### The Challenge of Morphing for Border Control

copy of slides available at:

https://www.

/projects-mad.html

Frontex, October 9, 2019





### **History - 2009**

#### **Face Morphing**

- The morphing attack was named and classified as vulnerability of a biometric system in Clause 8.3.8.1 of ISO/IEC FDIS 19792:
  - \*... Examples of abnormal characteristics could include those with unusually large or small numbers of features. Such characteristics may not be representative of any human biometric characteristic but could be synthesised and copied to an artefact. Alternatively a synthesised characteristic could be injected electrically during a replay attack or planted in the

. . . .

- feature sets comprising amalgamations of biometric features from 2 or more individuals, e.g. morphed facial images"

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ISO/IEC JTC 1/SC 27 N7265

Date: 2009-02-01

ISO/IEC FDIS 19792:2009(E)

ISO/IEC JTC 1/SC 27/WG 3

Secretariat: DIN

Information technology — Security techniques — Security evaluation of biometrics

Élément introductif — Élément central — Élément complémentaire

### History - 2014

#### Integrated Project FIDELITY



- http://www.fidelity-project.eu/
- Fast and trustworthy Identity Delivery
   http://www.fidelit
   and check with ePassports leveraging Traveler privacy
- 4 years project (2012-2016)
  - European 7th Framework Programme
- Objectives:
  - ▶ To improve the ePassport issuing process
    - Security of birth certificates and other evidence of identity
    - Quality of biometric data in the chip
    - One individual one passport (duplicate enrolment check)
  - ▶ To demonstrate solutions that enable faster and more secure and efficient real-time authentication of individuals at border crossing
  - ▶ To protect privacy of the travel document holders with a privacy-by-design approach.

### Problem: Morphing Attacks

#### FIDELITY conclusion (December 2015)

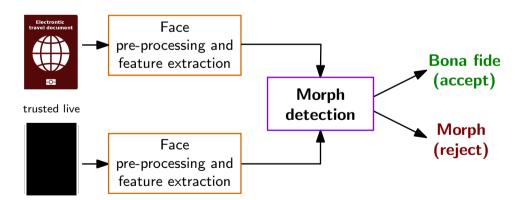
- The current procedure, where a printed face photo can be provided by the citizen, poses serious security risks
- Solutions suggested in 2015:
  - Photo studio should digitally sign the picture and send it to the passport application office (this is in progress for Finland)
  - Switch to live enrolment (that is the case for Norway and Sweden)
  - Software-supported detection of morphed face images

What needs to be done?

- 1.) Establish consensus amongst stakeholders
- Europe should immediately start an action to secure
  - the trusted link between a MRTD and the document holder
  - and to develop and deploy technical mechanisms that can detect a morph passport at borders.
- Support the iMARS-consortium, that is ready to jointly work on the morphing challenges
  - ▶ iMARS = image Manipulation Attack Resolving Solutions (H2020 proposal)
  - ▶ The iMARS consortium consists of Idemia, NTNU, University Bologna, University Twente, Hochschule Darmstadt, University Leuven, Dutch National Office for Identity Data, German Bundeskriminalamt, Vision-Box, Cognitec, IBS, EAB and various end users (border control agencies)
  - iMARS is a pan-European approach that is supported by the European Association for Biometrics

- 2.) Standardise the passport application process
- A European regulation should enforce that all Member States switch to live enrolment, as it is already operational e.g. in Norway and Sweden.
  - Only then, with full control of the biometric capture process by a civil servant in the passport application office, trust in the link of passport holder to reference data can be assured.
- The iMARS consortium has proposed to define a secure ID Document application process:
  - Make it difficult to apply for an ID document with a photograph that has been morphed or manipulated otherwise (e.g. data subjects want to look younger)
  - ▶ Take precautions to detect a case that someone tries to enrol with a well-crafted facemask (avoid a presentation attack with a morphed face image on the mask)
  - ▶ The capture device certification scheme will be recorded in the data record, as defined in the new extensible interchange format ISO/IEC 39794-5

- 3.) Detect automatically Morph Passports at Borders
- After the completed transition to live enrolment in all MS we must anticipate that European passports - potentially containing a morphed image - are presented at least for the next 10 years.
  - iMARS consortium proposed efficient Morphing Attack Detection (MAD) solutions for border control points
  - Border control process based on a differential analysis, where the images stored on the ID document are compared with a trusted live image of the ID document holder, while the capture process is run under supervision.



Explicit and implicit image pair detection algorithms

- 4.) Detect Morph Passports in Forensic Investigations
- A forensic investigator has a single image only
- In support of forensic investigations, we need single image MAD
  - also known as no-reference MAD or forensic MAD
  - explicit MAD and implicit MAD with transfer learning
  - trained with large-scale face morph databases.
  - based on the relatively low-resolution digital image stored in the passport,
  - print and scan MAD robustness
  - fusion of multiple MAD subsystems.

- 5.) Compose Test Data and Online Evaluation Platform
- Testing of MAD solution can't be done without appropriate data.
- Extend the SOTAMD database of 150 individuals and diversify
  - more subjects
  - more enrolment processes / print and scan equipment
  - more morphing tools
  - high AND controlled degrading quality
- Need for an iMARS mixed quality dataset
  - Minimizing image artefacts generated by morphing
  - Diversity in the morphing factor (also known as α factor)
- Augment the Bologna-Online-Evaluation-Platform (BOEP)
  - Provide open access benchmark tests.
  - ▶ Thus Frontex and the national border control agencies will be able to evaluate if the MAD State-of-the Art meets the operational requirements.
  - The technical interfaces are by design equivalent to the benchmark portal of the NIST Face Recognition Vendor Test (FRVT) MORPH Competition

- 6.) Standardise Testing of MAD Solutions
- Find consensus, how we test
  - Measures for vulnerability and detection accuracy
- Morphing vulnerability metric based on the Mated-Morph-Presentation-Match-Rate (MMPMR)
  - anchor the MAD evaluation methodology in the ISO/IEC 30107 multipart standard
  - Find consensus in the MAD research community
- Standardise metrics to evaluate the performance of MAD methods
  - APCER and BPCER (and corresponding DET-Plots)
    - APCER Attack Presentation Classification Error Rate
    - BPCER Bona Fide Presentation Classification Error Rate
- Border control agencies of EU Member State shall be motivated by Frontex to participate in this standardisation process

- 7.) Develop Face Image Quality Metrics
- We need the equivalent to NFIQ2.0 for facial images
- Ensure to capture samples that are sufficiently good in term of illumination, sharpness, or pose
- Align with the framework for biometric sample quality described in ISO/IEC 29794-1:2016
  - align with ISO/IEC NP 24357 and-or ISO/IEC 29794-5
- Develop an automatic face image quality assessment software,
  - which can predict recognition accuracy
  - provide actionable feedback to the data capture subject and/or to the operational personnel.
- Once predictive face quality software is available,
   MAD evaluation can be adapted to the three relevant scenarios (ID Document issuance, border control, and forensic investigation)
  - observe the impact of face image quality on morphing attack detection

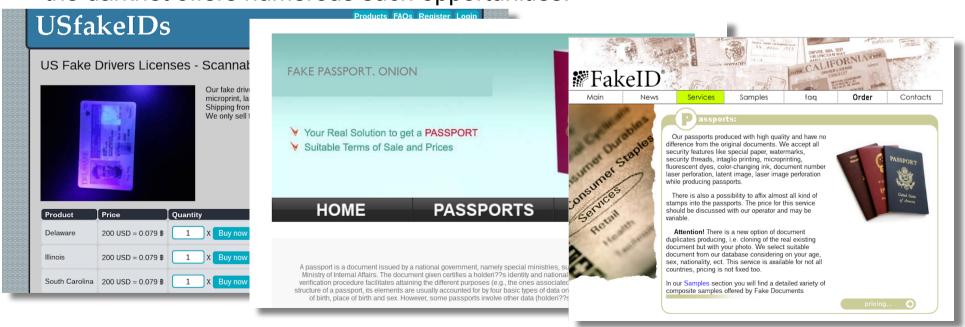
# 8.) Train operating Border Officers and Communication Personnel

- Train the agencies staff, how to react
- Develop best practices for improving the officers' skills on manipulated/morphed image and document fraud detection
  - design a training curriculum in interaction of Frontex and active researchers
  - show to border guards that the MAD tools will not replace, but complement, their expertise.
- Training of operators' communication personnel
  - to mitigate public excitement and explain attack resolving solutions against morphing attacks,
  - once the threat is reported in the media.

### Conclusion

#### We are facing

- One of the most challenging research tasks
  - we have to assign this task to our best researchers, in order to get a decent solution for robust morphing attack detection algorithms
- Passports with morphs are already in circulation
  - Switch to live enrolment is a good decision, but does not solve the problem
- In combination with passport brokers a dramatic problem
  - the darknet offers numerous such opportunities:



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### **Upcoming Events**

### Standardisation Week in January 2020

Upcoming ISO/IEC SC37 Working Group 3 meeting

- 20-24 July, 2020 in New Orleans, US
- Terms of Reference:
  - "To consider the standardisation of the content, meaning, and representation of biometric data formats. ..."
- On the agenda:
  - ► The third generation: ISO/IEC IS CD 39794-5 Extensible biometric data interchange formats – Part 5: Face image data
  - Face Sample Quality: New standardization project
    - ISO/IEC NP 24357 and-or ISO/IEC 29794-5
- see: https://isotc.iso.org/livelink/livelink/open/jtc1sc37wg3

### Darmstadt Biometric Week in September 2020

- 7th EAB research projects conference (EAB-RPC)
  - ▶ September 14-16, 2020 in Darmstadt, Germany
  - https://www.eab.org/events/program/151
- 19th IEEE BIOSIG conference
  - ▶ September 16-18, 2020 in Darmstadt, Germany
  - www.biosig.org/biosig-2020





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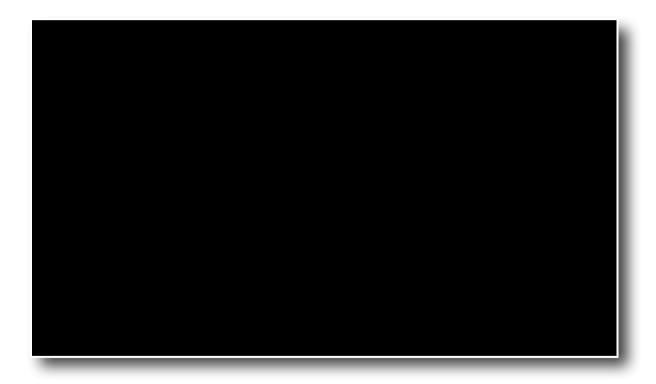
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### Contact



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