

# Biometrics and Interconnectivity

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European Association for Biometrics (EAB)

<https://eab.org/>

copy of slides available at:

<https://christoph-busch.de/about-talks-slides.html>

2021-10-01



# Why Biometrics? - Confirm an Identity Claim

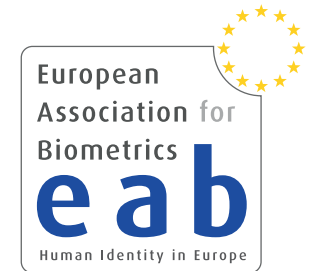
Authentication can be achieved by:

- Something you **know**:  
Password, social profile
- Something you **own**:  
Smartphone, breeder document
- Something you **are**:  
Body characteristics



Something you know or own  
you may **lose**, **forget** or **forward** to someone else,  
with biometrics this is more difficult.

# European Association for Biometrics (EAB)

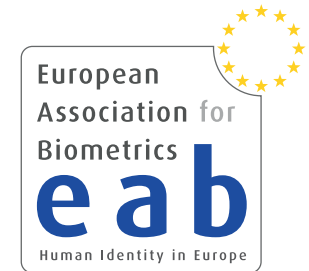


## Objectives of the EAB

- The EAB is a **non-profit**, nonpartisan **association**  
<https://eab.org/>
- **EAB** supports all sections of the ID community across Europe, including **governments**, NGO's, **industry**, associations and special interest groups and **academia**.
- Our role is to promote the **responsible use** and adoption of modern **digital identity systems** that enhance people's lives and drive economic growth.
- Structure of membership fees is **inclusive**
  - ▶ **Free membership** for Bachelor, Master and PhD students!  
[https://eab.org/membership/types\\_of\\_membership.html](https://eab.org/membership/types_of_membership.html)

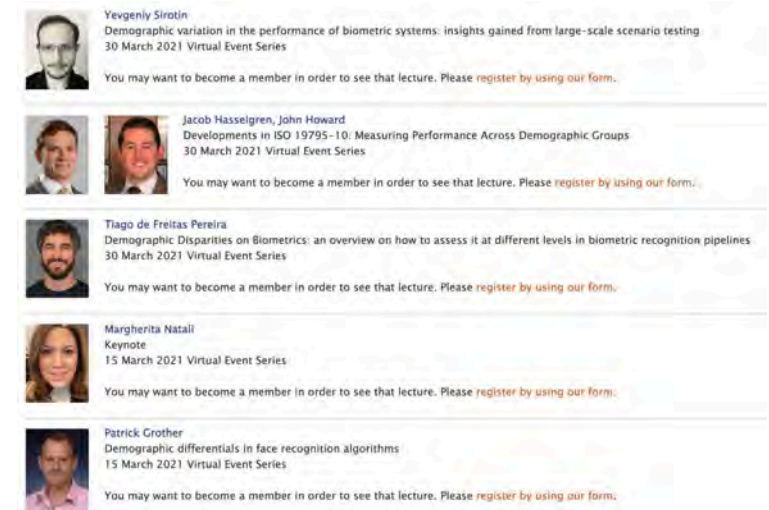


# European Association for Biometrics (EAB)



## More Information

- Our **initiatives** are designed to foster **networking**
  - ▶ Annual conference: EAB-RPC  
<https://eab.org/events/program/219>
  - ▶ Biometric Training Event  
<https://eab.org/events/program/224>
  - ▶ Workshops on relevant topics (e.g. Presentation Attack Detection, Morphing Attack Detection, Sample Quality, Bias in Biometric Systems)  
<https://eab.org/events/>
  - ▶ Online Seminar every second week  
<https://eab.org/events/program/268>
  - ▶ Recorded keynote talks  
<https://eab.org/events/lectures.html>
  - ▶ Monthly newsletter  
<https://eab.org/news/newsletter.html>
  - ▶ Annual academic graduation report  
<https://eab.org/upload/documents/1961/EAB-research-report-2020.pdf>
  - ▶ Open source repository  
<https://eab.org/information/software.html>



# Facilitating Free Travel in the Schengen Area

## Authors of EAB position paper

- appreciate the **benefit** of the Schengen area and the free movement of citizens in the EU
- **hope** that reintroduced intra-Schengen physical **border controls** and even closed borders will **disappear**
- seek technology, which is **compliant** with ethical principals and **fundamental rights**
- support **demographic fairness** for AI and non-AI-based systems
- anticipate that we discuss technology and steps, which will NOT require a change of the **legal framework**

## Perspective

- fully functioning and **resilient** Schengen area

The full EAB position paper is available at:

[https://eab.org/files/documents/2021-05-06\\_EABposition\\_Facilitating\\_Free\\_Travel\\_in\\_the\\_Schengen\\_Area.pdf](https://eab.org/files/documents/2021-05-06_EABposition_Facilitating_Free_Travel_in_the_Schengen_Area.pdf)

Focus of this talk:  
biometrics and EXTERNAL borders

# External Borders

## Situation of **existing** technology

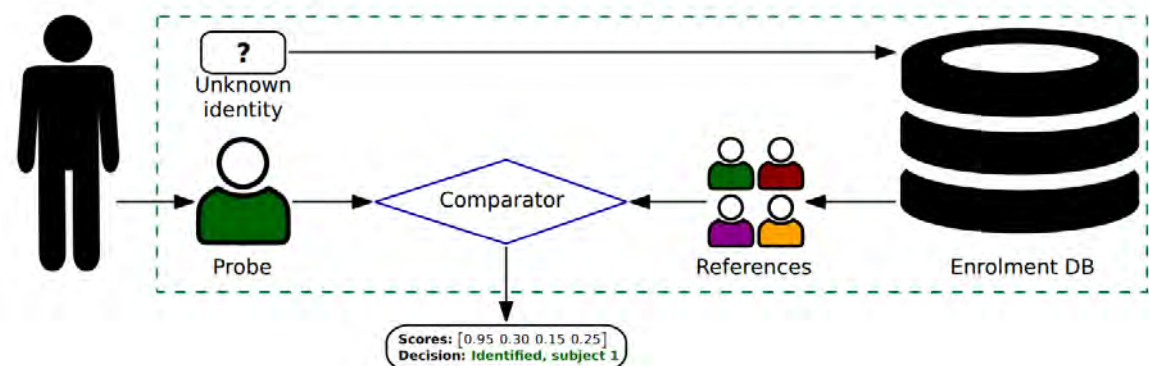
- modern technologies at the border (Eurodac, VIS, EES) provide promising solutions facilitating legitimate travels

- ▶ automated border gates with **biometric verification**



Image source: secunet, idemia, vision-box

- biometric **reference data** must be accessible in personal ID document or a central database

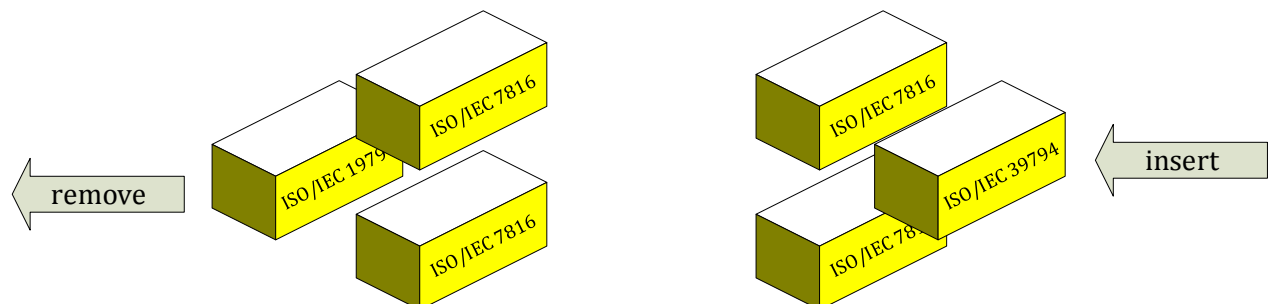




# External Borders

## Situation of **near-term** change in technology (3 years)

- modern technologies at the border (Eurodac, VIS, EES) provide promising solutions facilitating legitimate travels
  - ▶ automated border gates with biometric verification
- biometric
  - reference data** must comply with **ISO/IEC 39794-1, -4 and -5** accessible in personal ID document by revision of ICAO 9303
    - ▶ passport reader equipment must be adopted by **2025-01-01**





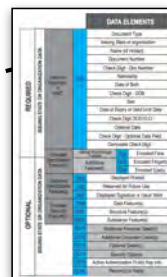
# External Borders

## Situation of **mid-term** change in technology (6 years)

- modern technologies at the border (Eurodac, VIS, EES) provide promising solutions facilitating legitimate travels
  - ▶ automated border gates with biometric verification
- biometric **reference data** must be accessible in personal ID document



Physical Component (PC)



Virtual Component (VC)



Physical Component (PC)

# Corona Consequences

## Focus on contactless biometric captures

# Quality Metrics for Fingerprint Images

## NFIQ2.0

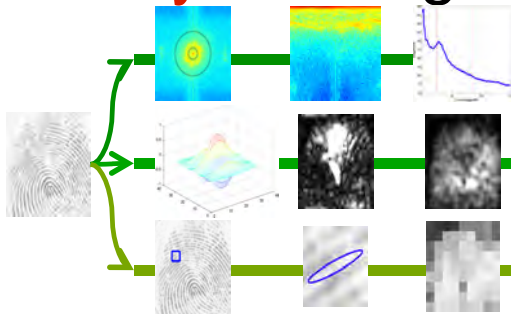
- The Entry Exit System implementing decision 2019/329 defines the mandatory use:
- „*At the moment of enrolment, the version 2.0 (or newer version) of the Fingerprint Image Quality (NFIQ) metric .... shall be used for verifying that the quality of the captured fingerprint data respects the thresholds ...*“



# Quality Metrics for Fingerprint Images

## The NFIQ2.0 approach

- Measure quality by filtering the signal and determine the **utility** of a fingerprint sample.



- Providing **constructive feedback** only possible if cause of poor quality is known.



- NFIQ2.0 constitutes the content of ISO/IEC 29794-4  
<https://www.iso.org/standard/62791.html>

# Quality Metrics for Fingerprint Images

## How was NFIQ2.0 developed?

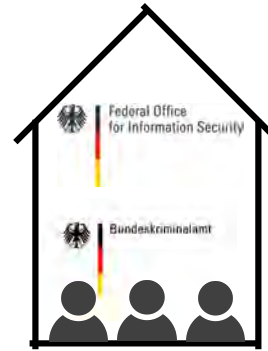
- 2010 - 2021



Maintenance



Testing



Development



Standardisation

- Status 2021

- ▶ NFIQ2.1 in GitHub: <https://github.com/usnistgov/NFIQ2>
- ▶ ISO/IEC 29794-4: <https://www.iso.org/standard/62791.html>
- ▶ NFIQ IR 8382 published: <https://nvlpubs.nist.gov/nistpubs/ir/2021/NIST.IR.8382.pdf>
- ▶ NFIQ2.1 is for fingerprint samples from **optical** capture devices  
**not** for **contactless** !



# Fingerprint Quality in Covid-19 Times

EES will need NFIQ2.1 for contactless capture devices

- Covid-19 will follow us for some more time
- **contactless** devices **will** be **demande**d (rather soon)
- a **joint workshop** on NFIQ2.1 discussed recently  
re-training / calibration for contactless capture devices
  - ▶ you can find presentations from the recent NFIQ 2.1 workshop at:  
<https://eab.org/events/program/248>
- a recent overview of contactless fingerprint recognition  
[Priesnitz2021] J. Priesnitz: „An Overview of Touchless 2D  
Fingerprint Recognition", in EURASIP JIVP, (2021)  
<https://jivp-urasipjournals.springeropen.com/articles/10.1186/s13640-021-00548-4>

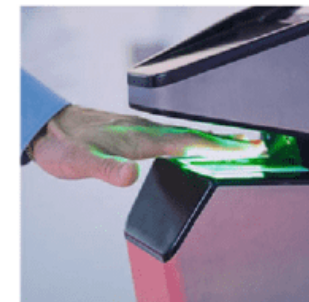


Image Source: <https://www.semanticscholar.org/paper/Contactless-3D-Fingerprint-Identification-Kumar>

# Presentation Attack Detection



# Presentation Attack Detection

## Impostor

- impersonation attack
  - ▶ positive access 1:1 (two factor application)
  - ▶ positive access 1:N (single factor application)
- finding a look-a-like
- making appearance similar to the reference
- artefact presentation



## Concealer

- evasion from recognition
  - ▶ negative 1:N identification (watchlist application)
- depart from standard pose
- evade face detection

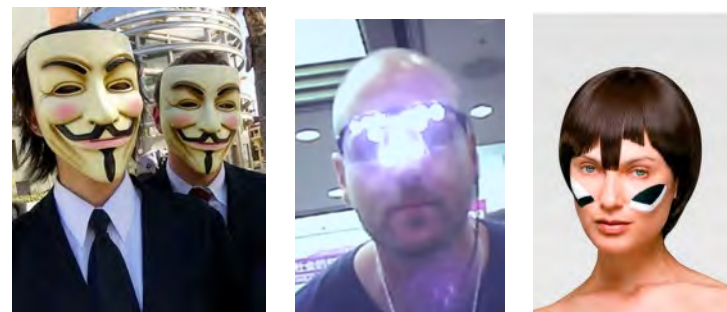
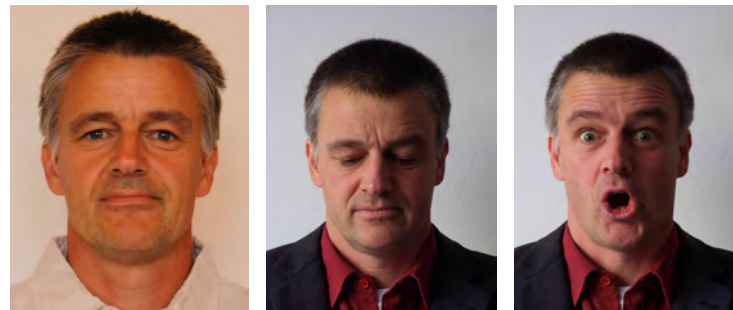


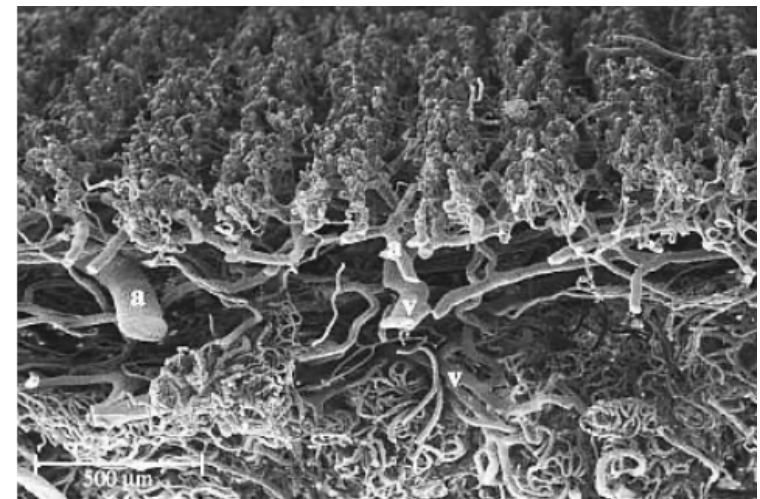
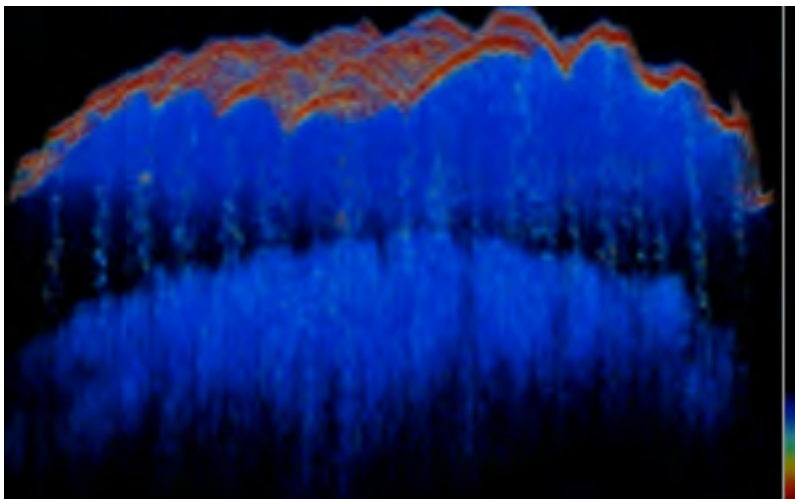
Image Source: <https://www.youtube.com/watch?v=LRj8whKmN1M>

Image Source: <https://cvdazzle.com>

# Fingerprint Capture Device Security

## Countermeasures

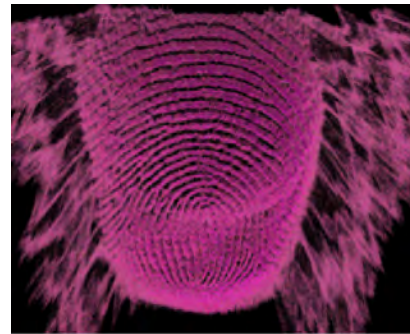
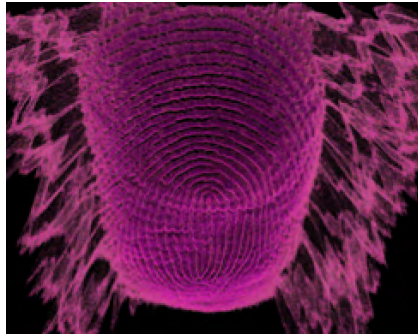
- Observation of the **live** skin **properties**
  - ▶ Dermal-epidermal junction zone (inner fingerprint)
  - ▶ Observation of the sweat glands and sweat ducts
- Sensors
  - ▶ Optical Coherence Tomography (OCT)



# Fingerprint Capture Device Security

## Comparing outer and inner fingerprint patterns

- Detection of **surface** and **internal** layer
- 2D projection



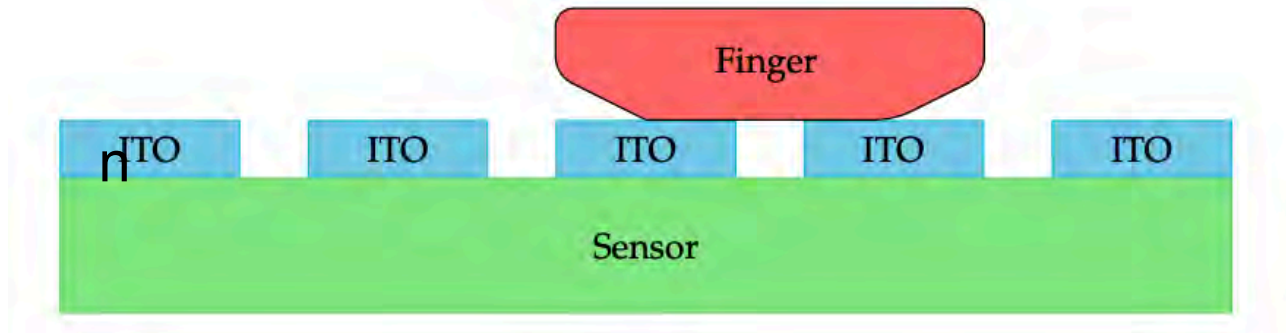
Surface Fingerprint

Internal Fingerprint

# Fingerprint Capture Device Security

## Impedance based detection

- thin film transistor (TFT) technology
  - indium-tin-oxide (ITO) coating
- a finger connecting two conductors
  - the conductivity of human skin differs from artefacts



- Nine different frequencies in the range from 1 to 500 kHz are used for the impedance measurements.

	$FQ_1$	$FQ_2$	$FQ_3$	$FQ_4$	$FQ_5$	$FQ_6$	$FQ_7$	$FQ_8$	$FQ_9$
(Hz)	1000	2500	5000	10,000	25,000	50,000	100,000	250,000	500,000

[Kolberg2021] J. Kolberg, et al.: "On the Effectiveness of Impedance-based Fingerprint Presentation Attack Detection", in Sensors Journal, (2021)

<https://www.mdpi.com/1424-8220/21/17/5686>



# Impostor Presentation Attack

## 3D silicone mask

<http://edition.cnn.com/2010/WORLD/americas/11/04/canada.disguised.passenger>



# Face Capture Device - Skin Detection

## Short Wave Infrared Range (SWIR) imaging

- With multiple point sensors proposed by Steiner et al.
- Skin types defined by Fitzpatrick [Fitzpatrick1988]
  - ▶ I - Always burn, never tan
  - ▶ II - Usually burn, tan less than average
  - ▶ III - Sometimes mild burn, tan about average
  - ▶ IV - Rarely burn, tan more than average
  - ▶ V - brown
  - ▶ VI - black



Image Source: HSBRS, (2016)

[Fitzpatrick1988] T. Fitzpatrick: „The validity and practicality of sun-reactive skintypes I through VI“, Archives of Dermatology, (1988)

# Face Capture Device - Skin Detection

## Short Wave Infrared Range (SWIR) imaging

- Extraction of spectral remission properties
- Remission spectrum above 1200 nm independent by melanin, but strongly impacted by water

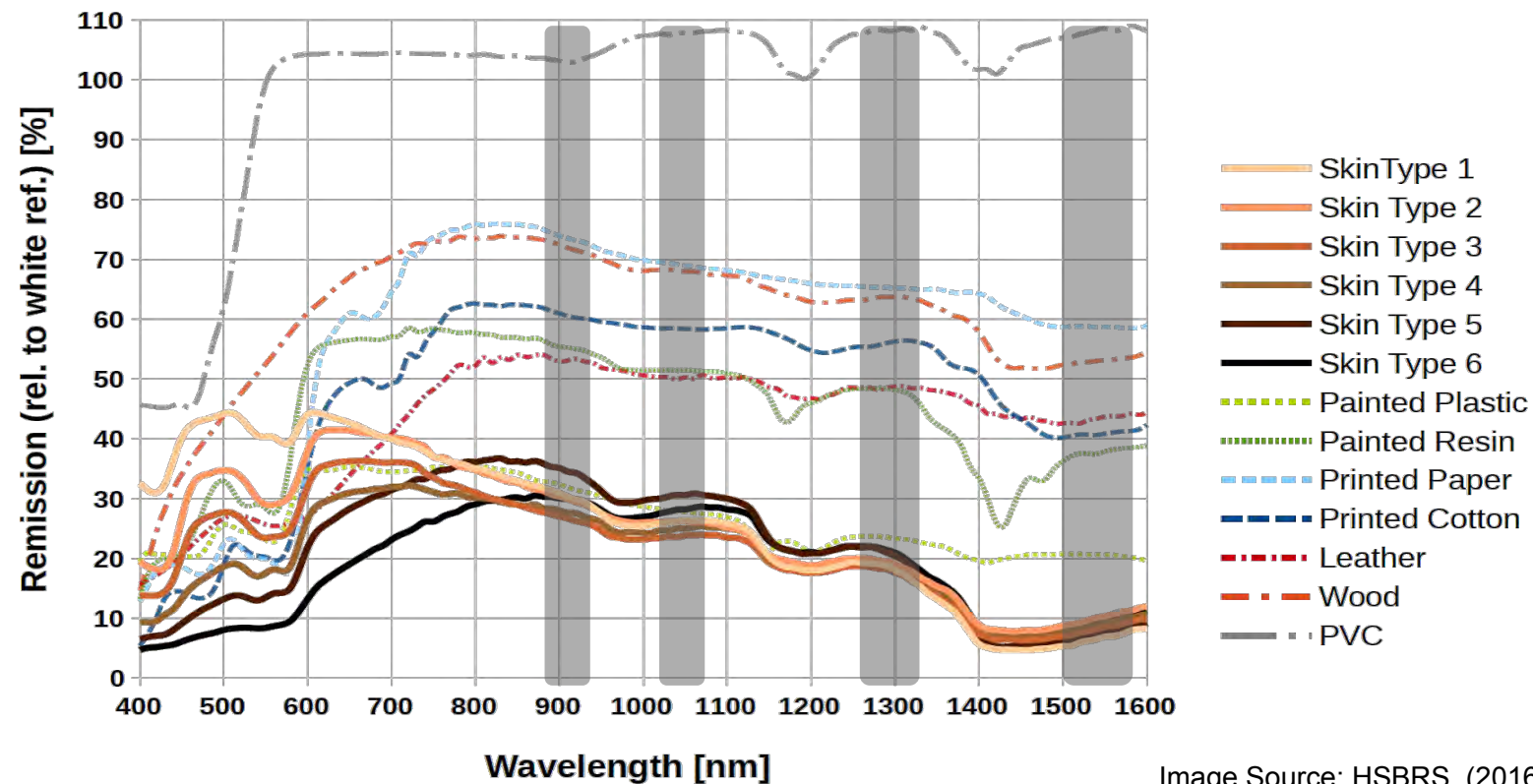


Image Source: HSBRS, (2016)

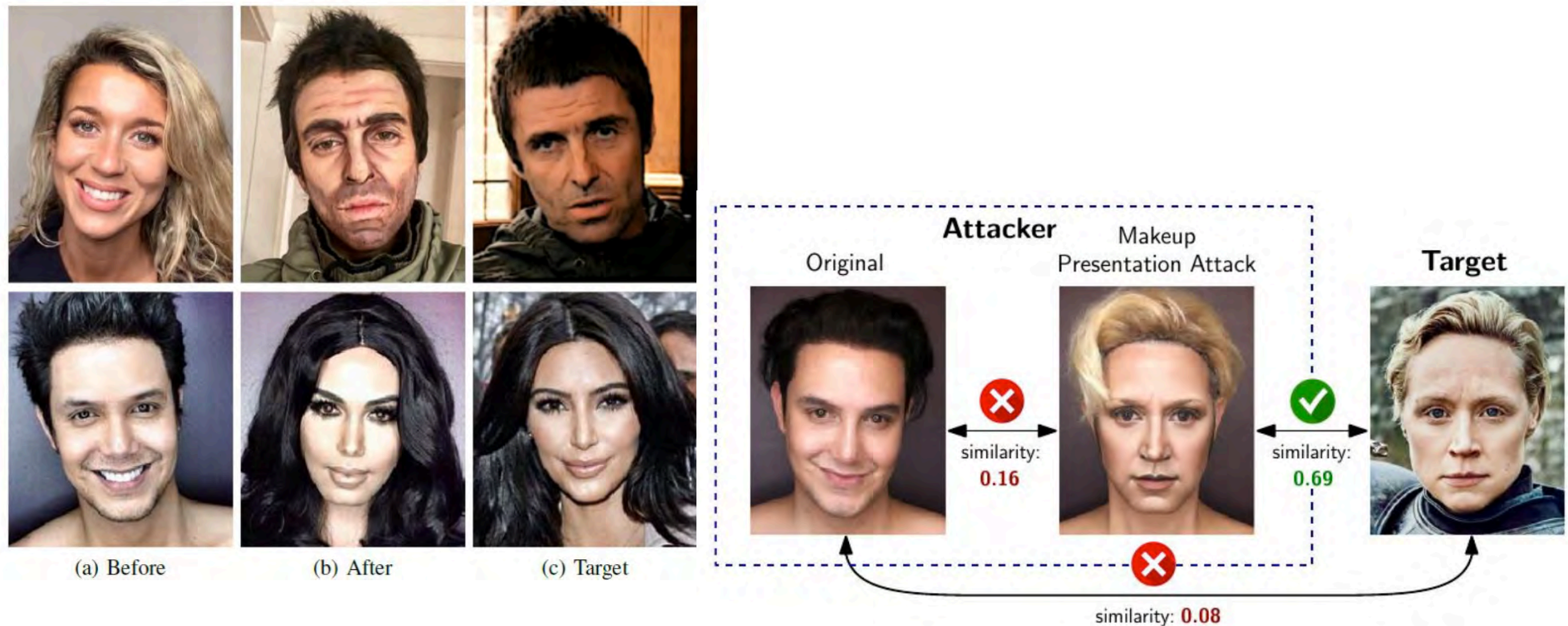
[Jacquez1955] J. Jacquez: „Spectral reflectance of human skin in the region 0.7-2.6m“,J. of Applied Physiology, (1955)



# Face - Makeup Presentation Attacks

## Severe alterations

- **Makeup** for impersonation
- Liveness detection is not sufficient
- Detection difficult since **bona fide users** may **also apply**



[RDB2020] C. Rathgeb, P. Drozdowski, C. Busch: "Detection of Makeup Presentation Attacks based on Deep Face Representations", in Proceedings of 25th International Conference on Pattern Recognition (ICPR), (2020)

# Morphing Attack Detection

# What is Morphing?

In our real world morphing can become a threat

- with a criminal and an accomplice as actors
- take the **criminal**
- and the **accomplice** (or any other good EU citizen)
- morphing can transform one face image into the other





# What is Morphing?

In our real world morphing can become a **threat**

- with a criminal and an accomplice as actors
- take the **criminal**
- and the **accomplice**
- morphing can transform one face image into the other
- and you can stop half way in the transformation



# Problem: Morphing Attacks

## Morphing attack scenario

- Passport application of the accomplice A



# Problem: Morphing Attacks

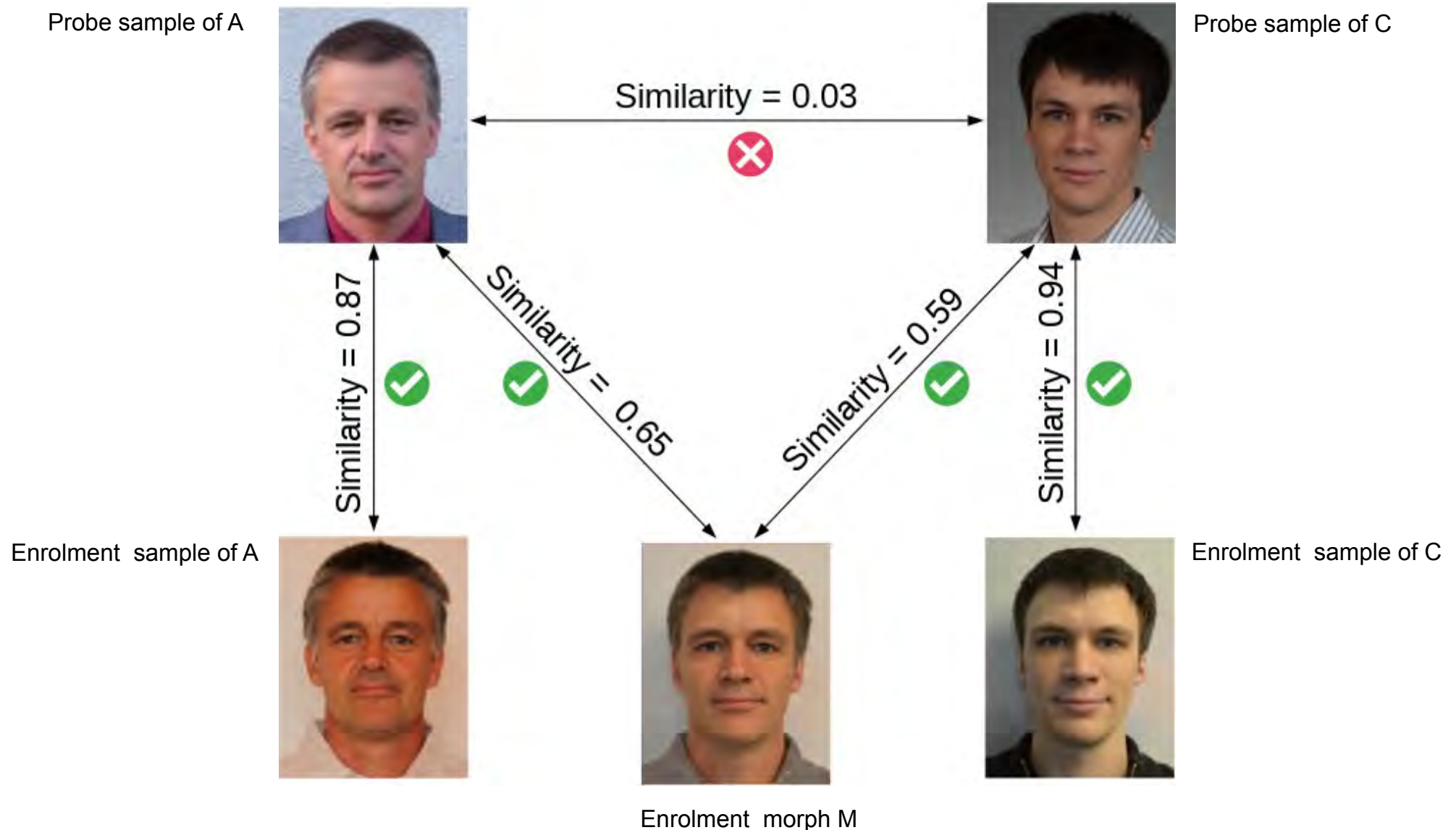
## Morphing attack scenario

- Border control



# Problem: Morphing Attacks

## Verification against morphed facial images





# Problem: Morphing Attacks

Is it a really problem ?

# Problem: Morphing Attacks

Is it a really problem ? - **YES!**

- In September 2018 German **activists**
  - ▶ used a morphed images of Federica Mogherini (High representative of the European Union for Foreign Affairs and Security Policy) and a member of their group
  - ▶ and received an **authentic German passport**.



Image source: <https://www.spiegel.de/netzwelt/netzpolitik/biometrie-im-reisepass-peng-kollektiv-schmuggelt-fotomontage-in-ausweis-a-1229418.html>

# Scale of the Problem: Vulnerability

## Human Experts Capabilities - (44 border guards)



[FFM2016] M. Ferrara, A. Franco, D. Maltoni: "On the Effects of Image Alterations on Face Recognition Accuracy", in Face Recognition Across the Imaging Spectrum, Springer Nature, (2016)

# Morphing Attack - Impact

## Countermeasures

- The current procedure, where a printed face photo can be provided by the citizen, poses **serious security risks**
  - ▶ ID-document based on printed photos are no longer providing a unique link
- Solutions
  - ▶ Photo studio should **digitally sign the picture** and send it to the passport application office (this is in progress for Finland)
  - ▶ Switch to **live enrolment** (that is the case for Norway and Sweden)
  - ▶ Software-supported **detection of morphed face images** at enrolment and at ID-document control

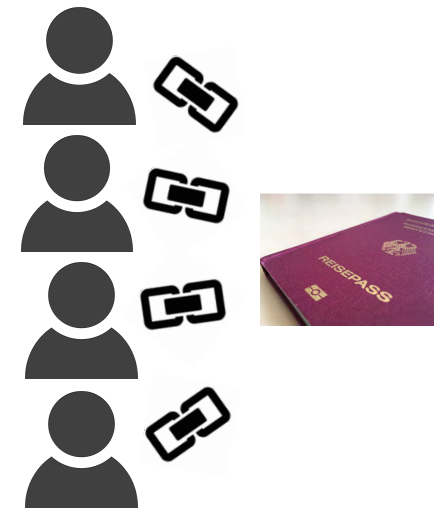


image source: <https://pixabay.com/de/vectors/tick-sternchen-kreuz-rot-gr%C3%BCn-40678/>

# MAD Evaluation

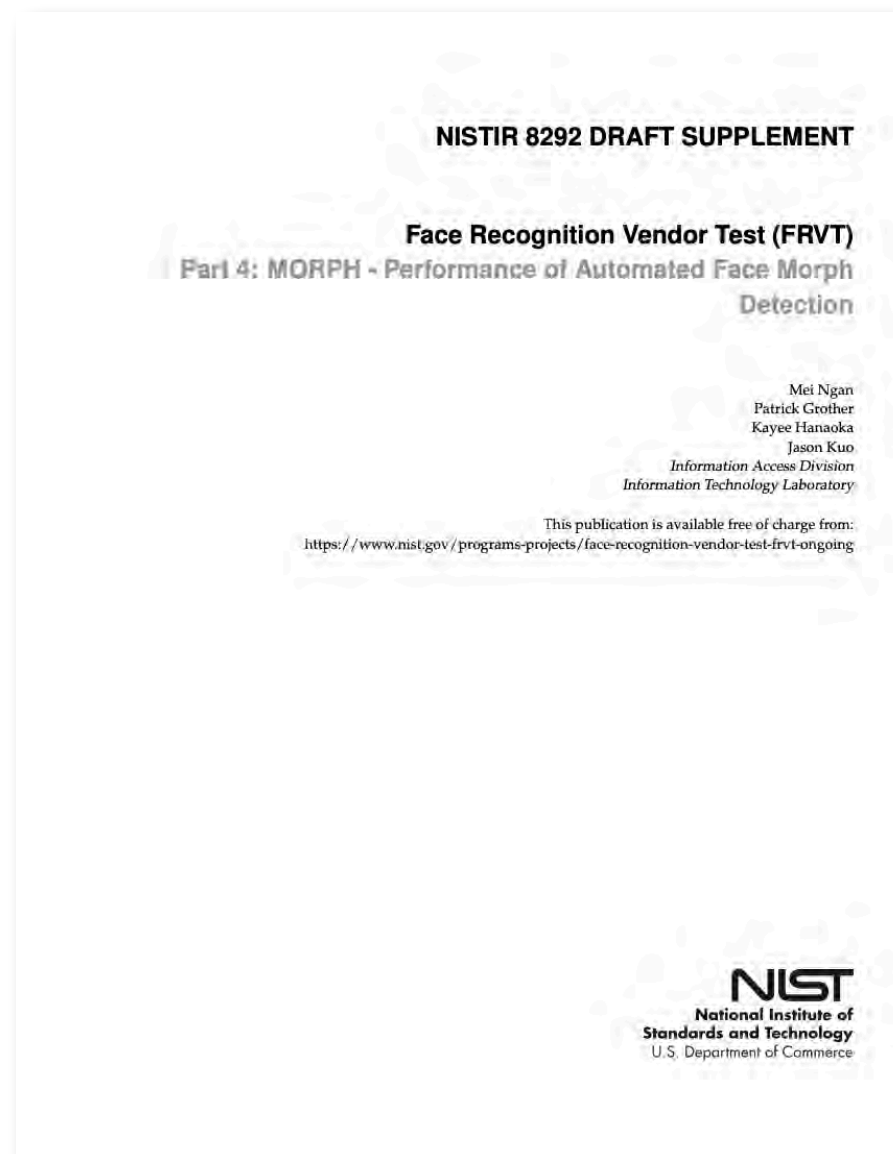
# NIST-FRVT-MORPH

NIST IR 8292 report presented September, 2021

## FRVT-MORPH

[https://pages.nist.gov/frvt/html/frvt\\_morph.html](https://pages.nist.gov/frvt/html/frvt_morph.html)

- results for MAD algorithms from four research labs:
  - ▶ Hochschule Darmstadt (HDA)
  - ▶ Norwegian University of Science and Technology (NTNU)
  - ▶ University of Bologna (UBO)
  - ▶ University of Twente (UTW)

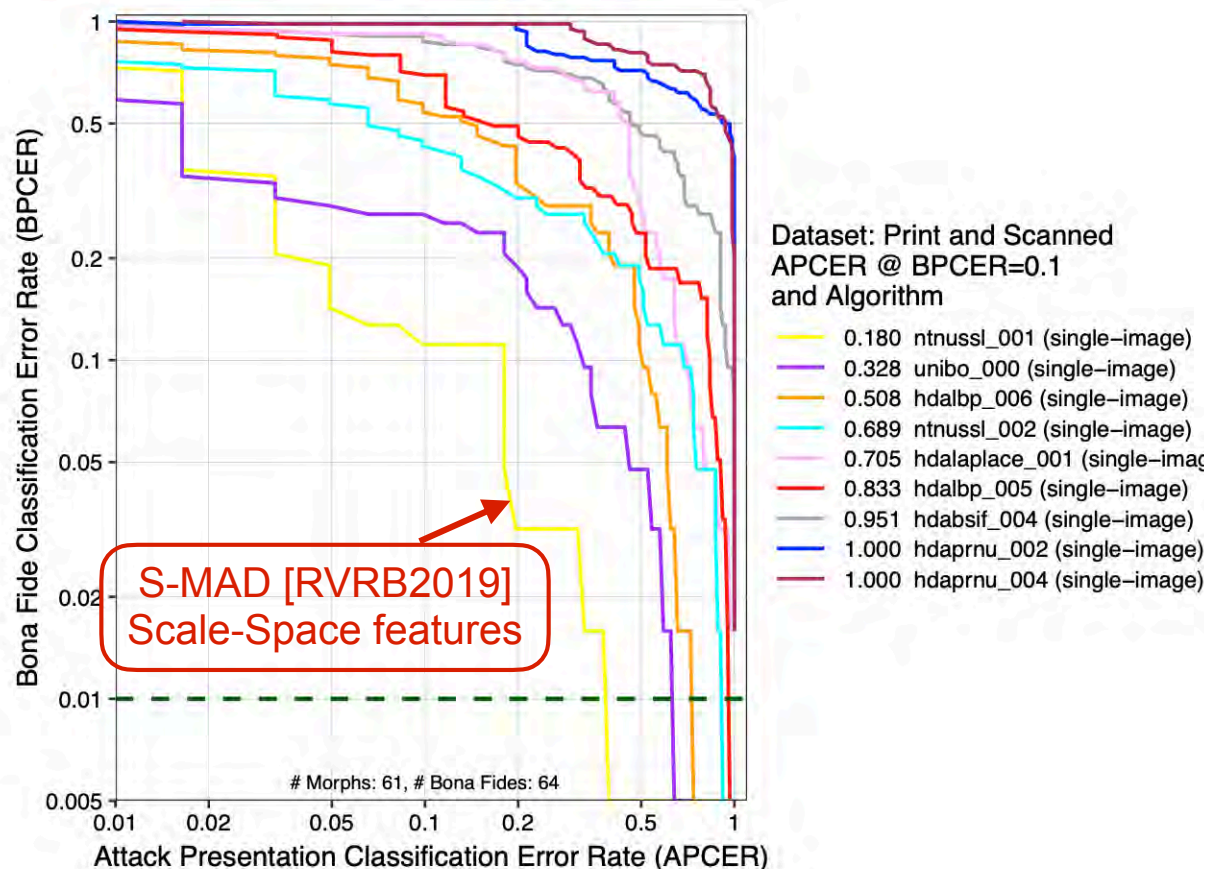
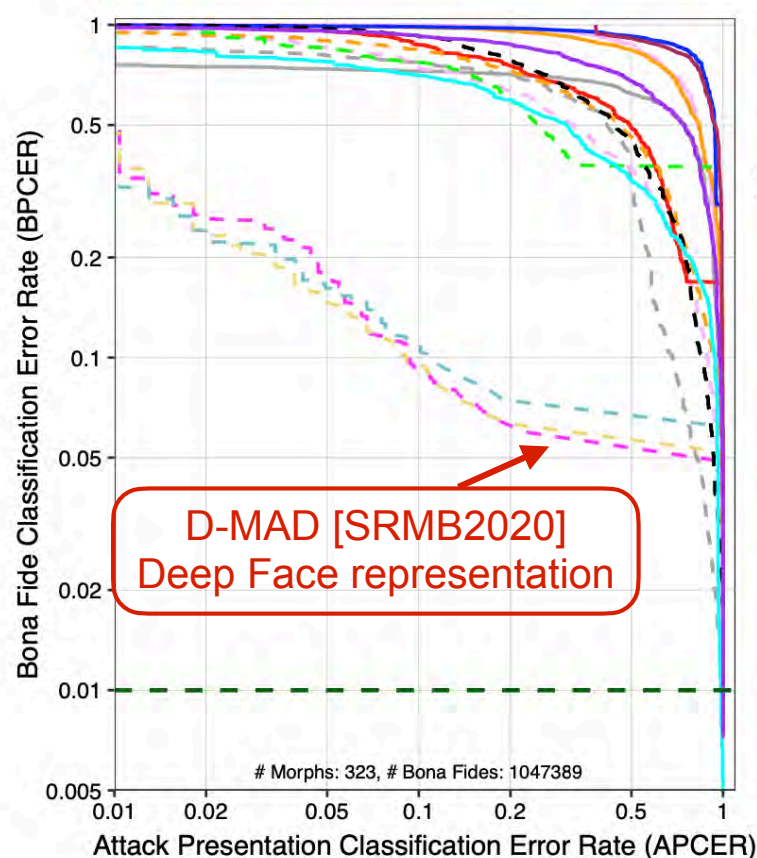




# NIST-FRVT-MORPH

NIST IR 8292 report presented April, 2021

- Performance of Automated Face Morph Detection  
[https://pages.nist.gov/frvt/reports/morph/frvt\\_morph\\_report.pdf](https://pages.nist.gov/frvt/reports/morph/frvt_morph_report.pdf)
- results for **high quality** morphs versus **print and scanned**
  - note the **low number** of print and scanned images





# More information

## The MAD website

<https://www.christoph-busch.de/projects-mad.html>

## The MAD survey papers

- U. Scherhag, C. Rathgeb, J. Merkle, R. Breithaupt, C. Busch: "Face Recognition Systems under Morphing Attacks: A Survey", in IEEE Access, (2019)  
<https://ieeexplore.ieee.org/document/8642312>
- S. Venkatesh, R. Raghavendra, K. Raja, C. Busch: "Face Morphing Attack Generation & Detection: A Comprehensive Survey", in IEEE Transactions on Technology and Society (TTS), (2021)  
<https://ieeexplore.ieee.org/document/9380153>

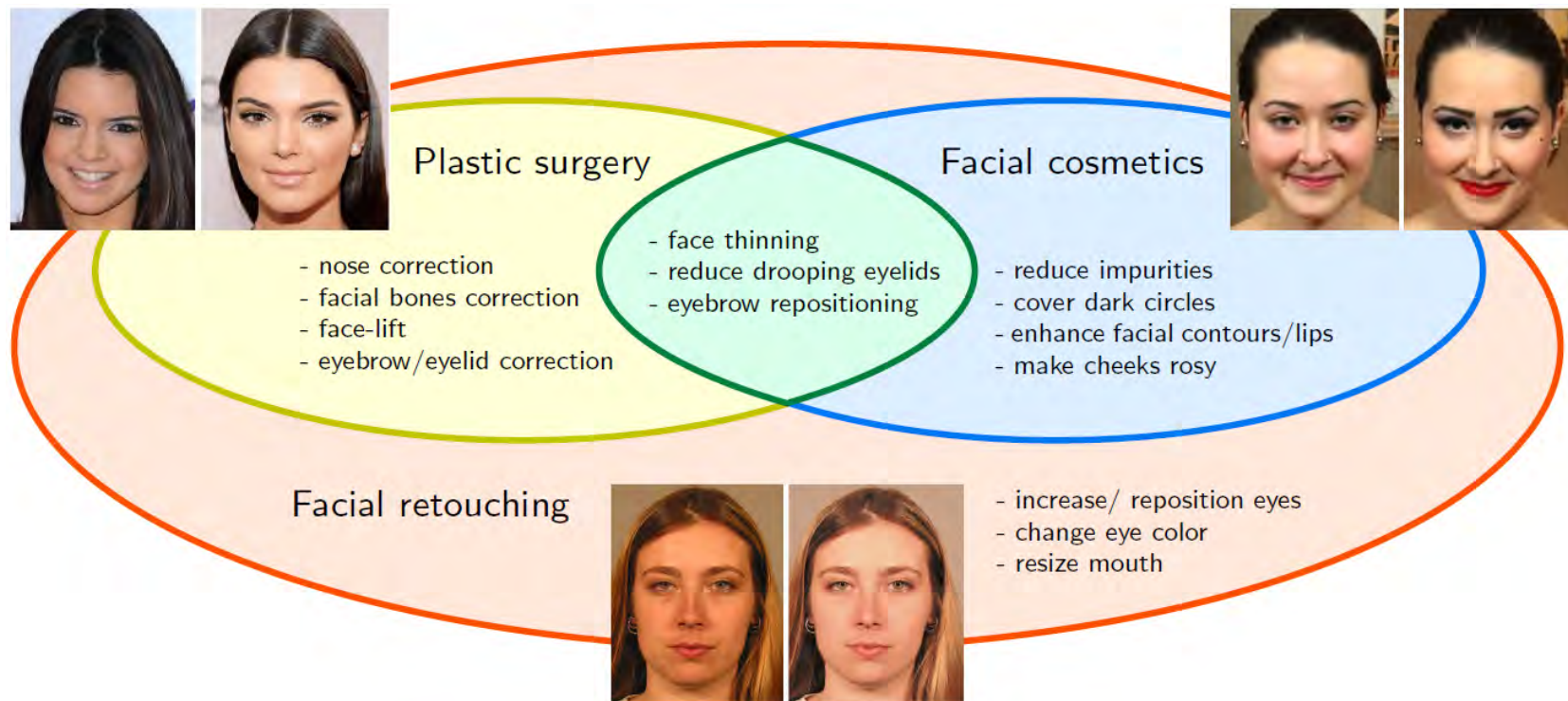


# Non-Intentional Attacks - Beautification

# Beautification of Facial Images

## Scenario

- either the reference or the probe image has been altered



[Rathgeb2019] C. Rathgeb, A. Dantcheva, C. Busch: „Impact and Detection of Facial Beautification in Face Recognition: An Overview“, in IEEE Access, 7(1), (2019)  
<https://ieeexplore.ieee.org/document/8877744>

# Beautification of Facial Images

## Retouching

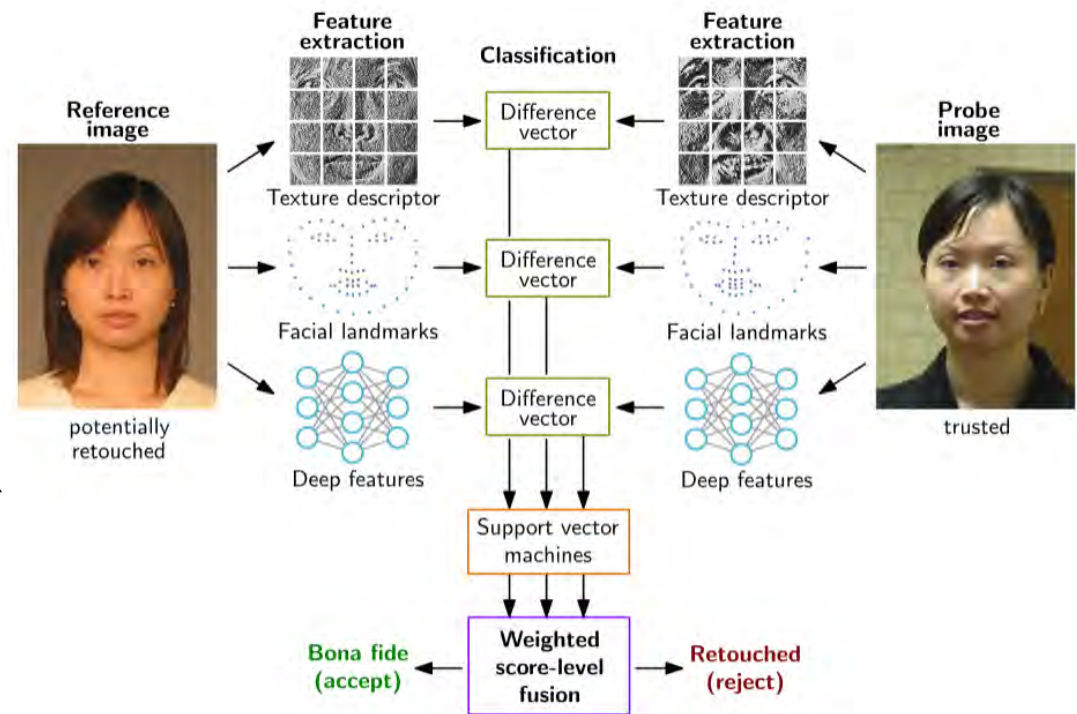
- users may apply retouching with easy-to-use apps
- common alterations:
  - ▶ smoothing skin
  - ▶ slimming nose
  - ▶ enlarging eyes



# Beautification of Facial Images

## Retouching detection

- detection of retouching in differential scenario (similar to MAD)
- potential features
  - ▶ texture descriptors
  - ▶ facial landmarks
  - ▶ deep features
- results reported as D-EER
  - ▶ ~1.5% for known and
  - ▶ ~10% for unknown retouching algorithms
  - ▶ 6 apps
  - ▶ 9000 retouched facial images



[Rathgeb2020] C. Rathgeb, C. Satnoianu, N. Haryanto, K. Bernardo, C. Busch: „Differential Detection of Facial Retouching: A Multi-Biometric Approach“, in IEEE Access, (2020)

<https://ieeexplore.ieee.org/document/9109348>

# Further Challenges



# Quality Metrics for Facial Images

Standard ISO/IEC 29794-5 to be **aligned** with both

- ISO/IEC **19794-5:2011**
- ISO/IEC **39794-5:2019**

## Definitions

- 6.2 **Unified** quality **score**  
FaceQnet (JRC)
- 6.3 **Capture-related**  
quality elements
- 6.4. **Subject-related**  
quality elements



a) Compliant image

b) Low contrast

source: ISO/IEC 39794-5:2019, Annex D

<https://www.iso.org/standard/72156.html>



Images with +8 degrees (left) and -8 degrees (right) rotation in roll

Image Source: ISO/IEC 19794-5:2011

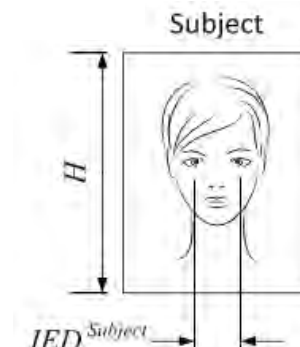


Image Source: ISO/IEC 39794-5

# Quality Metrics for Facial Images

ISO/IEC 3rd WD 29794-5 to be aligned with both

- ISO/IEC 19794-5:2011
- ISO/IEC 39794-5:2019

Table 2 - Conformance requirements by activity

#	Image quality aspect	Collection of reference samples for ID credentials	Collection of probe for instantaneous verification	Enrolment for other enrolment, delayed verification, probe later used as enrolment
1	Unified quality score	6.2	6.2	6.2
2	Illumination uniformity	6.3	6.3 optional	6.3 optional
3	Illumination mean	6.3.3.2	6.3.3.2 optional	6.3.3.2 optional
4	Illumination variance	6.3.3.3	6.3.3.3 optional	6.3.3.3 optional
5	Illumination skewness	6.3.3.4	6.3.3.4 optional	6.3.3.4 optional
6	Illumination kurtosis	6.3.3.5	6.3.3.5 optional	6.3.3.5 optional
7	Illumination under-exposure	6.3.3	6.3.3 optional	6.3.3 optional
8	Illumination over-exposure	6.3.5	6.3.5 optional	6.3.5 optional
9	Dynamic Range	6.3.6	6.3.6 optional	6.3.6 optional
10	De-focus	6.3.7	6.3.7 optional	6.3.7 optional
11	Image sharpness	6.3.8	6.3.8 optional	6.3.8 optional
12	Motion blur	6.3.9	6.3.9 optional	6.3.9 optional
13	Edge Density	6.3.10	6.3.10 optional	6.3.10 optional
14	Compression	6.3.11		
15	Unnatural colour and colour balance	6.3.12	6.3.12 optional	6.3.12 optional
16	Eyes visible	6.4	6.4 optional	6.4
17	Number of faces present		mandatory	Even more mandatory
18	Inter-eye distance	6.4.3	6.4.3	6.4.3
19	Horizontal position of the face	6.4.4	6.4.4	6.4.4
20	Vertical position of the face	6.4.5	6.4.5	6.4.5
21	Background uniformity	6.4.6		
22	Pose	6.4.7	6.4.7 optional	6.4.7
23	Expression neutrality	6.4.8	6.4.8 optional	6.4.8 optional
24	Mouth closed	6.4.9	6.4.9 optional	6.4.9
25	Eyes open	6.4.10	6.4.10 optional	6.4.10 optional
26	Developer-defined quality score computation	8 and Annex A	8 and Annex A	8 and Annex A

source: ISO/IEC 3rdWD 29794-5, Table 2  
<https://www.iso.org/standard/81005.html>



a) Compliant image

b) Low contrast

source: ISO/IEC 39794-5:2019, Annex D  
<https://www.iso.org/standard/72156.html>



Images with +8 degrees (left) and -8 degrees (right) rotation in roll

Image Source: ISO/IEC 19794-5:2011

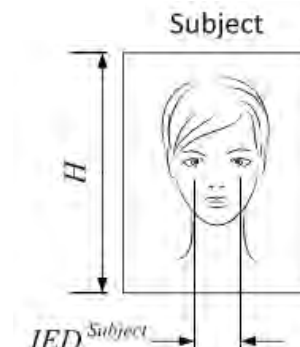


Image Source: ISO/IEC 39794-5



## How to develop face quality metrics? - Standardisation

- 2021 - 2024



Patrick Grother  
Mei Ngan



Christoph Busch  
Patrick Grother

- NIST FRVT Quality Assessment  
[https://pages.nist.gov/frvt/html/frvt\\_quality.html](https://pages.nist.gov/frvt/html/frvt_quality.html)
- workshop on face quality assessment  
<https://eab.org/events/program/261>

Save the date:  
November 16th to 18th

- **Join** the SC37 WG3 work!  
<https://www.iso.org/members.html>

# External Borders - Need

## Standardised birth certificates (long term benefit)

- definition of an ISO/IEC standard for birth certificates
  - ▶ and the registration of such certificates by a global institution (i.e., United Nations)
  - ▶ biometric link to a persistent biometric characteristic which does not change over the live time of a human



Human readable data	
Given Names	Surname
Date of birth	ID No.
Nationality	Place of birth
etc.	
Signature of parents	

Machine readable data	
Encoding of left index finger	
Encoding of left iris	

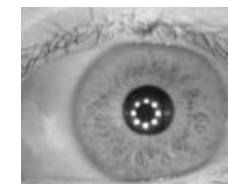


Image source: FIDELITY, FVC04, CASIAv3

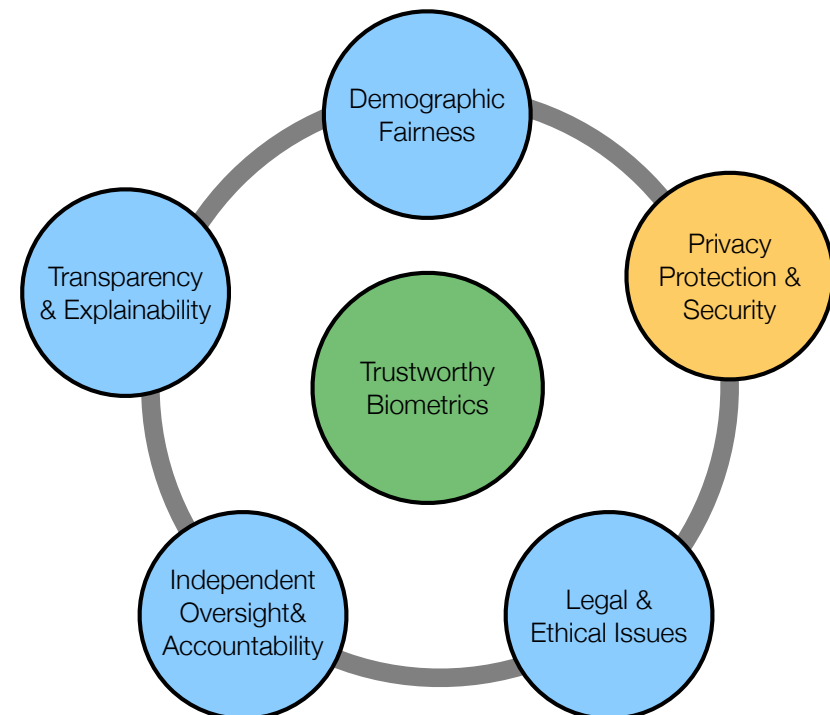
# Trustworthy Biometrics

## Acceptance of technology

- technology itself often considered as threat

Increase trust in technology can be achieved by

- security and **privacy by design**
- public consultations and information campaigns
- and other factors ...



# Contact



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