

### Selected Chapters of IT-Security [ITSEC]: Digital Image Forensics with the focus on Face Morphing Attack

Winter Term 2019/2020

Part 2: Topics

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Die Studierenden werden hiermit belehrt, dass die im Kontext der Lehre veröffentlichten Unterlagen ausschließlich für den internen Gebrauch zu Lehr- bzw. Studienzwecken bestimmt sind, d.h. eine Verwendung ausschließlich im



#### Outline

- (1) Face morphing detection as a one-class classification problem
- (2) Face morphing detection based on dictionary learning
- (3) Security analysis of the ANANAS infrastructure incl. the network of distributed face morphing detectors
- (4) Improvement of the Android-App for verification of persons based on electronic documents (e.g. travel passport) incl. face morphing detection
- (5) Analysis of the human experiment results focusing on the question: Does training improve an accuracy of manual face morphing detection?
- (6) "Handcrafted" features vs. features learned by an autoencoder with regard to face morphing detection
- (7) Face morphing detection with and without a reference face image
- (8) An integral approach (fusion) for identity verification based on document face images incl. compliance with the ICAO portrait quality standard and morphing detection
- (9) Analysis of the DEFACTO morphing database
- (10) Visual analysis of morphing detection features based on t-SNE projection onto a two-dimensional space



# Topic 1: Face morphing detection as a one-class classification problem

- Consider face morphing detection as an anomaly detection problem with the only known class e.g. morphed face images
- Start literature research with the paper: P. Schlachter, Y. Liao, B. Yang "One-Class Feature Learning Using Intra-Class Splitting", in Proc. EUSIPCO'19, Sept. 2-6, 2019, A Coruña, Spain
- 3 ETCS:
  - Propose an approach for splitting data to typical and atypical samples
  - Propose a suitable loss function for an autoencoder
  - Demonstrate the effectiveness of your approach based on a small set of given facial morphs
- 6 ETCS:
  - + Quantitatively evaluate the proposed approach based on a large set of self-collected facial morphs (min. 1000 samples)
- Team: 2 Students
- Supervisor: Andrey Makrushin



# Topic 2: Face morphing detection based on dictionary learning

- Apply dictionary learning for representing morphed face images enabling adaptive learning of new unknown types of facial morphing
- Start literature research with the paper: P. Irofti, A. Baltoiu "Malware Identification with Dictionary Learning", in Proc. EUSIPCO'19, Sept. 2-6, 2019, A Coruña, Spain
- 3 ETCS:
  - Mapping from malware identification to morphing identification
  - Discuss possible features to distinguish genuine and morphed face images
  - Compare SVD and PCA based decomposition
  - Demonstrate the effectiveness of your approach based on a small set of given facial morphs
- 6 ETCS:
  - + Quantitatively evaluate the proposed approach based on a large set of selfcollected facial morphs (min. 1000 samples)
- Team: 2 Students
- Supervisor: Andrey Makrushin



# Topic 3: Security analysis of the ANANAS infrastructure

- Check the ANANAS infrastructure for potential vulnerabilities
- Describe components using the entity model developed in R. Fischer, R. Clausing, J. Dittmann, Y. Ding "Industrie 4.0 Schwachstellen: Basisangriffe und Szenarien," in Proc. D-A-CH Security 2016, Klagenfurt, Germany, pp. 350-362, 2016
- Apply measures of information security from the "BSI IT-Grundschutz" standard
- 3 ETCS:
  - Structure analysis, software inventory + revealing potential vulnerabilities
  - Security of RESTful webservices in general
  - Security of communication within the ANANAS infrastructure, assessment of the IT-Security-Aspects
  - Privacy within the entire architecture, residual risks
  - Objectives for logging and assessment whether the implemented logging facilities suffice for these goals
- 6 ETCS:
  - + Source code analysis
  - Develop a strategy for the maintenance and sustainable operation of the ANANAS infrastructure
- Team: 2 Students
- Supervisors: Andrey Makrushin, Mario Hildebrandt



#### Topic 4: Improvement of the Android-App

- Study the identity verification process at Automated Border Control (ABC) gates
- Study the requirements to biometric portraits (ICAO standard) stored in electronic documents (e.g. travel passport)
- Reveal the vulnerabilities and potential attacks on ABC, start a literature research with the paper: M. Ferrara et al. "The magic passport", in Proc. IJCB'14, Clearwater, FL, 2014, pp. 1-7
- Improve an Android App for simulation of ABC incl. face morphing detection
- The functionality should be similar to the InnoValor ReadID NFC Passport Reader
- 3 ETCS:
  - Analyze the existing App and list the advantages and disadvantages
  - Improve the user interface
- 6 ETCS:
  - + Re-implement
    - Taking and processing a photograph
    - Reading data from a chip (NFC), see http://www.jmrtd.org/
    - Request webservices for face matching and morphing detection
- Team: 2 Students
- Supervisor: Andrey Makrushin



## Topic 5: Analysis of the human experiment results

- Evaluate the results of a human experiment to answer the question: Does training improve an accuracy of manual face morphing detection?
- Start literature research with the paper: R. Kramer et al. "Face morphing attacks: Investigating detection with humans and computers", Cognitive Research: Principles and Implications (2019) 4:28
- 3 ETCS:
  - Study records of the experiment and collect relevant data
  - Discuss decision process time
  - Discuss error rates
  - Compare the results with studies conducted by psychologists e.g. in D.J.
     Robertson et al. "Detecting morphed passport photos: a training and individual differences approach", Cognitive Research: Principles and Implications (2018) 3:27
- 6 ETCS:
  - + Create new images/videos for the experiment
  - + Run an experiment with a new data, collect, analyze and discuss test results
- Team: 2 Students
- Supervisor: Andrey Makrushin



# Topic 6: "Handcrafted" features vs. features learned by an autoencoder

- Study whether features learned by an autoencoder perform better than "Handcrafted" features applied to face morphing detection
- Start literature research with the paper: A. Bhattad, J. Rock, D. Forsyth "Detecting Anomalous Faces with 'No Peeking' Autoencoders", arXiv:1802.05798 [cs.CV]
- 3 ETCS:
  - Compare autoencoder to other dimensionality reduction approaches
  - Study and discuss possible loss functions
  - Study and discuss image similarity metrics
- 6 ETCS:
  - + Implement and evaluate an autoencoder with a self-collected data (min. 1000 genuine/morphed samples)
- Team: 2 Students
- Supervisor: Andrey Makrushin



# Topic 7: Face morphing detection with and without a reference face image

- Describe the limits of the blind morphing detection and investigate the morphing detection techniques with a reference face image; discuss pros and cons of both approaches
- Start literature research with the paper: Fei Peng, Le-Bing Zhang, Min Long "FD-GAN: Face De-Morphing Generative Adversarial Network for Restoring Accomplice's Facial Image", IEEE Access 2019
- 3 ETCS:
  - Compare a GAN-based approach with the approach of Ferrara et al. "Face Demorphing" IEEE Trans. on Information Forensics and Security 13 (2018): 1008-1017
  - Evaluate an existing implementation (python/keras) with a given data
- 6 ETCS:
  - + Improve an existing implementation and evaluate it with a self-collected data (min. 1000 genuine/morphed samples)
- Team: 2 Students
- Supervisor: Andrey Makrushin



# Topic 8: Fusion of identity verification and morphing detection

- Discuss scenarios and procedures which include identity verification based on a document face image
- Discuss how identity verification can be coupled with morphing detection
- Start literature research with the paper: C. Kraetzer, A. Makrushin, T. Neubert, M. Hildebrandt, J. Dittmann "Modeling Attacks on Photo-ID Documents and Applying Media Forensics for the Detection of Facial Morphing", in Proc. IH&MMSec'17, June 20-22, 2017, Philadelphia, PA, USA
- 3 ETCS:
  - Propose a fusion approach for face morphing detection with and without a reference image and identity verification
  - Evaluate trivial fusion strategies based on the given detectors (ANANAS web services) and image data
- 6 ETCS:
  - + Implement some selected components of the proposed fusion approach and evaluate it with a self-collected data (min. 1000 genuine/morphed samples)
- Team: 2 Students
- Supervisor: Andrey Makrushin



### Topic 9: DEFACTO morphing database

- Analysis and classification of the existing approaches for generation of morphed face images
- Analysis of the DEFACTO morphing database described in G. Mahfoudi et al.
   "DEFACTO: Image and Face Manipulation Data", in Proc. EUSIPCO'19, Sept. 2-6, 2019, A Coruña, Spain
- 3 ETCS:
  - Generate morphed face images using the ANANAS web service based on the genuine images included in the DEFACTO database
  - Subjective visual comparison of the morphed images from the DEFACTO and ANANAS web service
- 6 ETCS:
  - + Quantitative comparison of the morphed face images from the DEFACTO and ANANAS web service (min. 200 morphed samples)
    - Biometric quality
    - Forensic quality
- Team: 2 Students
- Supervisor: Andrey Makrushin



## Topic 10: Visual analysis of morphing detection features

- Visualization of high-dimensional feature vectors in a two-dimensional space for qualitative evaluation of potential separability of genuine and morphed face images
- Start literature research with the paper: C. Seibold et al. "Visual Feature Space Analyses of Face Morphing Detectors" to appear in Proc. WIFS'19, December 9-12, 2019, Delft, Netherlands
- 3 ETCS:
  - Compare different visualization approaches with each other
  - Compare visualization approaches with dimensionality reduction approaches
  - Apply t-SNE visualization to the given feature vectors
- 6 ETCS:
  - Generate feature vectors using ANANAS web services from a self-collected face images (min. 1000 genuine/morphed samples) and apply t-SNE visualization to the generated feature vectors
- Team: 2 Students
- Supervisor: Andrey Makrushin