



# Hot Topics in Secure Identity Research

## Winter Semester 2020/2021

Eric Klieme, Alexander Mühle, Andreas Grüner  
Chair Internet Technologies and Systems

Winter Semester 2020/2021

# Topics - Summary

- In this seminar we will focus on three fields of secure identity research
  - Analyzing P2P network properties (Alexander)
  - Authenticating the users through behavioural aspects (Eric)
  - Self-Sovereign Identity management (Andreas)



## Hot Topics in Secure Identity Research

Eric Klieme  
Alexander Mühle  
Andreas Grüner  
Chart 2

<https://hpi.de/friedrich/moodle/course/view.php?id=132>

▼ Internet Technologies and Systems

▼ Winter Semester 2020/21

 Hot Topics in Secure Identity Research  

 Mathematik I – Diskrete Strukturen und Logik   

 Internet Security – Weaknesses and Targets  



**Hot Topics in  
Secure Identity  
Research**

Eric Klieme  
Alexander Mühle  
Andreas Grüner  
Chart 3

For questions during the presentation:

[uni-potsdam.zoom.us/j/65841318030](https://uni-potsdam.zoom.us/j/65841318030) (Passcode: 23646388)



# Hot Topics in Secure Identity Research

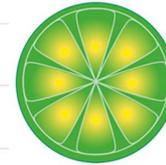
## Analysing P2P Network Participants

Alexander Mühle  
alexander.muehle@hpi.de

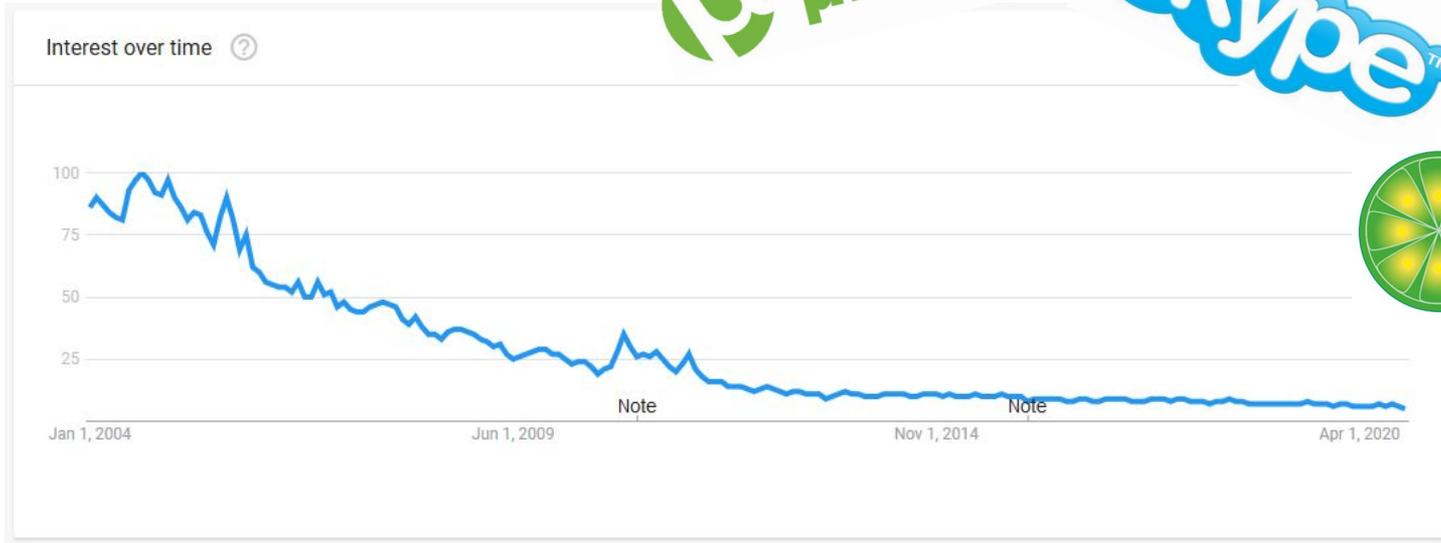
# HPI – Secure Identity Lab

## P2P Networks

### ■ Peer-to-Peer... who cares?



**LimeWire**



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Research**

Alexander Mühle

Chart 5

# HPI – Secure Identity Lab

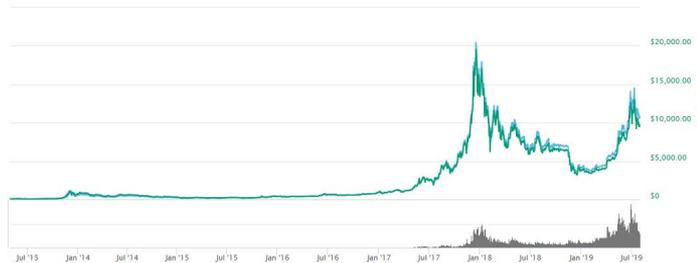
## Cryptocurrencies

### ■ Bitcoin

- First published 2008
- Digital Cash ⇒ Pseudonyms only
- Gained broad public awareness in 2017 through speculation
- Drug trade, money laundering and cybercrime
- Illegal activity as much as \$72 Billion [0]



coinbase



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Research**

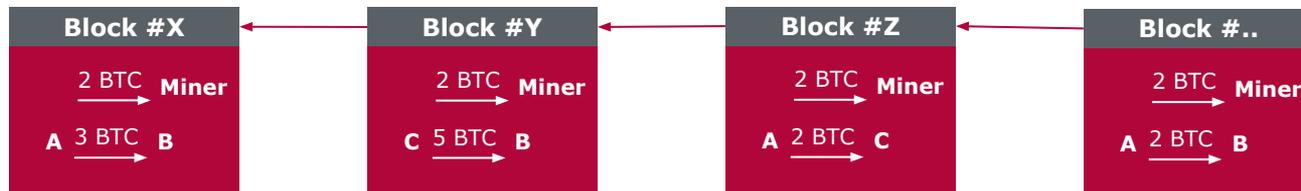
Alexander Mühle

[0] Foley, Sean, Jonathan R. Karlsen, and Tālis J. Putniņš. "Sex, drugs, and bitcoin: How much illegal activity is financed through cryptocurrencies?." *The Review of Financial Studies* 32.5 (2019): 1798-1853.

# HPI – Secure Identity Lab

## Transactions and Blocks

- **Distributed ledger** of financial data
- Participants publish **transactions** to the network
- **Miner** gather multiple transactions into a **block**
- Blocks are linked in a **chain**
- In order to publish a Block some **work** (Proof of Work) has to be done
- The chain with the **most work** is seen as the **consensus**
- Miner get a **reward** for new Blocks



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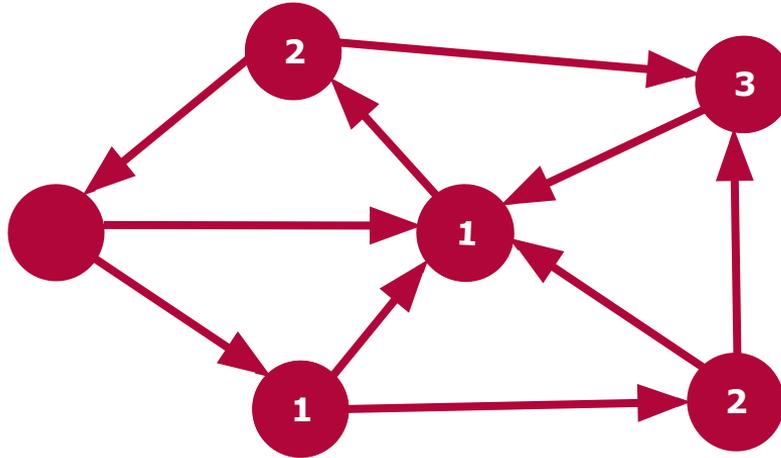
Alexander Mühle

Chart 7

# HPI – Secure Identity Lab

## Peer-to-Peer Message Exchange

- Messages are propagated like **Gossips** (or structured approaches)
- New messages are sent to one's peers



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Research**

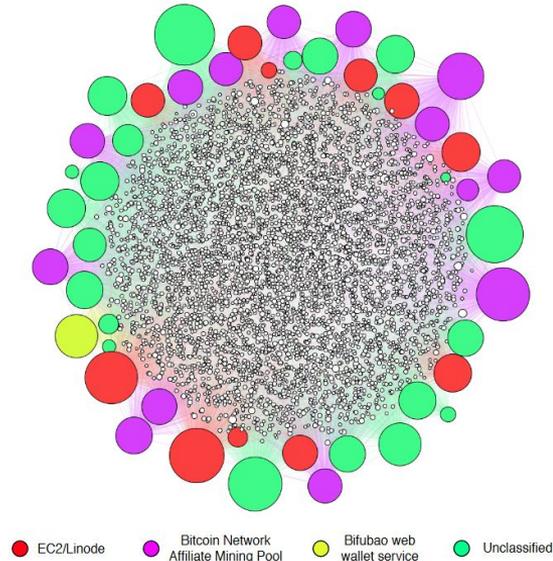
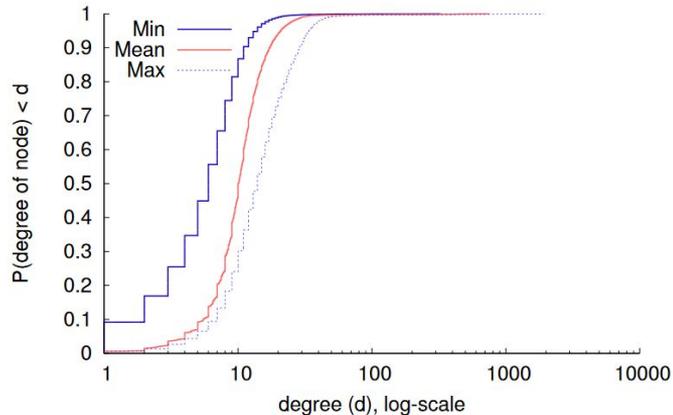
Alexander Mühle

Chart **8**

# HPI – Secure Identity Lab

## Bitcoin: Peer-to-Peer Message Exchange

- Most nodes have between **active 7-12 Neighbours** [1]
- Some nodes are very well connected
  - Miners
  - Exchanges



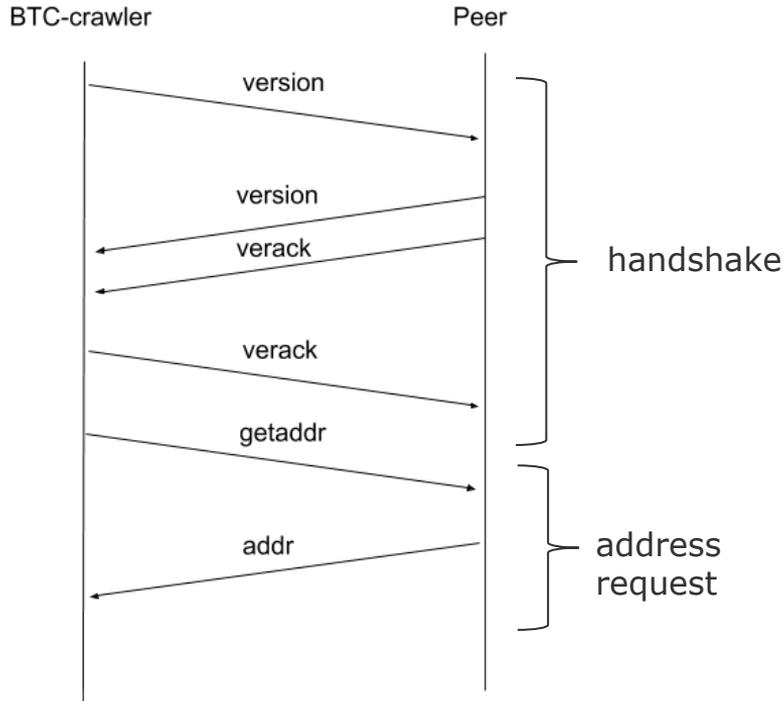
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Chart 9

# HPI – Secure Identity Lab

## Bitcoin: Peer Discovery



- 1000 addresses per message
- 2500 addresses per request
- Addresses are selected at random for each request
- Reference Implementation has maximum of 20480 addresses
- $(1 - \frac{1}{20480})^x$

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Research**

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Chart **10**

# HPI – Secure Identity Lab

## It's not What You Know but Who You Know

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*"When systems are large and individual nodes only gain random knowledge of part of the network, their traffic can be detected by uniqueness of the information they have learnt"*

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Research**

Alexander Mühle

Chart **11**

[2] G. Danezis and R. Clayton, "Route Fingerprinting in Anonymous Communications," in *Sixth IEEE International Conference on Peer-to-Peer Computing (P2P'06)*, Sep. 2006, pp. 69–72, doi: [10.1109/P2P.2006.33](https://doi.org/10.1109/P2P.2006.33).

### Topic 1: Fingerprinting Bitcoin peers

- Can we track Bitcoin peers through the information we can gather on them?
  - **Peer database**
  - Handshake information
  - Offline time, ...
- Analyse collected information (building on the existing network crawler) for uniqueness using Spark/Zeppelin
- Evaluate and test your approach in the real Bitcoin network



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Research**

Alexander Mühle

### Topic 2: Crawling and Analysing Ethereum peers

- How can we get the most complete view of Ethereum node peer databases?
- Can we estimate node age of Ethereum peers reliably?
  - **Peer database**
  - Kademlia buckets
- Analyse collected information (building on the existing network crawler) for uniqueness using Spark/Zeppelin
- Evaluate and test your approach in the real Ethereum network



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Research**

Alexander Mühle

### What will we do if you choose one of these topics

- **Learn about** peer-to-peer message exchange and propagation
  - Gossip Protocols (Bitcoin...)
  - Kademlia Protocol (Ethereum...)
- **Program** network software (i.e python3)
- Basics of an **ETL process** (extract, transform, load)
  - Elasticsearch, Spark
- **Write a paper** with your advisor

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Research**

Alexander Mühle

## **Bring Your Own Ideas**

Do you have other interesting ideas on what to do with collected network data?

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Research**

Alexander Mühle

Chart **15**



# Hot Topics in Secure Identity Research

## Behavioral Authentication

Eric Klieme  
[eric.klieme@hpi.de](mailto:eric.klieme@hpi.de)

# Traditional Username/Password authentication may not be the perfect solution for today's internet service usage

## Problem

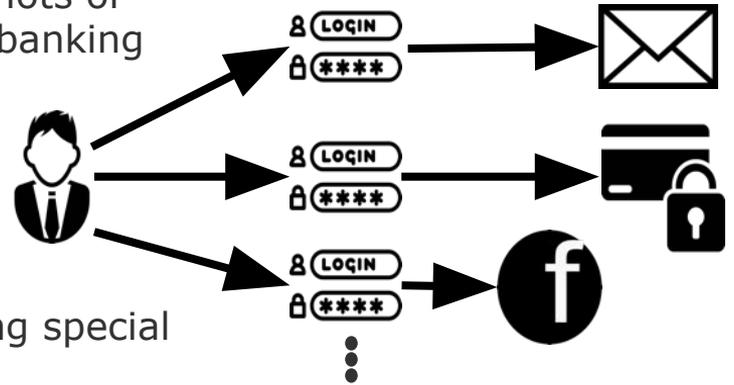
- A user has 80++ passwords on average and uses lots of different services in a range from social media to banking applications

## Solution (in theory)

- Different password for every service
- Each password of a certain length, maybe including special letters
- Only remembered, not written down anywhere

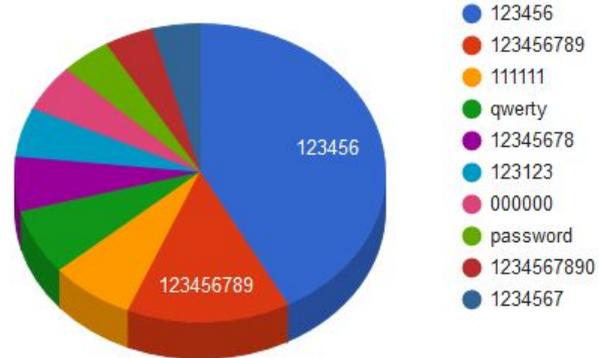
## Solution (assumed)

- Complex passwords hard to remember, use a much simpler
- Same passwords for different services



# HPI Identity Leak Checker confirms the assumed real world situation

- Service to check if identity has leaked based on freely accessible sources of leakages
- Currently database of ~ 12 billion user accounts
- Main findings:
  - Very simple passwords used
  - A lot of services either apply no hashing at all or just weak approaches (~60%)

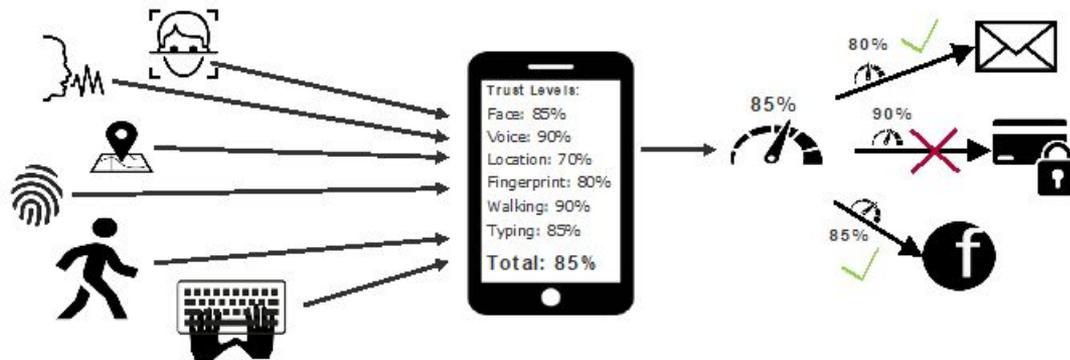


Distribution of top 10 leaked passwords

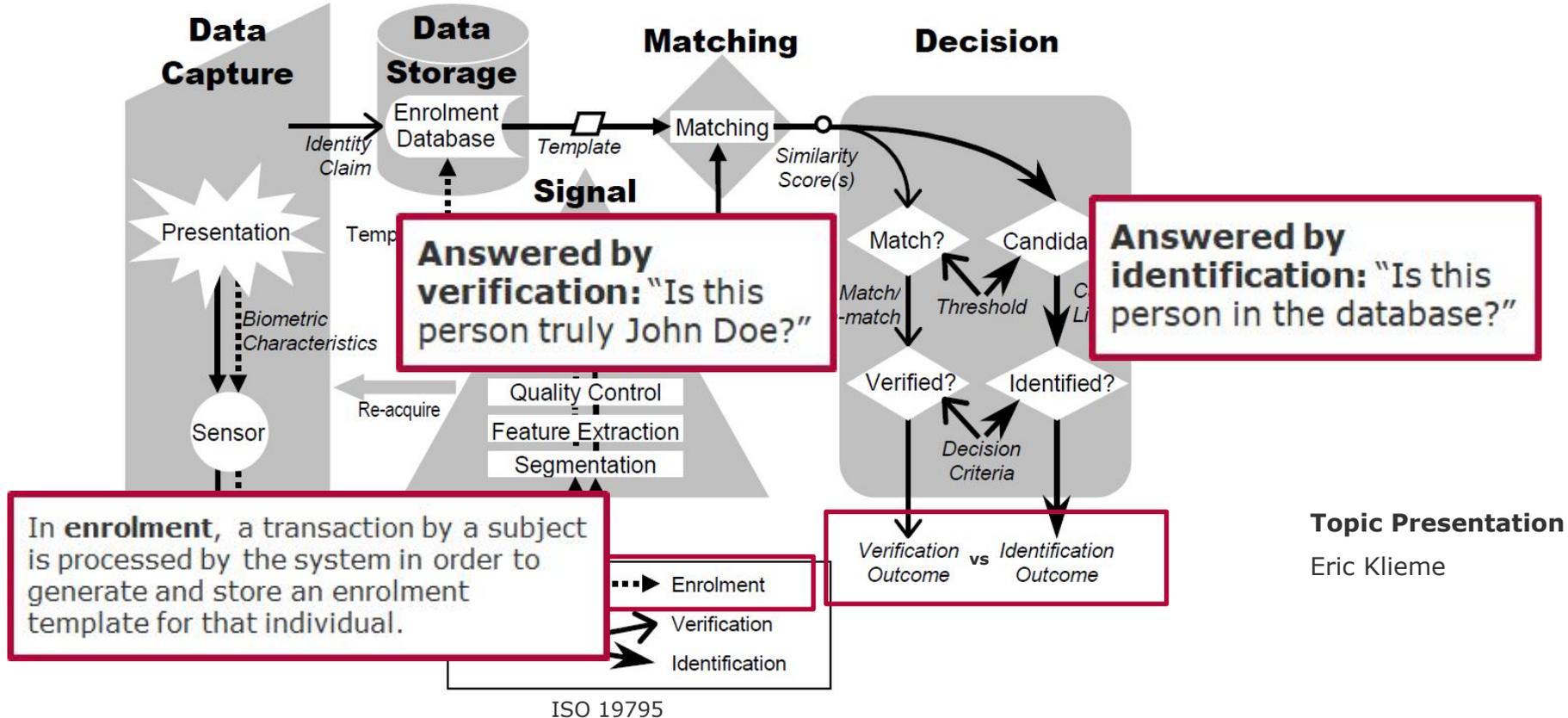
- <https://sec.hpi.de/ilc/>

# Alternative: Analyze user's behaviour continuously in the background based on **behavioral biometrics**

- Access sensors on devices around users
  - Devices that are “always” near-by, e.g. (smartphone, wearables)
  - Devices that are used, e.g. notebooks, pcs
- Sample behaviour via sensors, e.g. accelerometer, microphone, APIs
- Use biometric systems to create templates of users based on behaviour and later use these templates for identification or verification
- **One Vision:** Aggregate all results for **continuous authentication**



# Behavioral Authentication Systems usually include **Biometric Systems with Machine Learning**



# Behavior-Based Authentication Research: Status Quo & New Challenges

## Behavioral Authentication Research at HPI

### Behavior-based Authentication Systems

### Behavior Algorithms

### Experiments

#### Challenges & Research Questions

What is required to use behavior-based authentication systems as alternatives to password-based?

Which algorithms are suitable for the different areas of behavior to verify identities?

How can I effectively collect data in experiments and how can I verify my own approaches in the real world?

#### Projects

**Modeling Behavioral Authentication Systems and Evaluations:** A unified understanding and domain model of all aspects of behavioral authentication systems is required for automation and simplification of research and deployment efforts

**Robust gait-based user verification:** Smartphones are not only in your pocket when you walk, other scenarios such as reading and phone calls are also of interest.

**User verification through typing sounds:** Use the smartphone to recognize the user while he's typing on the device or next to it

**Smart door handles:** Use door handles that sense touch and acceleration to identify users

**Large scale data collection on smartphones:** Integrate users in labeling process in the wild and let them annotate data even further

**Techniques for less supervision and more realistic behavior during experiments:** Reduce supervisor interaction with questionnaire-like experiments



# Topics

## Behavioral Authentication

Eric Klieme  
[eric.klieme@hpi.de](mailto:eric.klieme@hpi.de)

# Topic 1: **Experiments / Authentication Systems**

## Behavioral Authentication Implementation Platform

- Motivation: The core components of any behavioral system are similar
  - Data Capturing, Storage, Signal Processing, Matching, Decision
- Problem:
  - Any approach usually implements pipeline from scratch although different frameworks exist and biometric system is “formalized”
- Idea:
  - Analyze existing frameworks to come up with domain specific (model-driven) implementation platform for different purpose
    - For **Evaluation** => **Algorithm Improvement** (python, R, Matlab...)
    - For **Deployment** => **Real-World Check** (android, ios, cloud container...)
    - For **Benchmarking** => **Comparison** (processing complexity, runtime, memory consumption...)

**Topic Presentation**

Eric Klieme

# Topic 1: **Experiments / Authentication Systems**

## Behavioral Authentication Implementation Platform

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- Contribution: „Proof-Of-Concept“
  - Search and Analyze a lot of related technologies for machine learning on different platforms
  - Come up with an implementation platform design
  - Prototype platform and evaluate it based on real approaches from the related work for evaluation and real-world setups
  
- Nice-To-Have Skills
  - Python, Android, Java, Machine Learning (Frameworks)...
  - Strong focus on systemization

**Topic Presentation**

Eric Klieme

# Topic 2: **Experiments / Algorithms**

## Door handle authentication

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- Idea: Let users be authenticated based on the way they use a door handle
  - How they “touch” a handle (Resistive / Capacitive Touch)
  - How they “interact” with it (Acceleration)
  - How their hand looks like? (Computer Vision)
  - How they approach it (Bluetooth Signal)
- “Basic” Prototype with extended door handle, data collection server, and user equipment exists
- **Project:** Finish prototype and do large scale user study and Machine Learning
  - Finish the prototype for robust data recording, participant tracking and more
  - Come up with a plan for a large-scale collection study, e.g. different offices, kitchens etc. - Although Covid-19 WiMis are in the Office
  - Finally apply ML in specific verification or identification scenarios

# Topic 2: Experiments / Algorithms

## Prototype "Evolution"

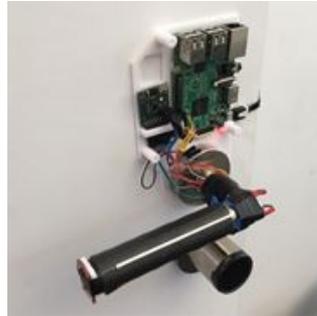
Version 1



door handle with touch sensor



Version 2



door handle with touch sensor and accelerometer



wrist bands for proximity tracking for automatic labeling of people opening the door

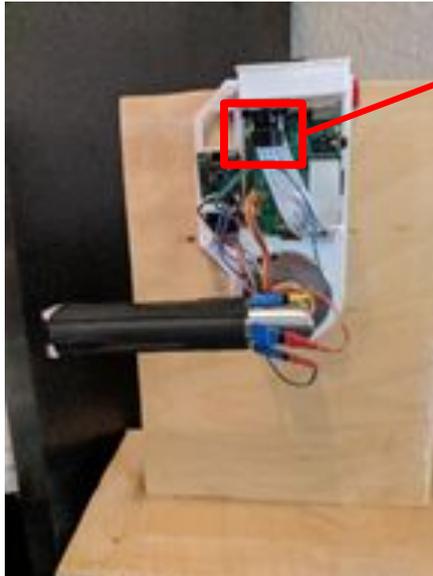


data collection infrastructure with dashboard

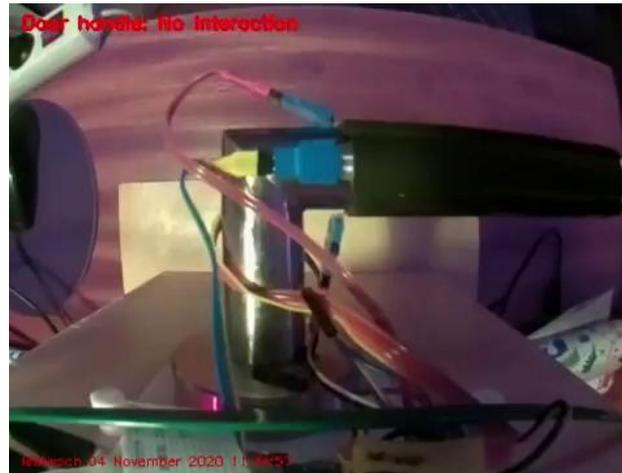
# Topic 2: Experiments / Algorithms

## Prototype "Evolution"

Version 3 : **Goal** of this seminar



Version 2 + **Computer Vision** + X (your ideas)



**Topic Presentation**  
Eric Klieme

# Topic 2:

## Door handle authentication

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- Contribution: „Proof-Of-Concept / User Study“
  - **Goal:** Verify User identities, Identify users from an office
  - **Data:** Touch data, accelerometer data, proximity data, CV + X?
  - **Your team's contribution**
    - Come up with a nice processing of the data using machine learning
    - Study design and data collection for large scale collection
    - Improve data collection Infrastructure
  
- Nice-To-Have Skills
  - Python, Machine Learning, Raspberry Pi & Friends (3D Printing?)
  - Strong communication skills, creativity
  - Interest in conducting studies

**Topic Presentation**

Eric Klieme

# Topic 3: **Experiments**

## Integrate users into labeling

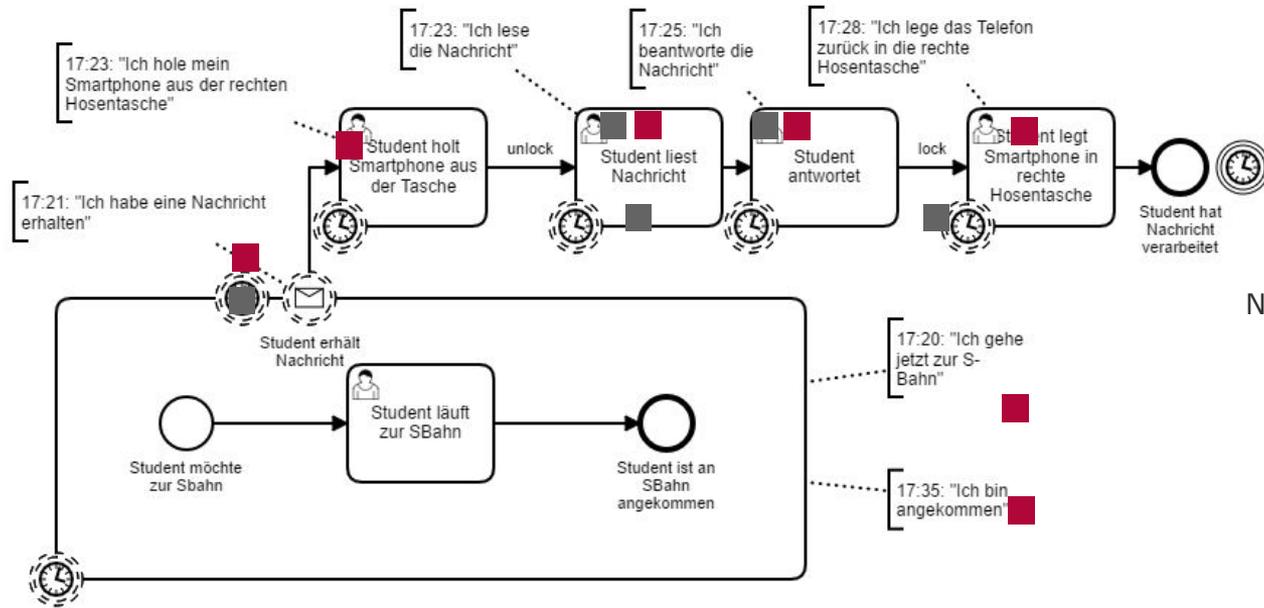
- Data collection is hard for behavioral data
- Problem:
  - Participants should behave **as natural as possible** with all contexts (e.g. different states of mind, clothes, times during a day etc.)
  - **But:** Motion data is sampled by sensors and not very descriptive
    - Who can see what a person is doing just by seeing X-Axis of accelerometer of smartphone, for example?
  - **Until now:** Supervised collection of data with researchers paying attention to correct labelling in a specific scenario
    - Adds a lot of bias and becomes very complex for diverse contexts
- **Idea:** Let the user help us
  - They label their own data here and then
  - Self-labeling used in psychology research

**Topic Presentation**

Eric Klieme

# Example: A user interacts with the smartphone on the way to public transport

## Access to information sources to sample behavior can be quite difficult



No access possible (subconsciousness)

■ Student, implicit

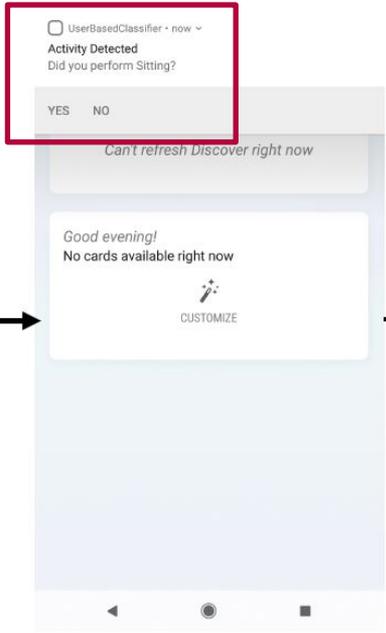
■ App, explicit

Access limited, sometimes API but not available everywhere

**Idea:** Basic activity detection in background, push notifications for user-request to annotate

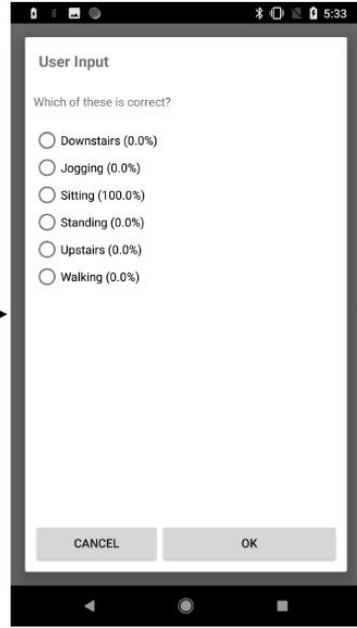
# Possible flow?!

The model classifies an activity of the user (e.g. sitting)



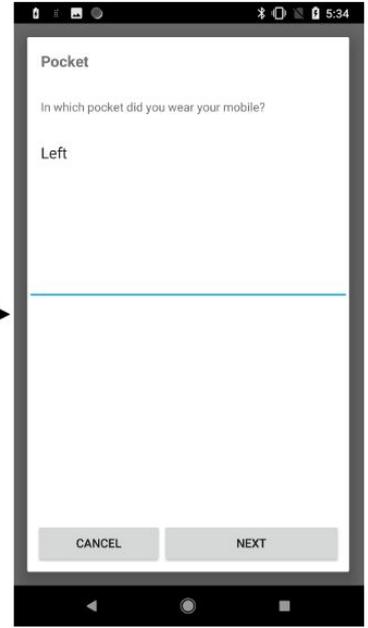
## Notification

User gets notified about the activity. He can say whether the class is correct. If it is incorrect and he wants to correct it, he can tap on the classification.



## Correction

User inputs to the system the class that would be correct.



## Context

User gives context information.

# Topic 3: User-supported large-scale data collection application

- Contribution: „Proof-Of-Concept / User Study“
  - Related Work analysis
  - App and Backend Engineering, Algorithms
    - first PoC exist based on own app + Aware Experiment Platform Backend (runs within HPI)\*
  - Evaluation in a user study, mostly Usability / Feasibility of approach
    - **Should perfectly work with COVID-19** - since we want any person to take part individually
  
- Nice-To-Have Skills
  - Java/Kotlin, Machine Learning, Tensorflow
  - Strong communication skills, creativity
  - Interest in conducting studies

\* <https://awareframework.com/>

**Topic Presentation**

Eric Klieme

## **Bring Your Own Ideas**

Do you have other interesting ideas on what to do in the field of behavioral authentication in general?

The door handle started as a student's idea as well ;)

**Hot Topics in  
Secure Identity  
Research**

Eric Klieme

Chart **33**



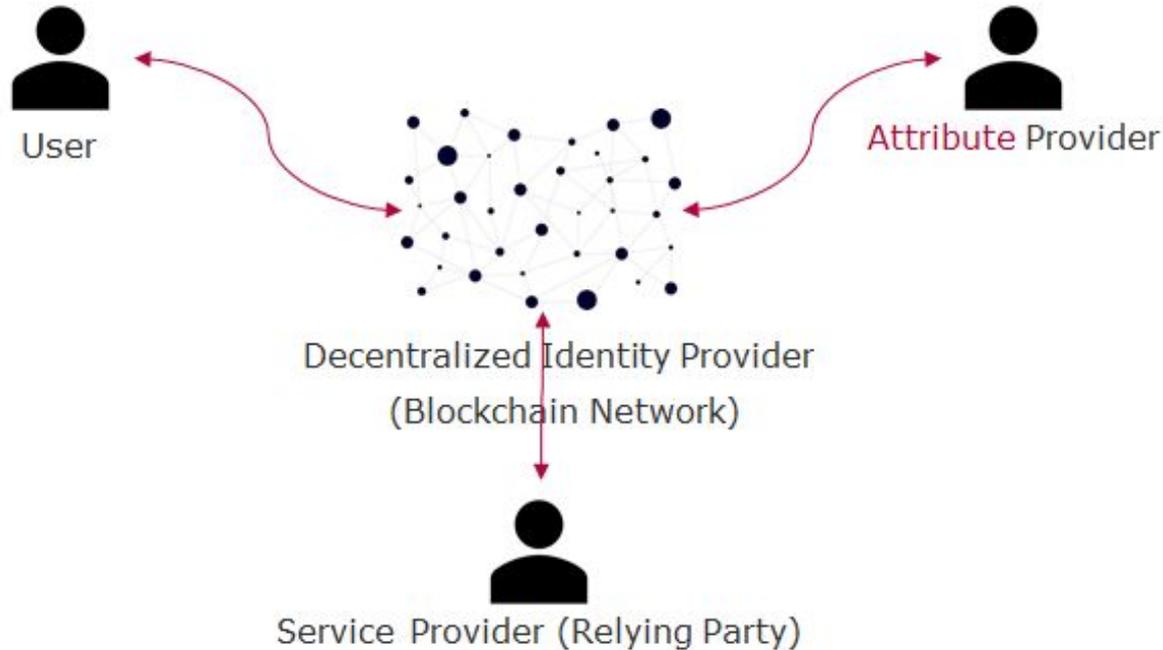
# Hot Topics in Secure Identity Research

## Self-Sovereign Identity Ecosystem

Andreas Grüner  
[andreas.gruener@hpi.de](mailto:andreas.gruener@hpi.de)

# Self-Sovereign Identity Overview

Self-sovereign Identity: *"individual control across any number of authorities"* (by C. Allen)



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Chart **35**

# Self-Sovereign Identity Solutions



and many more ...

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Chart 36

# Project 1: Interoperability of SSI Solutions and Networks

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- Existence of a myriad of SSI solutions and networks following different implementation approaches
  - uPort – Smart contracts on Ethereum
  - Jolocom – Smart contracts on Ethereum
  - Sovrin (Hyperledger Indy/ Aries) – Dedicated set of blockchains
  - Blockchain Helix/ Civic/ SelfKey
  
- What means “interoperability” and which level exists?
- Which concepts and approaches for interoperability exists or could be developed?
- What are the advantages and disadvantages of these approaches?

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Chart **37**

## Project 2: Usability of Identity Wallets/ End User Agents

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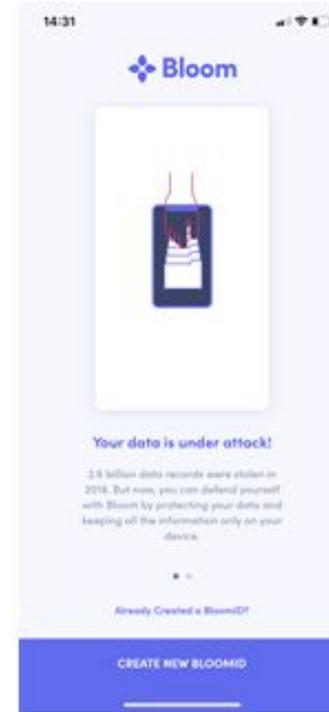
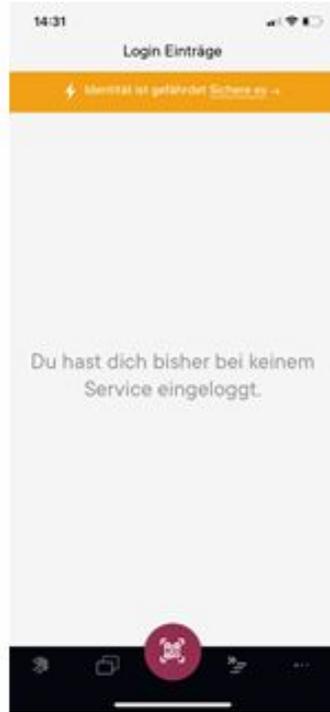
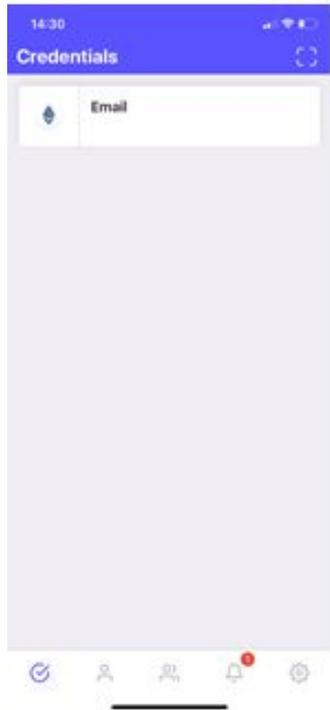
- SSI solutions provide an identity wallet or agent for end users to control and use their digital identity for interactions
- SSI and their identity wallets/ agents are a new topic for end users. Therefore, usability plays an important role.
  
- What is usability? How is usability measured?
- What are core functionalities of an identity wallet/ agent?
- How is the usability of major solutions?
- What are deficiencies/ improvements for the major solutions?

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Chart **38**

# Project 2: Usability of Identity Wallets/ End User Agents



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Chart 39

## Project 3: Systematization of the SSI Ecosystem

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- The current SSI ecosystem is overwhelmingly confusing. Manifold actors, projects, initiatives, standardization bodies, governmental groups, communities, companies, universities and research groups exists.
- Different SSI solutions, blockchains, protocols, frameworks, interoperability products and further aspects are developed
  
- What actors, initiatives and projects exists?
- What do these actors develop? What are their interests?
- How can they be arranged in a taxonomy/ classification?

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Secure Identity  
Research**

Andreas Grüner

Chart **40**

## Project 4: Security Analysis Methodology for SSI

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- SSI and blockchain are emerging concepts
  - Identity management is on the forefront of security and must be secure itself
  - Formal security analysis approaches exists to improve security posture of systems
- 
- What is the general SSI architecture? What are the components?
  - Which existing security analysis methodologies (e.g. Attack Trees) can be applied?
  - What would be a SSI specific security analysis methodology?

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Andreas Grüner

Chart **41**

## Project 4: Security Analysis Methodology for SSI

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- Mühle, A., Grüner, A., Gayvoronskaya, T., Meinel, C.: A Survey on Essential Components of a Self-Sovereign Identity. Computer Science Review. 80-86 (2018)
- Kupferberg, M.: Blockchain-Based Identity Management: A Survey from the Enterprise and Ecosystem Perspective. IEEE Transactions on Engineering Management. 2019
- Universal Resolver. Online: <https://github.com/decentralized-identity/universal-resolver>
- Hyperledger Indy. Online: <https://www.hyperledger.org/projects/hyperledger-indy>
- Hyperledger Aries. Online: <https://www.hyperledger.org/projects/hyperledger-aries>
- C. Lundkvist, R. Heck, J. Torstensson, Z. Mitton, M. Sena: UPORT: A PLATFORM FOR SELF-SOVEREIGN IDENTITY. Online: [http://blockchainlab.com/pdf/uPort\\_whitepaper\\_DRAFT20161020.pdf](http://blockchainlab.com/pdf/uPort_whitepaper_DRAFT20161020.pdf)
- uPort. Online: <https://www.uport.me>
- Decentralized Identifiers (DIDs) v1.0. Online: <https://www.w3.org/TR/did-core/>
- Verifiable Credentials Data Model 1.0. Online: <https://www.w3.org/TR/vc-data-model/>

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Andreas Grüner

Chart **42**



# Hot Topics in Secure Identity Research Organization

# Seminar Goals

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## **Our goals for this seminar**

- You should learn to dig into a specific topic and find a gap you want to fill with your group
  - Find and analyze related work
  - Define your own research question for the seminar
  - Understand and apply new technologies in a research context
- You should learn to self-organize your group work in a defined timeframe
- You should learn how to write a research paper
- You should learn how to communicate with your team / supervisors
  - If a problem occurs: Identify it, Talk about it (with us), Control / Fix it!

# Workload

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- This seminar will give you 6 ECTS if you finish successfully
  - **1 ECTS ~ 30h** of work => In total, spending about 180h is reasonable
- We would consider *lecture time* as *working time*:
  - 02.11.2020 – 12.02.2021 (~14 weeks)
  - presentation at the end of that time, documentation deadline shortly after
- 180h/14 weeks => 13h work a week per student
  - ~ **1,5 days of working** for the seminar only **per week**
  - A group of four students ~ 52h (7-8 PD) **per week**
- Although calculation mostly holds theoretically, rule of thumb for our expectations during progress meetings

# Timeline (approx)

02.11.2020 Official first lecture / meeting, Q & A session

**08.11.2020 Submission of interest**

13.11.2020 Topic Assignment / Discussion

**16.11.2020 Start working**

21.12.2020 Intro + Related Work documented \*

**10.01.2021 Idea Presentation / Amazing Prototype**

17.01.2021 Approach documented \*

14.02.2021 Evaluation + Conclusion documented \*

**21.02.2021 Final Presentation**

28.02.2021 Code Submission & Paper Submission

**Provisional Dates!**

usually, we will have a weekly meeting with each group to talk about progress, problems, etc.. Time & kind of meeting is negotiated individually

\* ... you will get a detailed review from us afterwards

Chart **46**

# Evaluation

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- Idea Presentation ~15%
  - Motivation, Related Work, Rough Approach / First Prototype
- Final Presentation ~25%
  - Idea Presentation + Full Approach, Evaluation, Discussion, Future Work
- Report ~30%
  - IEEE / ACM conference paper style
- Implementation ~20%
  - Readme, Logging/Tracing, Automation, Architecture / Code Docs etc.
- Communication ~10%
  - Meeting Organization / Protocols, Questions & Concerns, Problems, Active Discussion Requests etc.

# Enrollment

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- If you are interested (as a single person, as a team):
  - Enroll to Moodle
    - <https://hpi.de/friedrich/moodle/course/view.php?id=132>
  
- Until 8th of November (Sunday!)
  - Ranked topic selection of top 3 choices



Thank you  
for your attention!

Andreas Grüner, Eric Klieme, Alexander Mühle  
Chair Internet Technologies and Systems  
Winter Semester 2020/2021