

The push towards zero error biometrics

NIST Forensic Symposium

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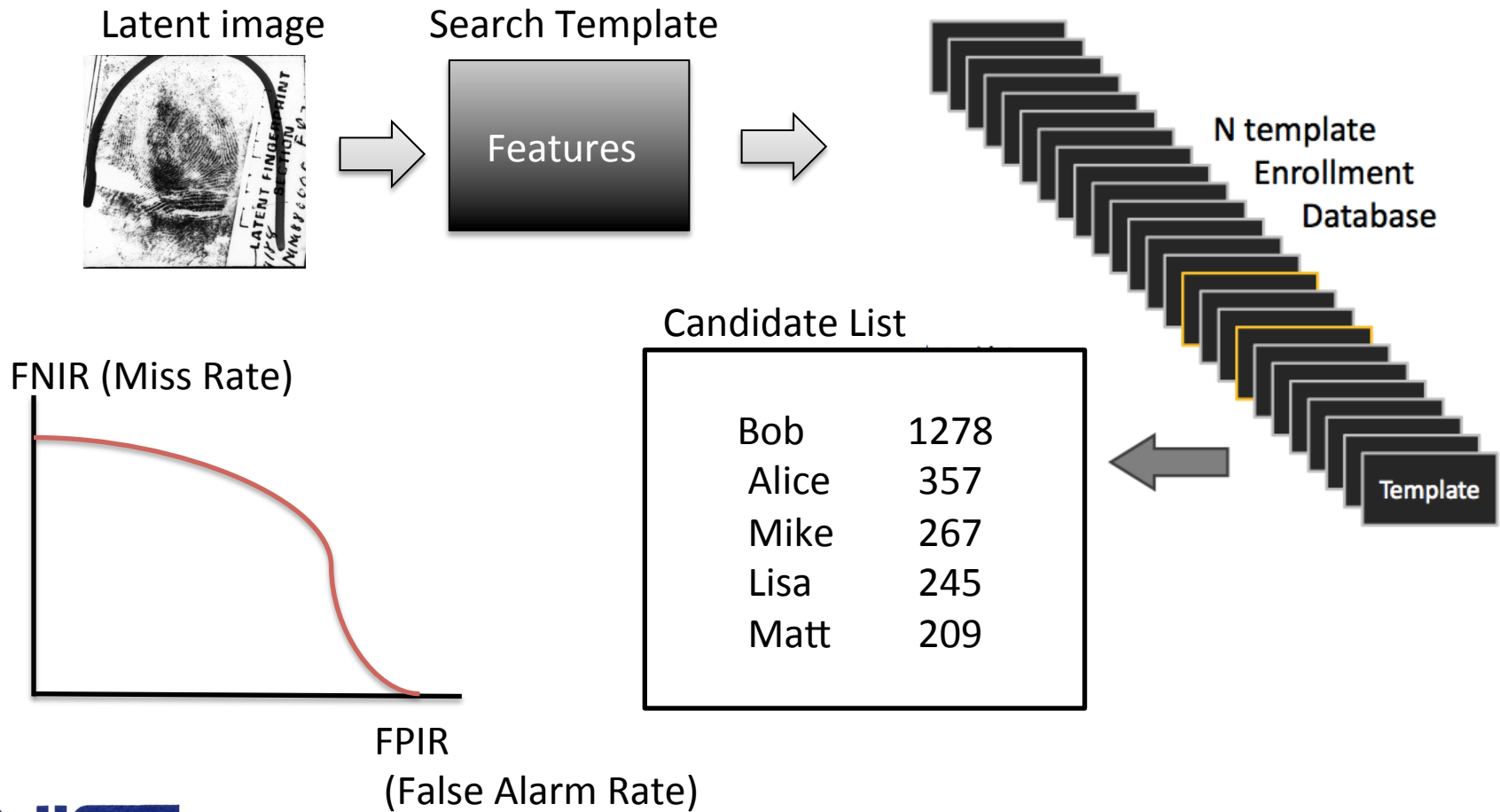
Information Technology Laboratory

Friday, November 30, 12

Open set 1:N Search



1:N Latent Search



ACE-V

Analysis

Value Determination (VID, VOE, NV)



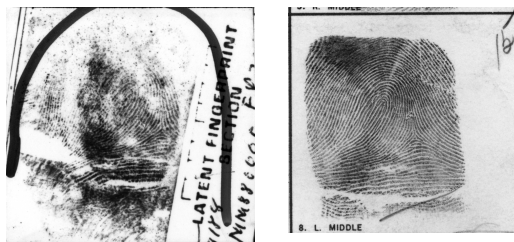
Feature Markup (EFS)



1:N search (AFIS)

Comparison

Candidate Pairs



Level-1 detail
Level-2 detail
Level-3 detail

Evaluation

Individualization

Exclusion

Inconclusive

Verification

Analysis



Comparison



Evaluation



Validate or Reject the conclusion

Quality of latent, Quality of the exemplar and the size of the overlap area between the two play significant role in accuracy and reliability of the conclusion.

If the exemplar is not of sufficient quality, the conclusion should be Inconclusive.

Need for numerical evaluation of quality

- » To supplement the fingerprint examination process by one that has a statistical model, supported by appropriate databases for calculating numerical measures of weight of evidence
 - Perhaps based on automatic latent recognition algorithms
 - Some of VEO or NV were successfully identified by latent comparison algorithm. (NIST ELFT- EFTS).

- » Resolve the variability among the examiner's value determination
 - For 356 latents, unanimous value determination achieved 43%.
 - 85% of NV decisions and 93% of VID decisions were repeated by the same examiner after a time gap while only 55% of VEO decisions were repeated. (*Ulery et. al – PNAS 2011*).

- » While acknowledging the overall reliability of the conclusions of majority of fingerprint comparisons performed over the past century, and their contribution to the criminal justice system

Lights-out Latent search



Nov30 - The 177th birthday of Mark Twain



Quality assessment for error suppression

- » Quantify information content of latent
 - Suitable for automatic feature markup or manual?
- » Quantify quality of the reference print
- » Reliability of latent to reference comparison
 - Sufficient overlap area?

Quality assessment for error suppression

Reference print

- » Quantitative assessment of utility of the friction ridge print.
 - Is this suitable for matching?
 - NFIQ, others.
- » By numbers:
 - 34.5% of operational IAFIS exemplars are of low quality (NFIQ 3,4,5).

(Ulery, et. Al PNAS 2011).



Crime scene Latent print

- » Quantitative assessment of information content of the latent.
- » Latents recovered from crime scenes are often limited in size, of poor quality, distorted and affected by interference from the substrate.
- » A growing body of literature questions scientific foundation and transparency of the evaluation of the weight of evidence associated with any particular fingerprint comparison
 - Zbell (2005); Office of the US Inspector General (2006); Saks and Koehler (2005, 2008); National Research Council of the National Academies (2009)
- » Recent related work
 - On latent fingerprint Quality Yoon, Liu, Jain, 2012
 - Quantifying the weight of evidence from a forensic finger- print comparison: a new paradigm, C. Neumann, 2011

What is `quality`?

`standard' definition

quality

the degree to which a biometric sample fulfils specified requirements for a targeted application

NOTE: Specified quality requirements may address aspects of quality such as focus, resolution, etc. Implicit quality requirements address the likelihood of achieving a correct matching result.

quality score

a quantitative expression of quality

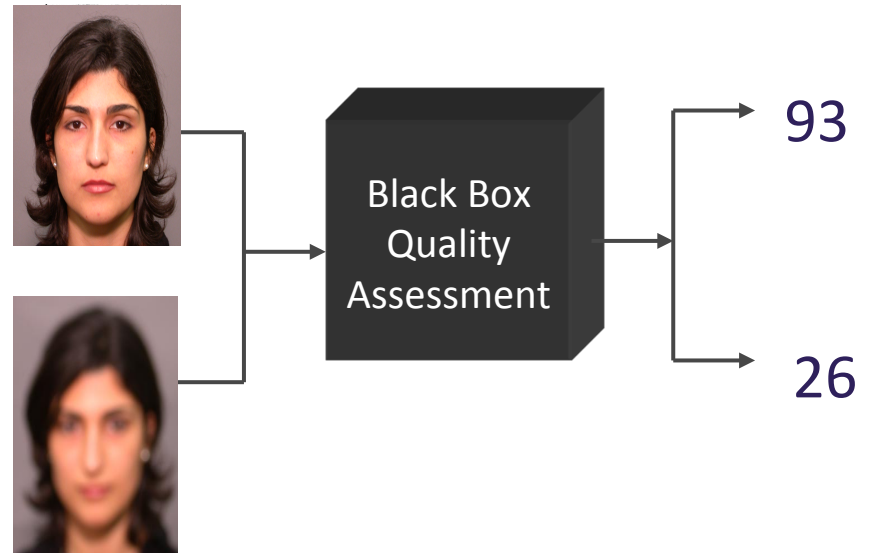
utility

the observed performance of a biometric sample or set of samples in one or more biometric systems

NOTE: The character of the sample source and the fidelity of the processed samples contribute to—or similarly detract from—the utility of the sample

NOTE: Utility may combine performance measures such as FMR, FNMR, failure to enrol rate, and failure to acquire rate

Predictive of performance

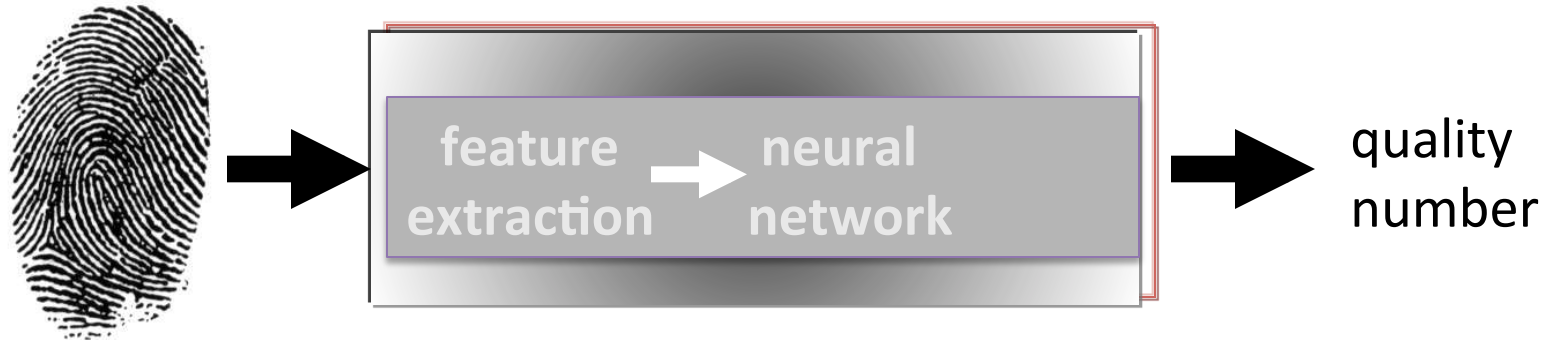


A biometric quality assessment method derives a numerical quality value from an input biometric sample. The quality value is related to the biometric error rates that are likely to be realized when the sample is matched.

NIST fingerprint image quality (NFIQ 1.0)

- » NIST developed NFIQ in 2004
 - Open source, publicly available
- » Has become the de-facto standard
- » Key innovation: quality as a rank statistic for performance
- » NFIQ is a machine learning algorithm
 - Exploratory variables: image properties (minutiae, ridge clarity)
 - Response variable: separation of genuine and impostor comparison

NIST Fingerprint Image Quality



- » **feature extraction:** computes appropriate signal or image fidelity characteristics and results in an 11-dimensional feature vector.
- » **neural network:** classifies feature vectors into five classes of quality based on various quantiles of the normalized match score distribution.
- » **quality number:** an integer value between 1(highest) and 5 (poorest).

NIST Fingerprint Image Quality

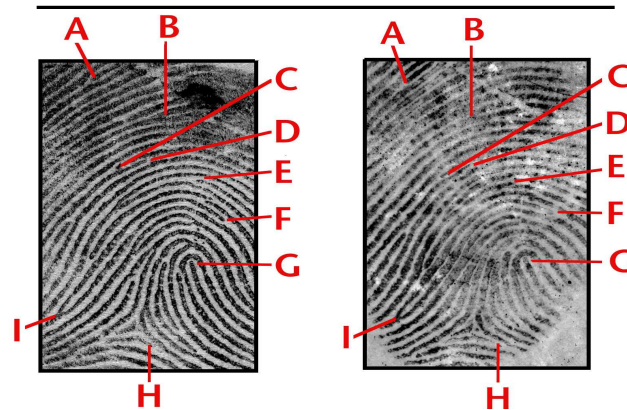


NFIQ's 5 levels of quality are intended to be predictive of the relative performance of a minutia based fingerprint matching system.

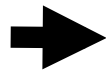
NFIQ=1 indicates high quality samples, so lower FRR and/or FAR is expected.

NFIQ=5 indicates poor quality samples, so higher FRR and/or FAR is expected.

NFIQ – feature vector



gray scale
fingerprint
image



- 1 total # of minutia
- 2 #of min. with $q \geq .5$
- 3 #of min. with $q \geq .6$
- 4 #of min. with $q \geq .7$
- 5 #of min. with $q \geq .8$
- 6 #of min. with $q \geq .9$

- 7 size of foreground
- 8 quality zone 1
- 9 quality zone 2
- 10 quality zone 3
- 11 quality zone 4

NFIQ 1.0 – training

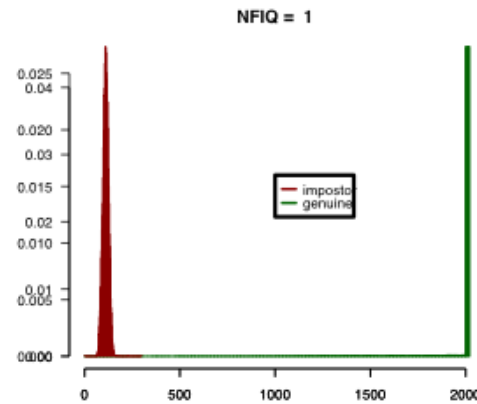
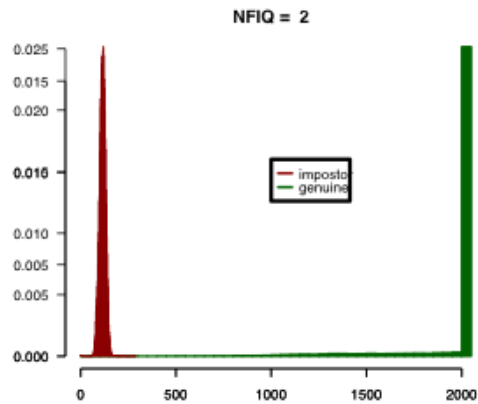
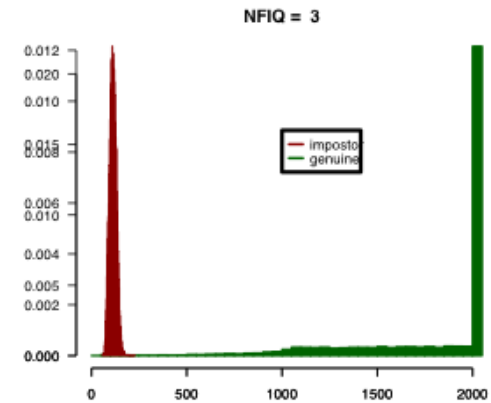
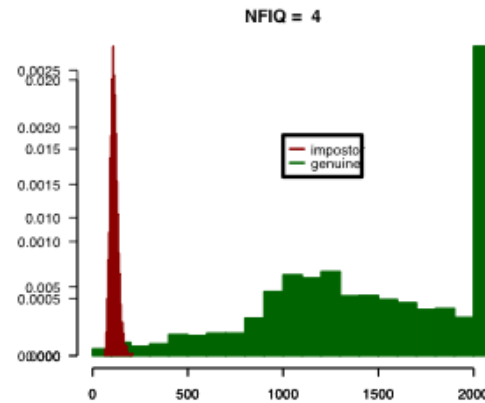
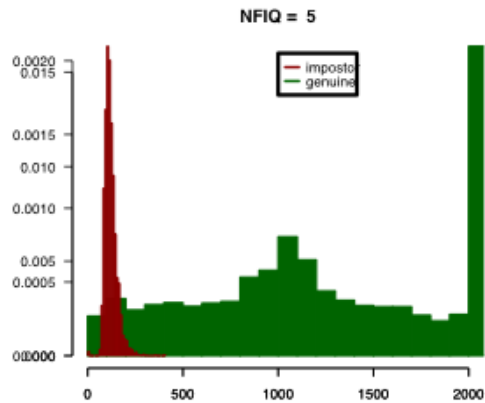
11dimensional
feature vector →

training: 3900
images of flat
index fingers and
thumbs

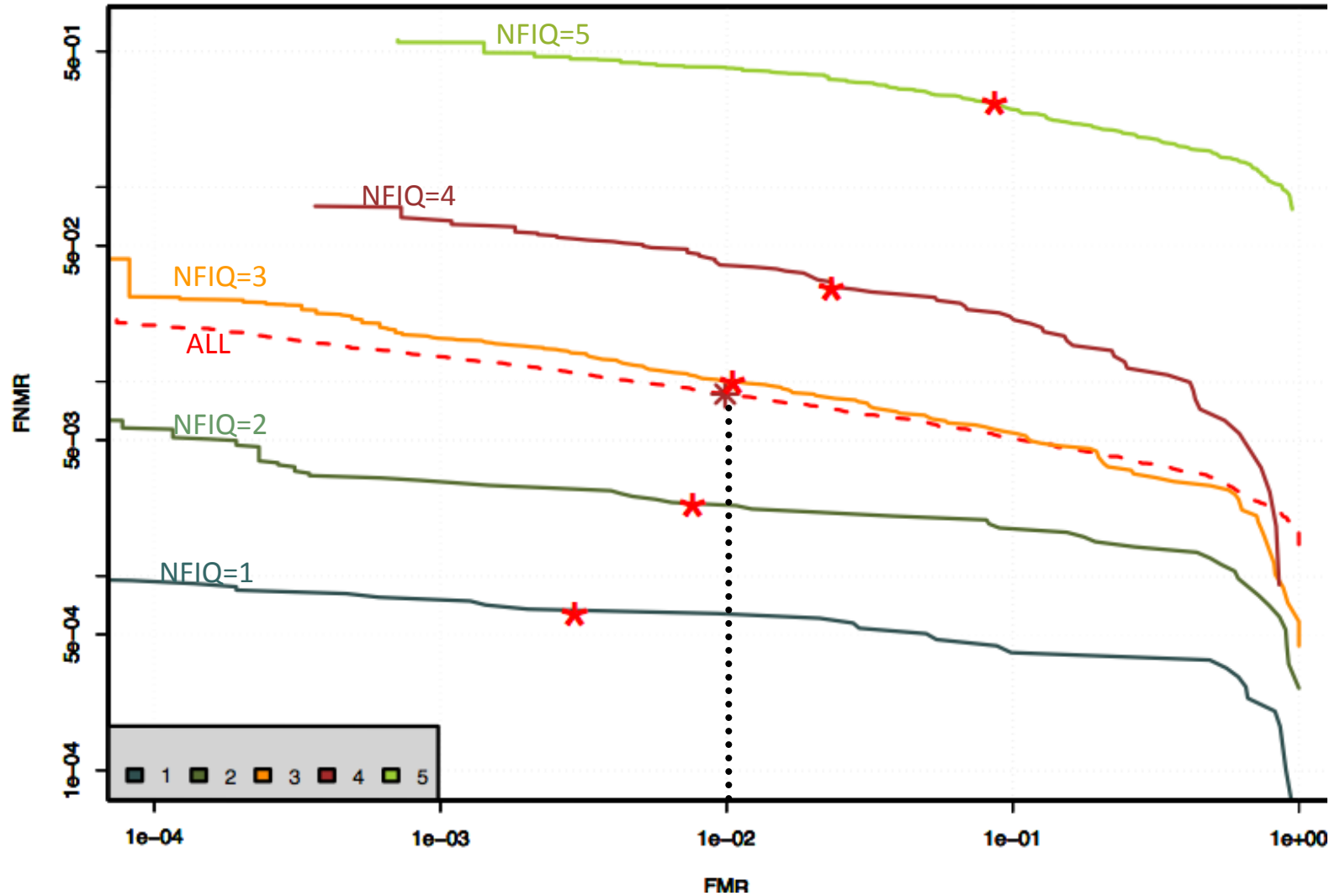
A full similarity
matrix of the
training set is
needed to
compute the
output class of
neuralnetwork.

→ quality number
{1,2,3,4,5}
1 is the best and
5 is the poorest

Separation of genuine and impostor distribution



NFIQ – rank statistic for performance



NFIQ 1.0 – test of time

+

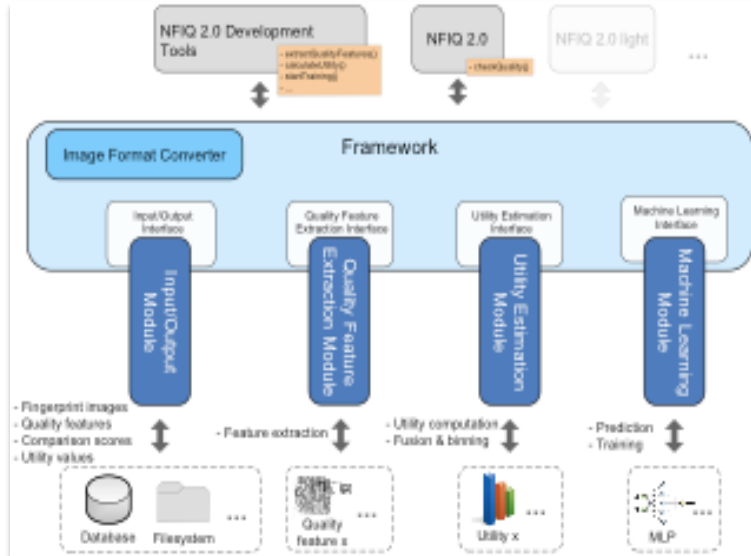
- » Novel definition of biometric quality
 - performance related
 - accepted by the community
- » Interoperability
 - uniform interpretation
 - tuned to a class of matcher
- » Open source
- » Extensively examined
 - by NIST and others
 - tools for quality summarization, slap, ...

-

- » Aging
 - recognition technology has advanced since 2004.
- » Efficiency
 - ~300 msec per image - not fast enough for real time
 - takes 4 times for 4-finger slap
- » Not enough levels
 - Still statistically significant
- » Insensitive to partial prints

NFIQ 2.0

http://www.nist.gov/itl/iad/ig/development_nfiq_2.cfm

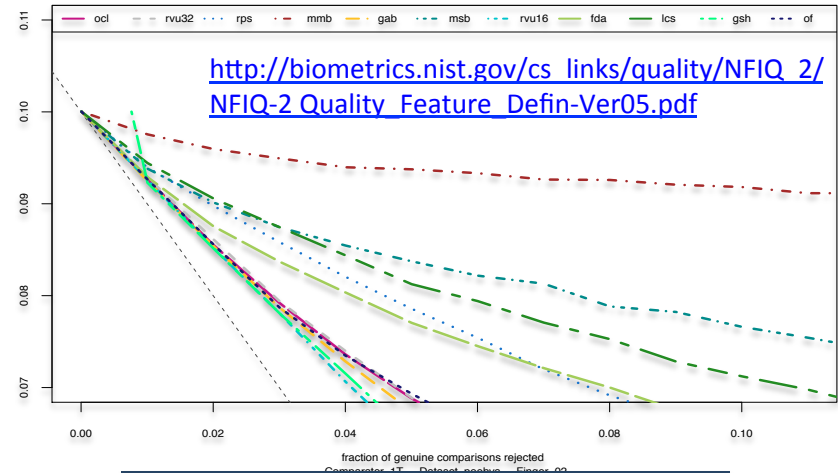


Modular Architecture

Flags to identify:

- Fingerness
- Completeness
- Wrong Phalanges
- Centerness
- Low/high pressure
- Alteredness

Actionable feedback



'Standardized' features (ISO/IEC 29794-4)

NFIQ Lite

- Fast for Mobile applications
- Use of innovative methods such as self organizing map

Mapping curves

- With NFIQ 1.0
- Calibration curve for each NFIQ 2.0 comparator participants.

Tools

Uses of quality assessment

Subject presentation

- Improper presentation detection
- Presentation attack detection

Acquisition device

- Hardware built-in. Quality in capture loop.
- 'peak' imaging capability
- No control on FTA - Hard to tweak to certain applications

Beyond scanner

- Automated (e.g., NFIQ) or visual by human
- Automated at client-side or backend
- Actionable feedback for re-capture

Operator review

- Particularly for high value images
- It is expensive
 - Requires training of operators + takes time

Allows for

- Adopting threshold for specific scenario
- Monitoring Seasonal variations, atypical collection site/queue/device, etc.

Quality in large scale deployments

National

- » DHS US-VISIT
- » Low enforcement
 - FBI CJIS
- » DoD

International

- » Unique Identification Authority of India
- » EU-VIS
- » Law enforcement (Germany BKA)
- » E-passport

Available Quality Assessment Algorithms

NIST Open source implementation

» Finger

- NFIQ (circa 2004)
 - www.nist.gov/itl/iad/ig/nbis.cfm
 - NIST IR 7151
- Next Generation NFIQ (NFIQ 2.0) underway
 - www.nist.gov/itl/iad/ig/development_nfiq_2.cfm



- Latent

» Iris

- Not yet, but in near future
 - NIST Iris Image Quality (NIIQ)
 - Some methods are documented in technical literature



Face

- Not yet – no plans yet.

Proprietary implementation

» Needs testing

- Their effectiveness in predicting performance have to be evaluated.

» Need calibration

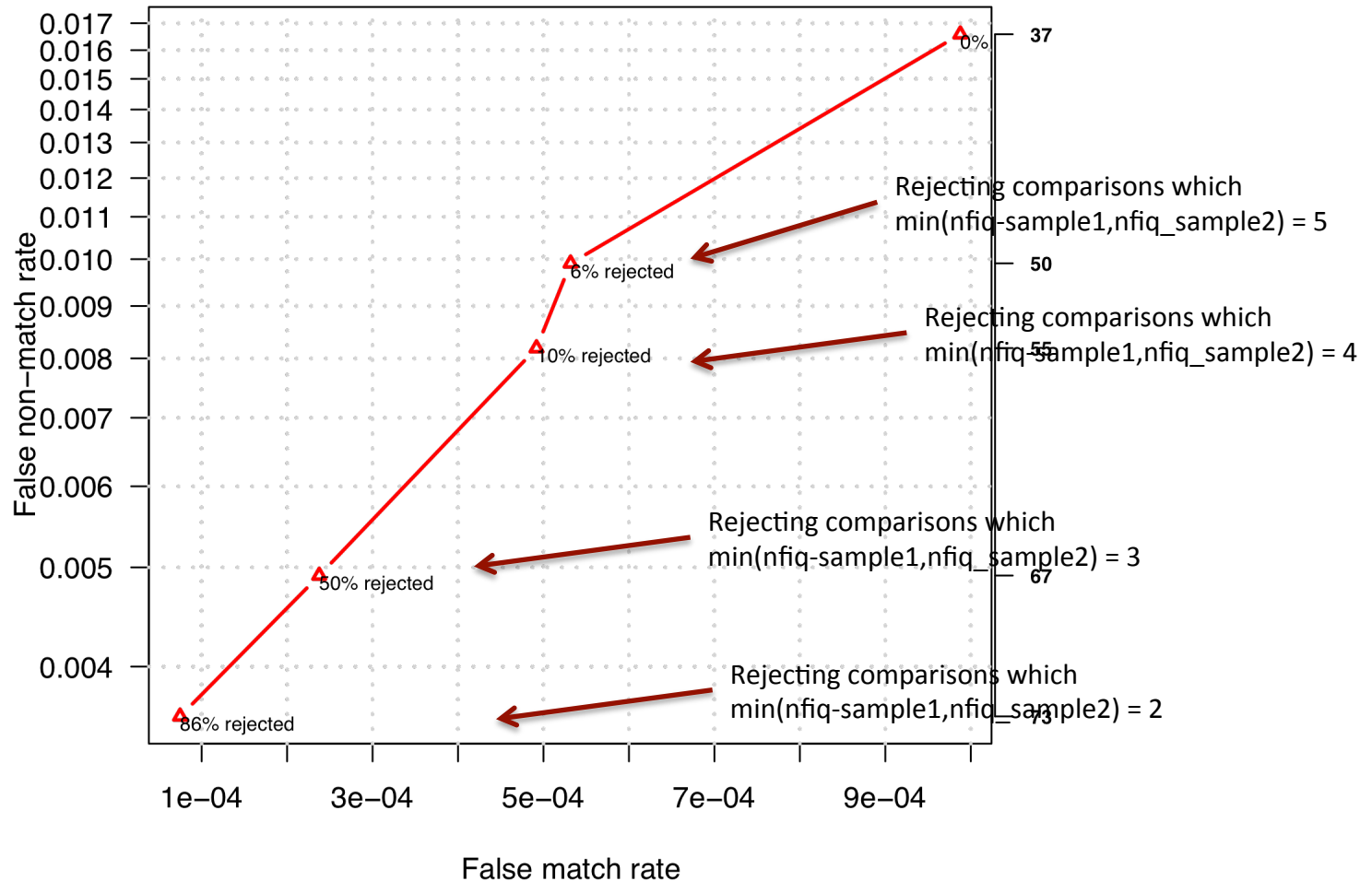
- To interpret scores
- To achieve interoperability

» Issues with vendor lock-in

Academia? Others?

Calibration

Calibration Curve
Quality : nfiq Dataset : poe



Challenges

- » Pairwise Q
- » Computation time
- » Different matcher – different sensitivities
- » Limitation on available data, particularly data with know degree of specific impairments

WE, AT NIST

Focus and Impact

NIST Biometric Quality Program Push Towards Zero Error Biometrics

Strengthening Science	Advancing metrology	Developing Standards	Developing Tool Box	Best Practice Guidance	Enumerative Bibliography	Coordination+ Collaborations
<p>Failure Analysis</p> <p>Identifying the likely causes of recognition error, quantifying their effect and ways to mitigate them.</p>	<p>Performance Evaluation</p> <p>Quantitative means of assessing performance of quality assessment algorithms (IREX II IQCE)</p>	<p>Requirements Specifications</p> <p>On image properties affecting performance, and on capture device</p>	<p>Open source Public domain</p> <p>Reference implementations of quality assessment algorithm, iris segmentation</p>	<p>Instructional + Guidance</p> <p>Materials for quality score summarization + Best capture practice + example images of various quality</p>	<p>Technical Literature</p> <p>Reports, white papers, publications relevant to biometric quality and iris image quality in particular</p>	<p>Workshops, Conferences</p> <p>Grants (WVU, NYU Poly)</p>
Research	Evaluation	Standard	Software	Report	Webpage	
<p>NIST IR 7155</p> <p>ICIP 2005</p> <p>NIST IR 7820</p>	<p>NIST IR 7820</p> <p>PAMI 2007</p> <p>ICPR 2010</p>	<p>ISO/IEC 29794</p> <p>ISO/IEC 19794</p>	<p>NFIQ 1.0</p> <p>NFIQ 2.0</p> <p>NIIQ 1.0</p>	<p>NIST IR 7422</p> <p>NIST IR 8XXX</p>	<p>www.nist.gov/itl/iad/ig/bio_quality.cfm</p>	<p>BQW 2006, 07</p> <p>IBPC 2010, 12</p> <p>NFIQ 2010,12</p>

Thanks

Sponsors



Collaborators + NFIQ 2.0 partners



