



### A Concept for a Comprehensive Understanding of Communication in Mobile Forensics

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#### Agenda

- Introduction of FORMOBILE project
- Evaluation of big data by semantic analysis
  - Problem in data analysis in mobile forensic
  - Proposed concept for understanding the communication data
- Outlook of semantic analysis





### From Mobile Phones to Court

An EU Project to Help Keep Citizens Safe



An EU project aiming to create an **end-to-end mobile forensic investigation chain**, striving to improve digital safety, and security in the EU







# **Project Objectives**

### Tool

• Innovative new tools available to Law Enforcement Agencies (LEA)s allowing for the rapid retrieval, storage and analysis of mobile phone data

#### Standard

• Define European standard for the forensic investigation of mobile phones

### Training

• Training course helps LEAs to effectively use the new tools and follow

the standardized procedures

#### **Advisory Boards**







# WP6.1 Evaluation of big data by semantic analysis

#### Goal

- Analysis and assessment of all communication for the purpose of forensic information retrieval and extraction
- Develop new algorithms to analyze each data type and integrate all retrieved information in one knowledge map as an extension to a common communication network
  - Jointly considering all possible data modalities and communication channels in investigations

























#### Why is jointly understanding important?







#### A well-organized criminal offense works







#### **Detect evidence from communication**







#### Problems in analysis of mobile communication data

- Different data types (modalities)
  - Difficulty in semantic alignment, e.g., object in image vs object in text, audio, video mentioned
  - Incomplete contextual information
    - Information loss or misunderstanding

Jerry, what do you think the idea we discussed yesterday?

• Correct understanding data only if all modalities are considered[Hans Bucher]







#### Problems in analysis of mobile communication data - multimodality

• Misunderstanding or misinterpretation of data if only text is considered[Spranger et al.]

2018.02.10 16:39 Sven, check it out

2018.02.10 16:40 Suprise me

#### 2018.02.10 16:45

No, jaguar gives us better swift and power

animal

or

vehicle?

5

2018.02.12 09:25

Excellent... Let's take this one

2018.02.12 09:23 Holland, here I come. See you at





#### Problems in analysis of mobile communication data

- Various communication channels
  - Communication (as discourse ) is semantic coherent [Jerry Hobbs]







#### Problems in analysis of mobile communication data - multichannel

Segmented semantic information







#### Problems in analysis of mobile communication data - multichannel





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#### **Dump Extraction**

- Extracting data from suspicious mobile devices
  - Physically: extract a complete copy of the examined devices
  - Logically: extract specific parts of the file system, e.g., the logical partitions in a device or an SQLite database.
  - Conducted in compliance with the chain of custody







#### **Data Decoding**

- Decoding data extracted dump files
  - In specific artifact structure in order to analyze the data later
  - Necessary information:
    - Artifact identification: from where this artifact is taken, e.g., Calls
    - Unique identification: uniquely indexed id of artifact
    - Channel identification: concrete resource where this artifact was extracted from, e.g., iOS call
    - Attachment: information about where the attachment is stored locally
    - Information about the sender/caller/receiver
    - Time stamp of artifacts



• Auxiliary information: whether artifact is read, sent, deleted etc.



#### **Joint Semantic Analysis**

- Aims at explaining the coherent semantic content and hidden connections in a mobile communication in a consistent way
- Is formulated hypothetically as follows:
  - $\tilde{e} = \operatorname{argmax}_{\boldsymbol{\theta}} \tilde{P}(e|d_{cm}; \boldsymbol{\theta}), d_{cm} \in D$
  - *e* the semantic context in the conversation data *D* 
    - is mostly presented by a topic and possibly connected to a concrete crime
  - $d_{cm} \in D$  stands for a single artifact message spread via the communication channel  $c \in D_c$ {WhatsApp, Telegram, Facebook Messenge, email etc.} and represented in the modality  $m \in D_m$  {Text, Image, Audio, Video etc.}
  - *D* is time- and semantically-coherent and organized chronologically
  - $\boldsymbol{\theta}$  is the parameter set that captures the latent semantic in the data





#### **Joint Semantic Analysis**

- Aims at retrieving forensic information in different data modalities
  - Correlating data to concept labels







#### **Joint Semantic Analysis**

- Aims at building communication network with respect to the topics discussed in the communication
  - Need a common representation way that maps all data in the same representational form to extract topics







## Joint Semantic Analysis - Audio

#### **Audio Forensic:**

- Refers to the acquisition, analysis, and interpretation of audio recordings as part of an official investigation [Rob Maher]
- Only focus on understanding (transcribing) the spoken data in this study currently
  - Automatic Speech Recognition (ASR)
    - Audio and video (with acoustic signal) can be transcribed in textual form
    - $\tilde{w} = argmax_w \{p(Y|w) P(w)\}$ , where Y the acoustic observations, w the sequence of tokens of given acoustic observation.





## Joint Semantic Analysis - Image

#### **Image Forensic:**

- Focus mainly on[Dixit et al.]
  - Image source identification: investigating which device (or class of device) captured or formed the image under investigation
  - Image forgery detection: investigating whether the image under question represents the unmodified captured scene, or has it been forged to deceive the viewer.
- Only focus on semantic information of image
  - Integrate the labels of semantic concepts into retrieving function as well as topic modelling
    - Feature-based approach in image retrieval system for querying contraband [Roussev et al.]
  - Image Classification & Captioning deliver different semantic representation





#### Comparison of Semantic Density[Desai et al.]







## Joint Semantic Analysis - Video

#### **Video Forensic:**

- Aims at showing images and videos used in court and media are verifiably true.
- Based on video content analysis
- Only focus on semantic information of video
  - What activity is going on in video?
    - Feature driven approach in illicit content detection [Rea et al.]
  - Integrate the labels of semantic concepts into retrieving function as well as topic modelling
  - Video Captioning provides descriptions in terms of content





# Joint Semantic Analysis - Video

#### **Video Captioning**

- Learning sequential features from frames
- Generating natural sentence with respect to content
  - Might not efficient for longer video
    - Video summarization
      - Detect key frames
    - Image or Video captioning

	0:00	2:19	
		the ending title screen see the ending title screen	
	0:05		
<b>GT</b> : A man in a room holds a bike and talks to the camera <b>MDVC</b> : A man is seen speaking to the camera while standing in front of a bike			
	0:55		
	GT: The man adjusts a and talks off the front tire, and folds the bike in half on itself MDVC: He then moves the bike and bike to the camera		
	1:47 🛏	2:19	
	GT: The man unfolds the bike and puts the tire back on MDVC: The man then moves the bike and the man continu	ues to speak to the camera	[lashin et al.]





#### **Topic modelling**

- As so far, we assume that the data with various modalities is content coherent in the communication
- Textual semantic representation of multimedia data is now available





### Joint Semantic Analysis - Textual semantic representation



2018.02.10 16:40 Suprise me

2018.02.10 16:45

No, jaguar gives us better swift and power

#### 2018.02.12 09:22

A man is driving a blue car

2018.02.12 09:23 Yeah....Let's rock it!!!!





### Joint Semantic Analysis - Textual semantic representation







#### **Topic modelling**

- Assume the communication is mixture of finite topics
- The words occur in similar contexts in text capture same topics
  - Mouse, cat, Tom & Jerry →Cartoons
  - Mouse, keyboard →Computer supplies





### **Topic modelling**

- Assume topics are distributions of words.
- Generating a document is modelled as a generative event model:
  - Choose a distribution over the topics
  - For each word, choose a topic assignment and choose the word from the corresponding topic
- Goal:
  - Inferring the latent topic structure from given data







#### Outcomes

- Semantic annotation of each given artifact
- Semantic label of each given artifact
  - Captures the communication network with respect to the semantic topics in communication







#### Outlook

- Integrate expert knowledge in this pipeline
- Focus on developing a alias matching strategy in order to match the people who have different names in different communication channels as well as devices
- Taking time information in topic modelling





# Thank you for listening







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