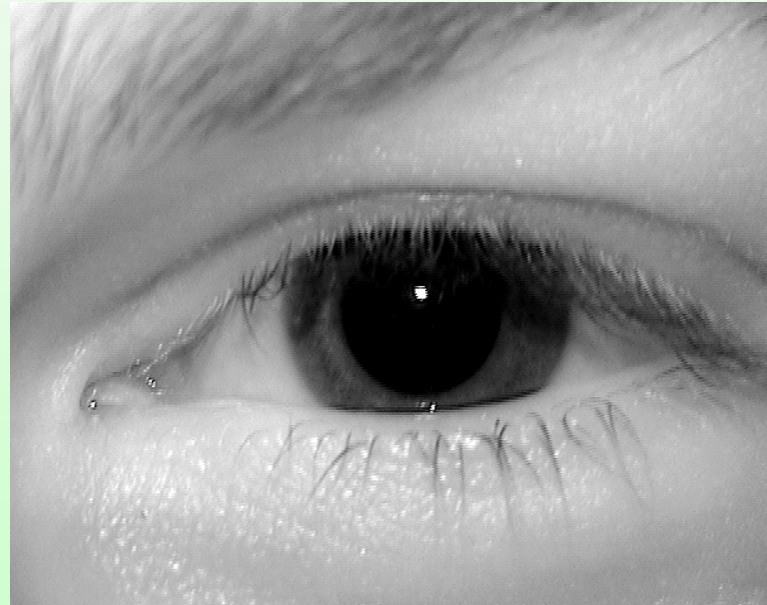
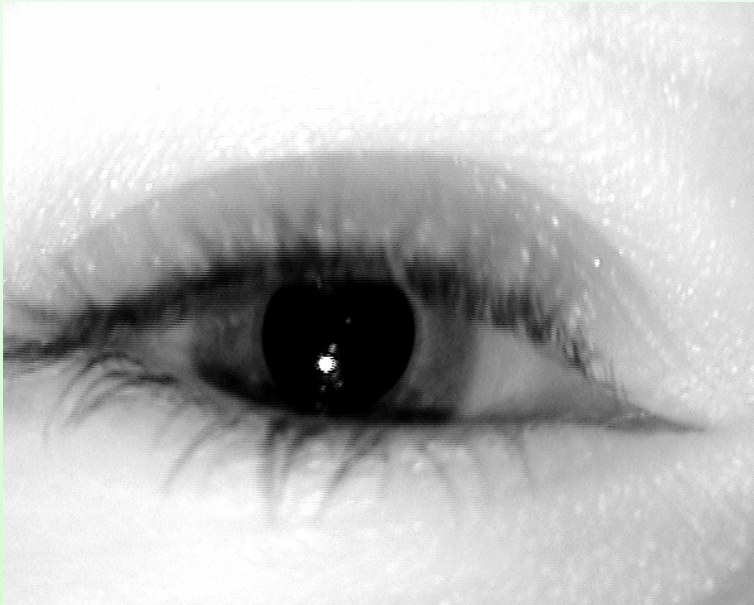
- Reasonably Occluded



# Image characteristics

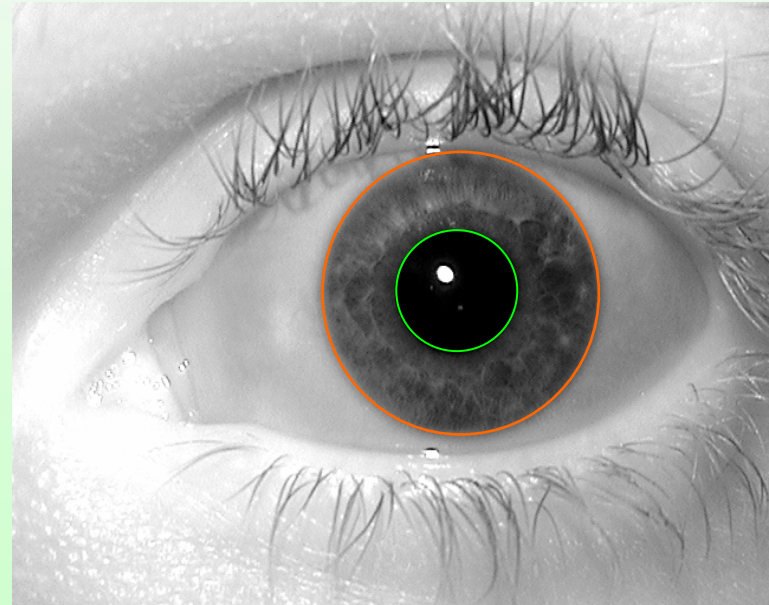
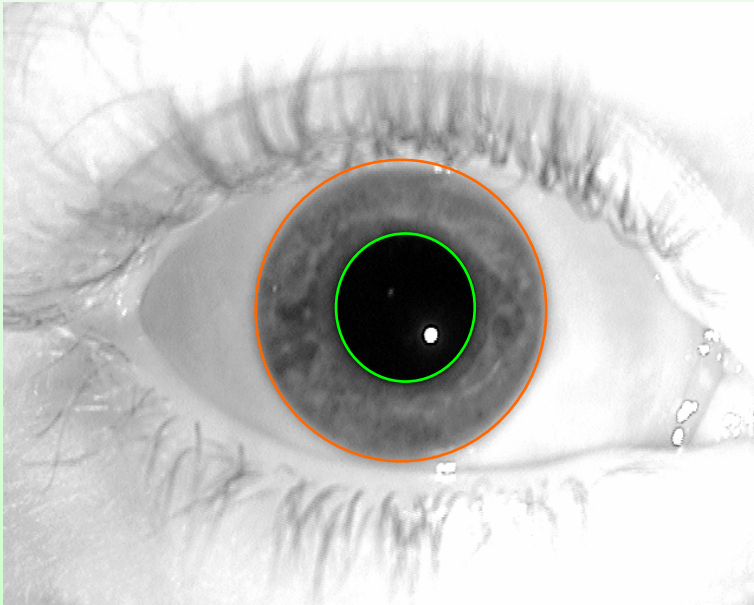
» Diverse image qualities

- Severely Occluded



# Type A Test : Establishing the Bottom Line

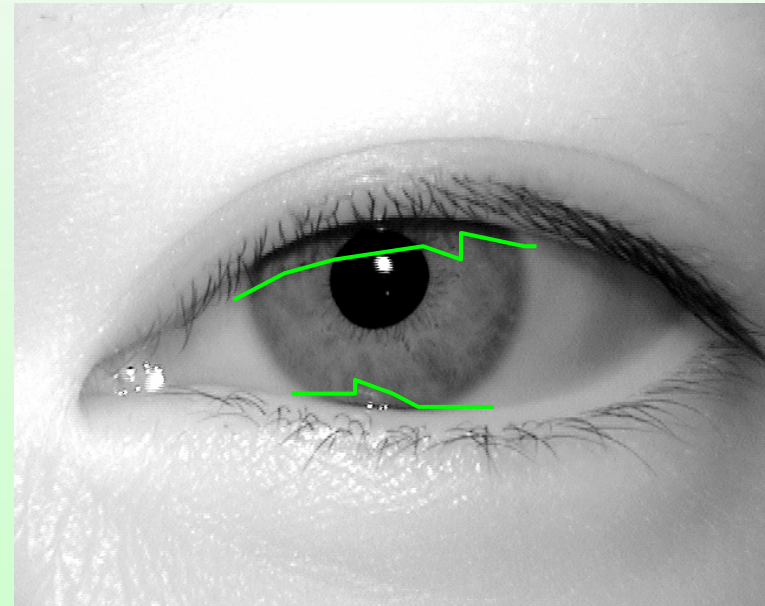
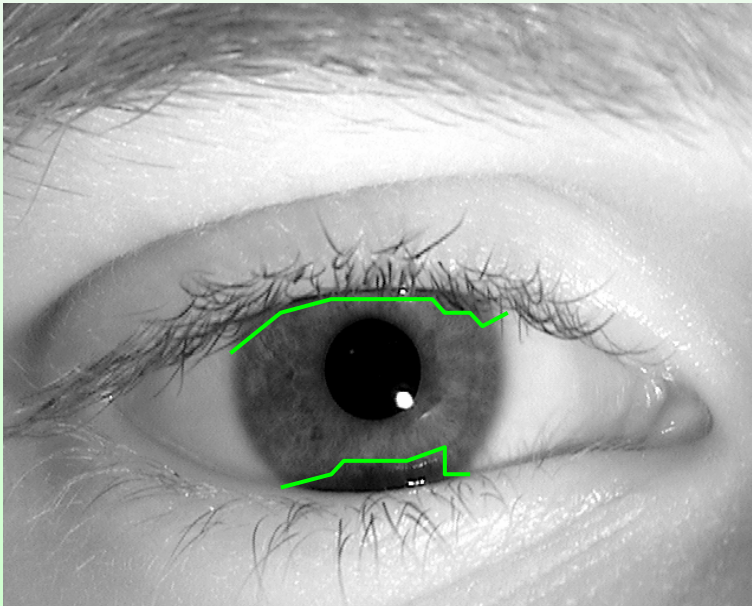
- ◆ Pupil/ Iris Border Detection : Manual



◆ Type A Test

# Type A Test : Establishing the Bottom Line

- ◆ Occlusion Location Estimation : Manual



# Type A Test :

## Establishing the Bottom Line

### ◇ Image Selection

- ◆ Group 1: All images
- ◆ Group 2: All images except very blurry ones
- ◆ Group 3: All images except side gazing ones
- ◆ Group 4: All images except severely occluded one
- ◆ Group 5: Intersection of groups 2, 3, and 4 above contains those images not rejected as very blurry, side gazing, or severely occluded

# Number of Images Rejected

	Group1	Group2	Group3	Group4	Group5
Right	0	9	5	8	22
Left	0	23	5	14	42

# Accuracy

	Group1	Group2	Group3	Group4	Group5
EER	0.0018	0.0015	0.0007	0.0016	0.0000
VR@FAR=0.001	0.9979	0.9984	0.9995	0.9983	1.0000

Right Eye Image

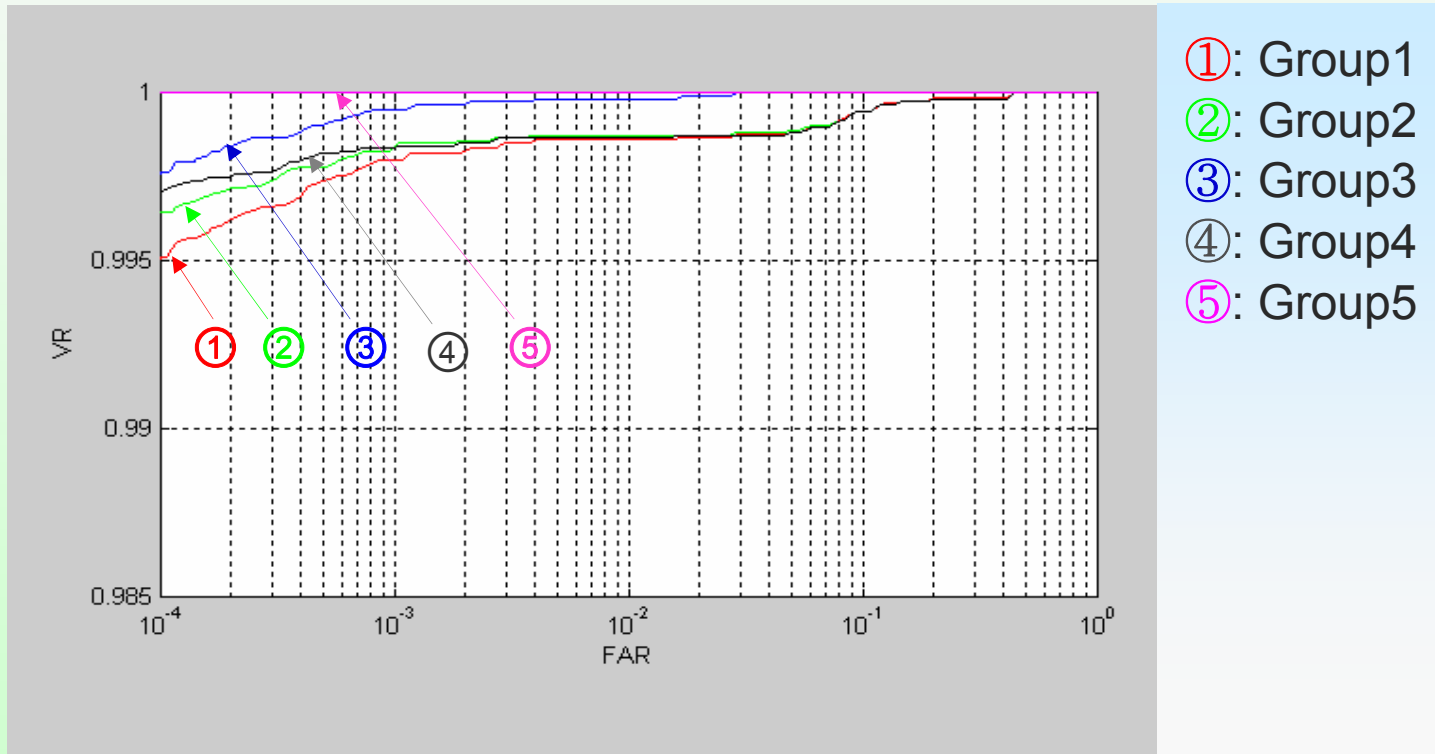
	Group1	Group2	Group3	Group4	Group5
EER	0.0054	0.0030	0.0037	0.0048	0.0001
VR@FAR=0.001	0.9928	0.9967	0.9951	0.9938	1.0000

Left Eye Image

→ Type A Test

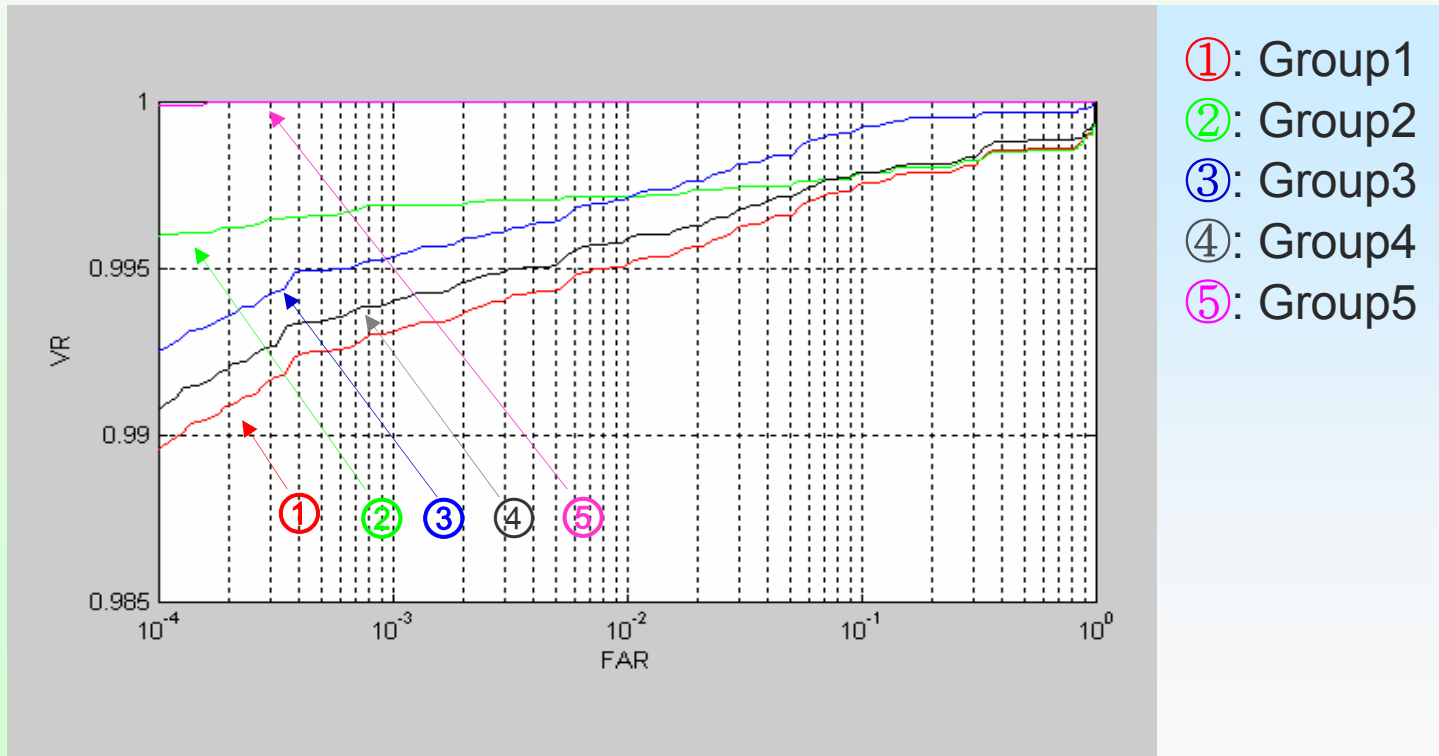


# IQ ROC Curve – Right Eye Images



Type A Test

# IQ ROC Curve – Left Eye images



Type A Test

# Type B Test

- ◇ Pupil/ Iris Border Detection : Automatic  
( Non-circular Boundary)
- ◇ Occlusion Location Estimation : Manual
- ◇ Image Selection : Manual
  - ◆ Group 1: All images
  - ◆ Group 2: All images except very blurry ones
  - ◆ Group 3: All images except side gazing ones
  - ◆ Group 4: All images except severely occluded one
  - ◆ Group 5: Intersection of groups 2, 3, and 4 above contains those images not rejected as very blurry, side gazing, or severely occluded

# Number of Images Rejected

	Group1	Group2	Group3	Group4	Group5
Right	0	9	5	8	22
Left	0	23	5	14	42

# Accuracy

	Group1	Group2	Group3	Group4	Group5
EER	0.0028	0.0025	0.0008	0.0026	0.0003
VR@FAR=0.001	0.9963	0.9970	0.9993	0.9970	0.9997

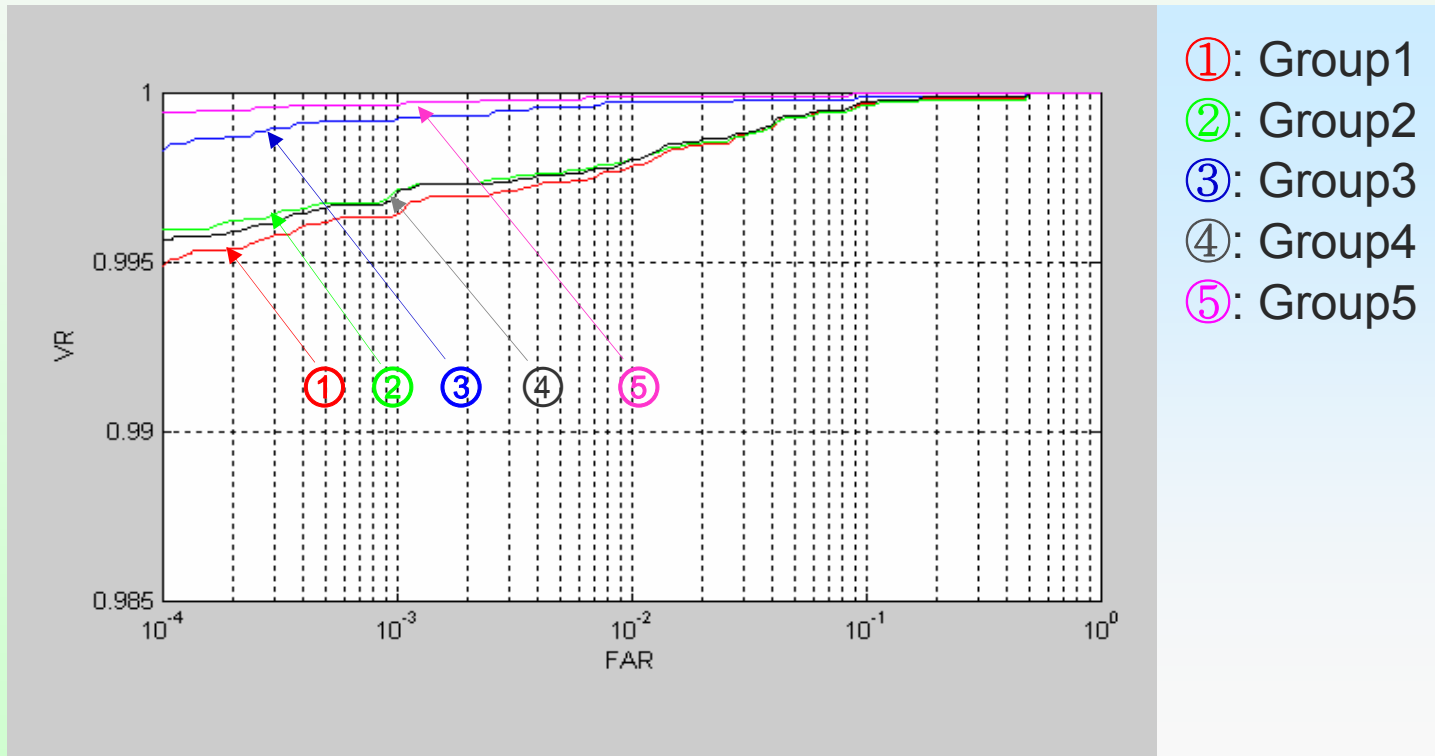
Right Eye Image

	Group1	Group2	Group3	Group4	Group5
EER	0.0070	0.0044	0.0056	0.0051	0.0003
VR@FAR=0.001	0.9910	0.9950	0.9930	0.9937	0.9999

Left Eye Image

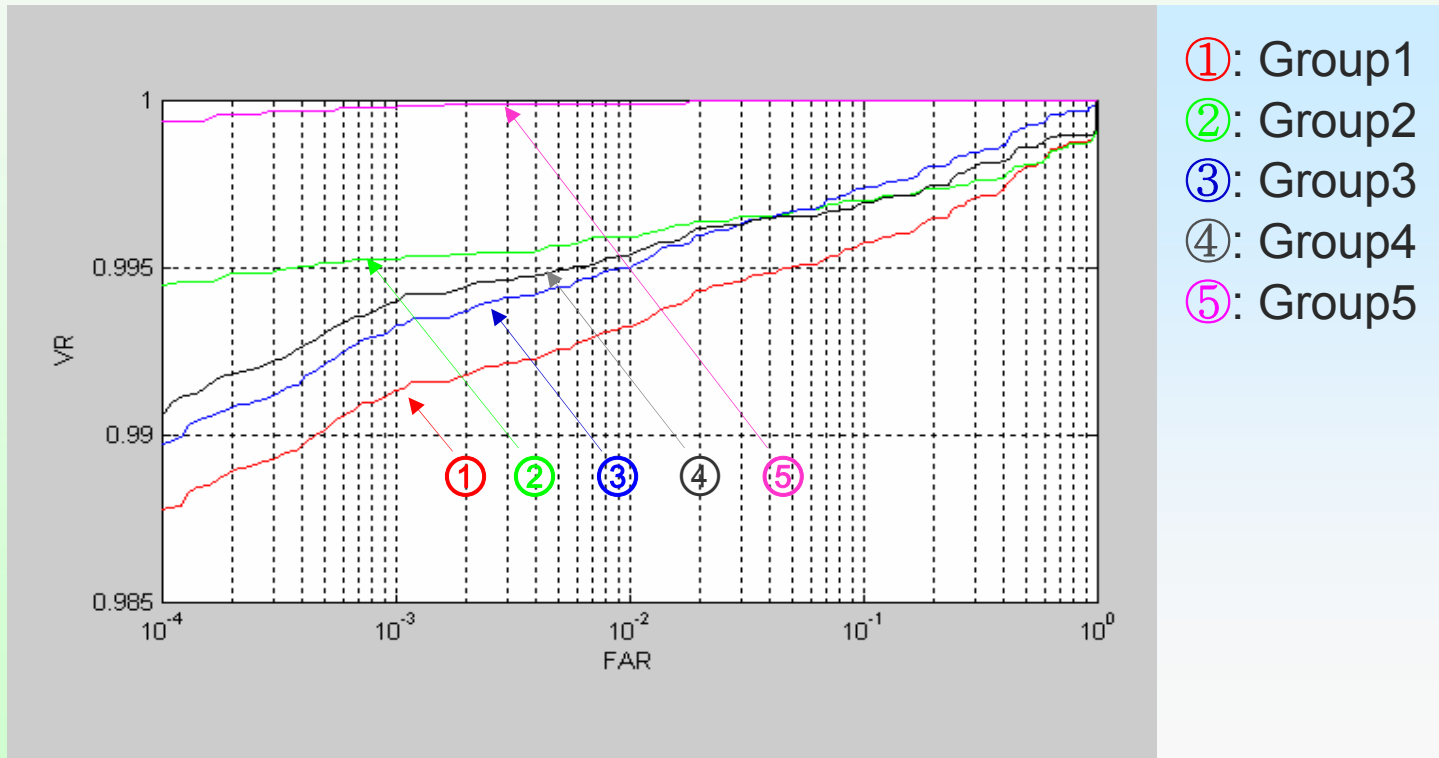
→ Type B Test

# IQ ROC Curve – Right Eye Images



Type B Test

# IQ ROC Curve – Left Eye Images



Type B Test

# Type C Test

- ◇ Pupil/ Iris Border Detection : Automatic  
( Non-circular Boundary)
- ◇ Occlusion Location Estimation : Manual
- ◇ Image Selection : Automatic by IQ Measure
  - ◆ Group 1: All images regardless of the QM value
  - ◆ Group 2: Images whose QM value  $\geq 0$
  - ◆ Group 3: Images whose QM value  $\geq 1$
  - ◆ Group 4: Right Images whose QM value  $\geq 800$   
Left Images whose QM value  $\geq 750$



# Number of Images Rejected

	Group1	Group2	Group3	Group4
Right	0	13	18	62
Left	0	10	20	81

# Accuracy

	Group1	Group2	Group3	Group4
EER	0.0028	0.0008	0.0007	0.0004
VR@FAR=0.001	0.9963	0.9992	0.9993	0.9997

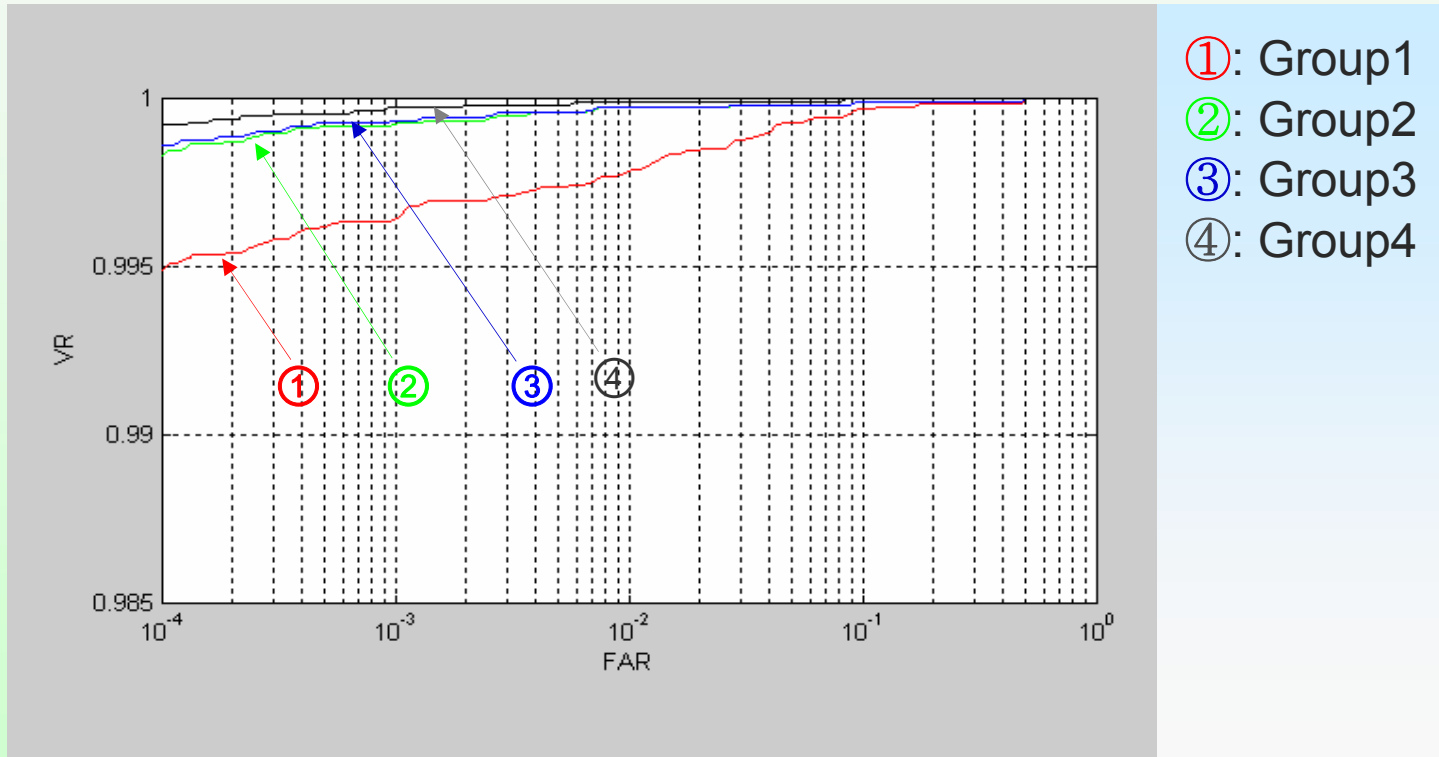
Right Eye Image

	Group1	Group2	Group3	Group4
EER	0.0070	0.0053	0.0044	0.0003
VR@FAR=0.001	0.9910	0.9933	0.9944	0.9998

Left Eye Image

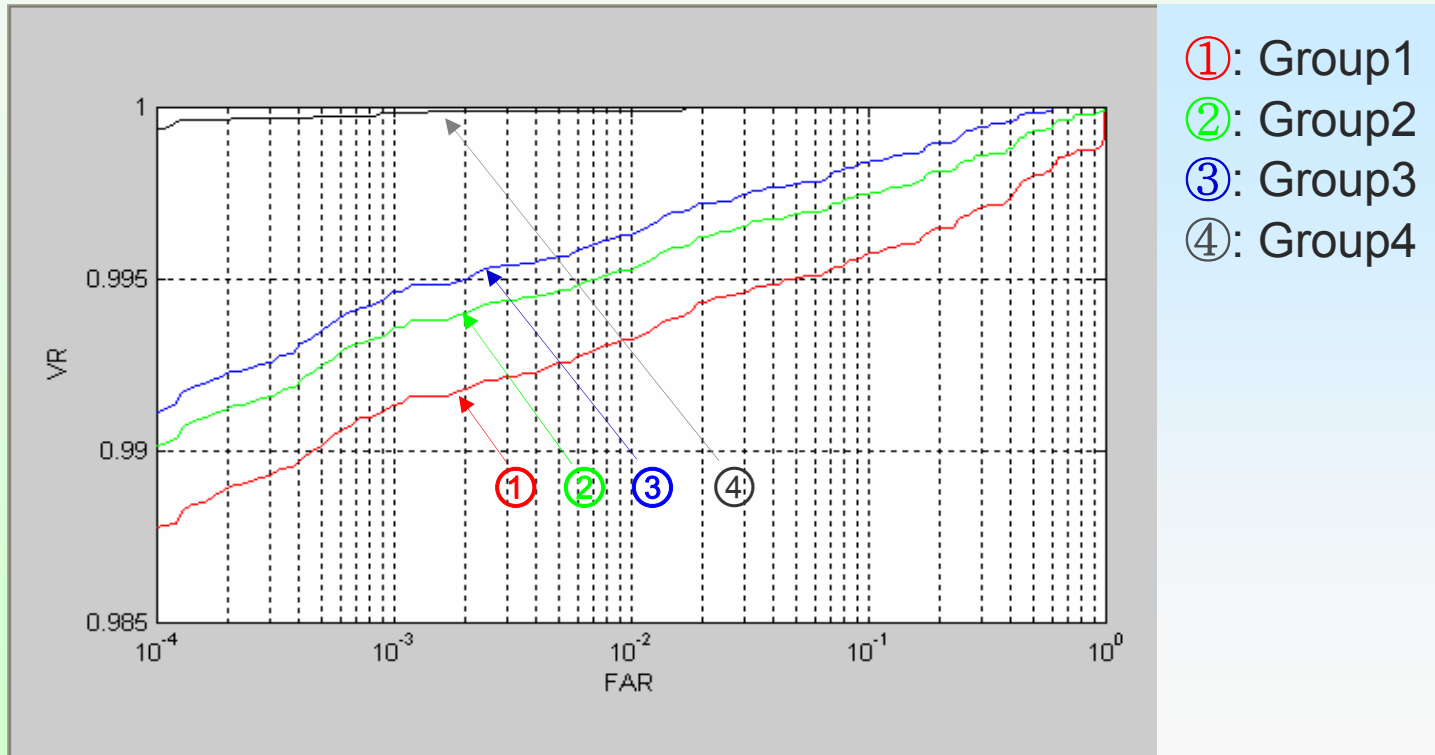
◆ Type C Test

# IQ ROC Curve – Right Eye Images



Type C Test

# IQ ROC Curve – Left Images



Type C Test

# Type D Test : Fully Automatic Test

- ◇ Pupil/ Iris Border Detection : Automatic  
( Non-circular Boundary)
- ◇ Occlusion Location Estimation : Automatic
- ◇ Image Selection: Automatic by IQ Measure
  - ◆ Group 1: All images
  - ◆ Group 2: Images whose QM value  $\geq 0$
  - ◆ Group 3: Images whose QM value  $\geq 1$
  - ◆ Group 4: Right Images whose QM value  $\geq 800$   
Left Images whose QM value  $\geq 750$

# Number of Images Rejected

	Group1	Group2	Group3	Group4
Right	0	13	18	62
Left	0	10	20	81

# Accuracy

	Group1	Group2	Group3	Group4
EER	0.0035	0.0016	0.0015	0.0006
VR@FAR=0.001	0.9953	0.9982	0.9984	0.9994

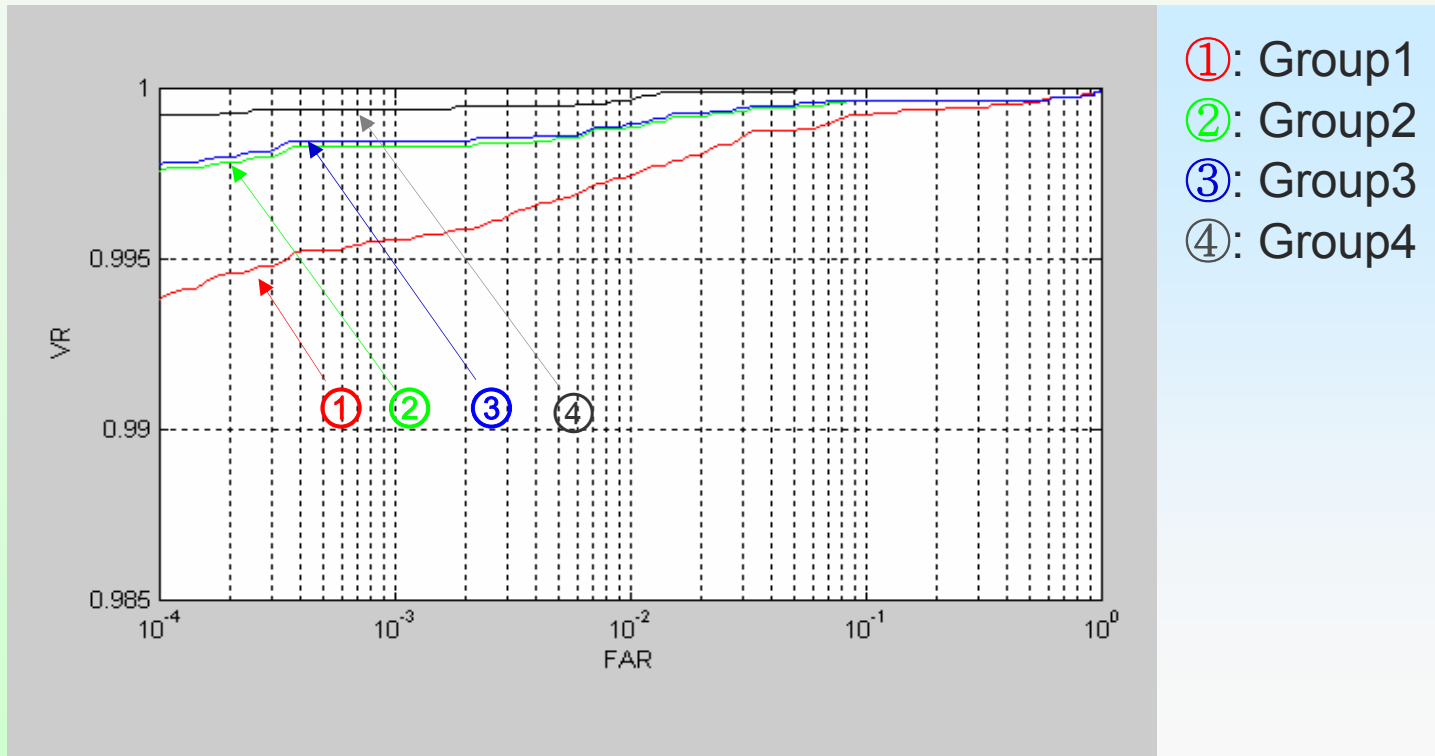
Right Eye Image

	Group1	Group2	Group3	Group4
EER	0.0069	0.0049	0.0042	0.0007
VR@FAR=0.001	0.9906	0.9939	0.9946	0.9995

Left Eye Image

→ Type D Test

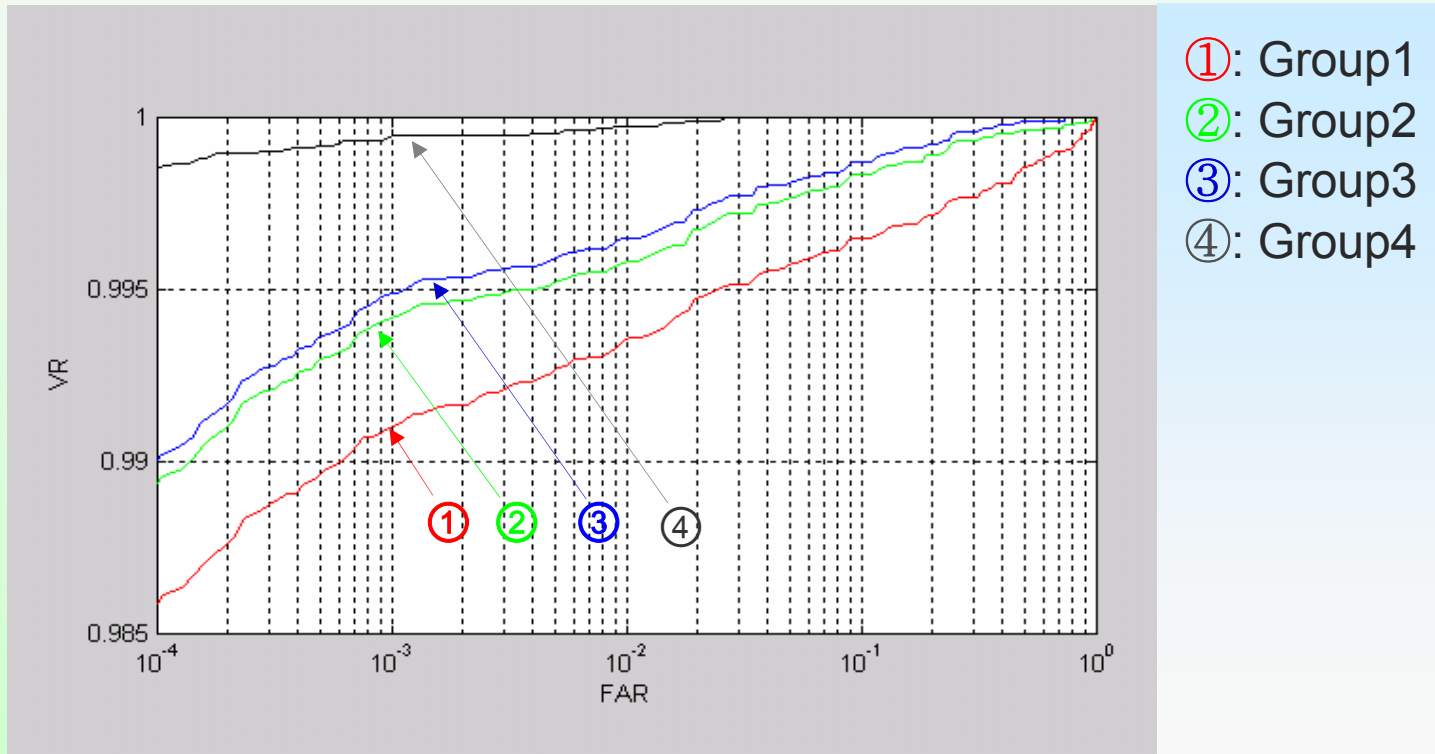
# IQ ROC Curve – Right Eye Images



Type D Test



# IQ ROC Curve – Left Eye Images



- ①: Group1
- ②: Group2
- ③: Group3
- ④: Group4

Type D Test

# The Conclusion

- Iritech algorithm is rather robust and quite accurate
- Automatic pupil & iris border detection has very minor adverse impact on accuracy
- Automatic occlusion location estimation has minor adverse impact on accuracy
- Image quality has major impact on accuracy
  - Image quality measure still has room for improvement

# The Conclusion

- In order to improve the accuracy and robustness of iris recognition, it is necessary to use
  - Both eye
  - Multiple frames
  - Utilize more sophisticated decision process rather than a simplistic single scalar quantity to describe the image quality