# Analyzing keystroke dynamics using transformations and successive averaging

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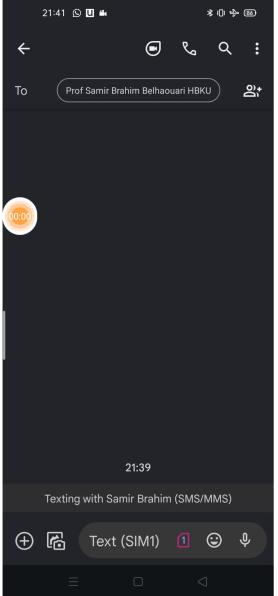
#### SECURITY IN A DIGITAL AGE

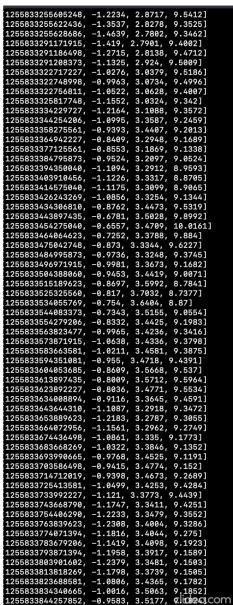
- First line of defense: passwords
- Bio-metric features
  - Face
  - Finger print
  - Iris
  - Additional hardware required
- One-Time Password
  - Expensive



## KEY-STROKE DYNAMICS BASED AUTHENTICATION

- Behavioral authentication method
- Quantitative data from all user interaction with touchscreens and device sensors
- No need of additional hardware
- Useful for
  - Continuous monitoring of device usage
  - Detecting suspicious activity on a device







# Typing 70 characters in 43 seconds in a smartphone generates over 24480 rows of data by touch sensors

Stragapede, Giuseppe, Ruben Vera-Rodriguez, Ruben Tolosana, and Aythami Morales, 'BehavePassDB: Benchmarking Mobile Behavioral Biometrics', 2022 <a href="http://arxiv.org/abs/2206.02502">http://arxiv.org/abs/2206.02502</a>



# FEATURE EXTRACTION FROM HIGH VOLUME DATA IN SHORT TIME

## DATA TRANSFORM AND SUCCESSIVE AVERAGING





Transform on each feature



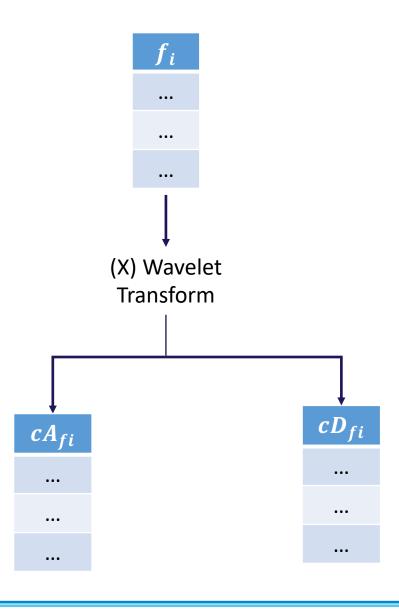
Successive averaging of generated coefficients



Combine to form RGB images

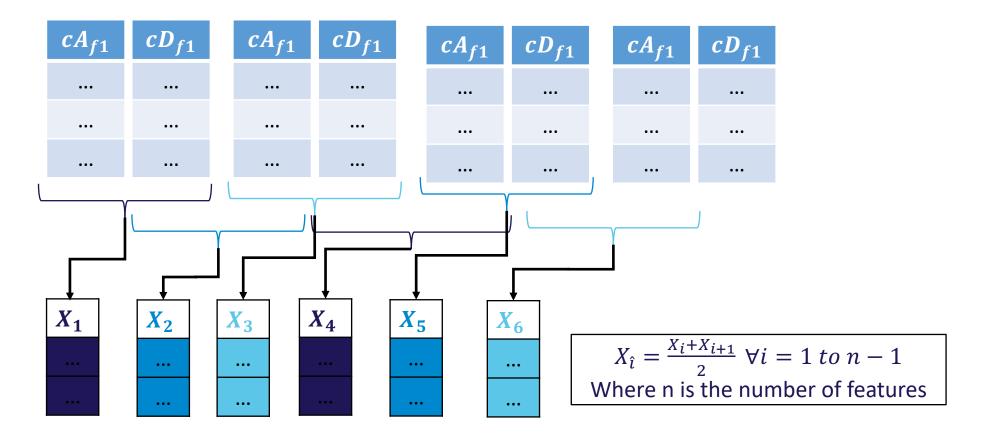
#### TRANSFORM ON EACH FEATURE

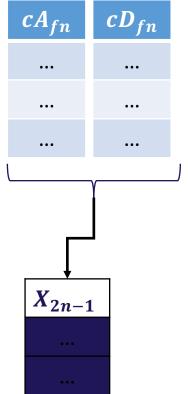




#### **SUCCESSIVE AVERAGING**



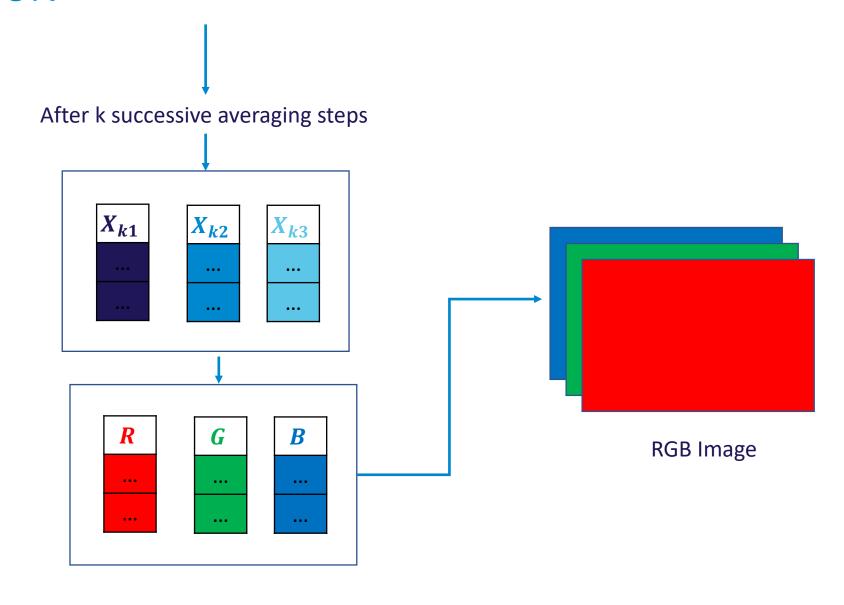




At every step, number of features created is 1 less than number of features in previous step

#### **TRANSFORMATION**







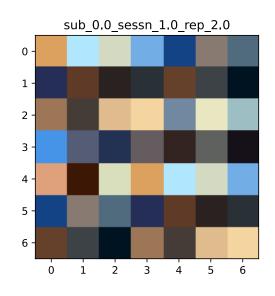
## **EXAMPLES ON KEY-STROKE DATASETS**

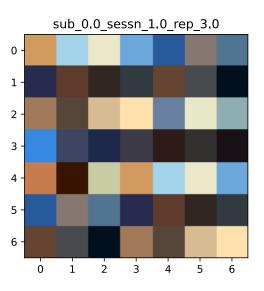


51 subjects (typists), each typing a password (.tie5Roanl) 400 times



#### Same subject performing same activity at different sessions



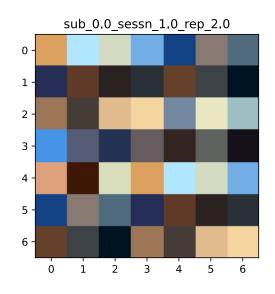


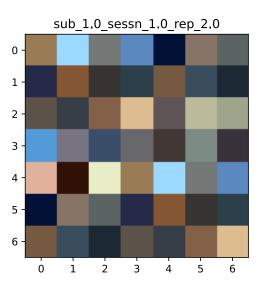
Kevin S. Killourhy and Roy A. Maxion. "Comparing Anomaly Detectors for Keystroke Dynamics," in Proceedings of the 39th Annual International Conference on Dependable Systems and Networks (DSN-2009), pages 125-134, Estoril, Lisbon, Portugal, June 29-July 2, 2009. IEEE Computer Society Press, Los Alamitos, California, 2009

T. Sing, O. Sander, N. Beerenwinkel, T. Lengauer. "ROCR: visualizing classifier performance in R," Bioinformatics 21(20):3940-3941 (2005).



#### Different subjects performing same activity



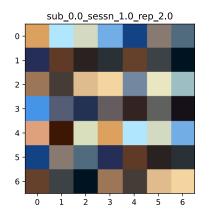


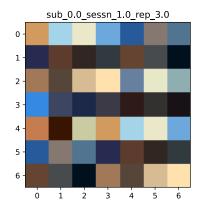
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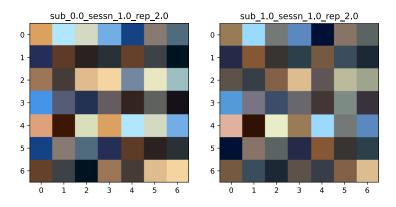
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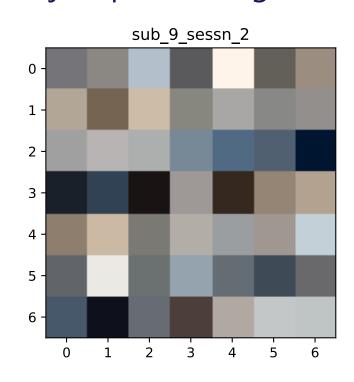


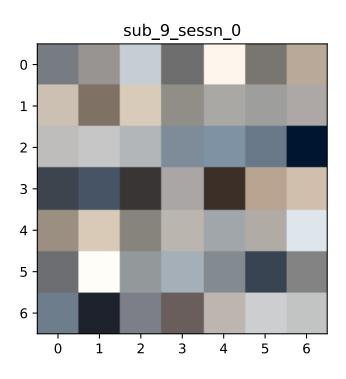
53 participants typing the term "rhu.university" 15 times in 3 sessions

El-Abed, Mohamad, Mostafa Dafer, and Ramzi El Khayat, 'RHU Keystroke: A Mobile-Based Benchmark for Keystroke Dynamics Systems', Proceedings - International Carnahan Conference on Security Technology, 2014-Octob.October (2014), 4–7 <a href="https://doi.org/10.1109/CCST.2014.6986984">https://doi.org/10.1109/CCST.2014.6986984</a>



#### Same subject performing same activity at different sessions

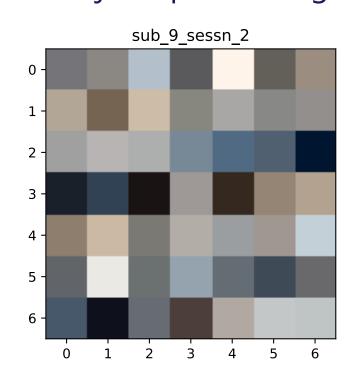


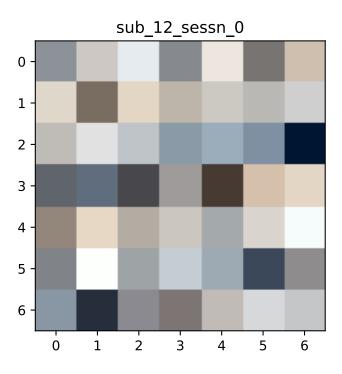


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#### Different subjects performing same activity

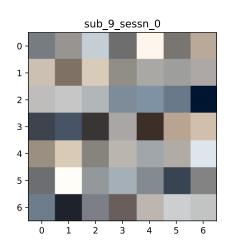


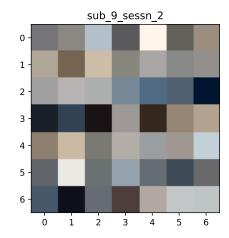


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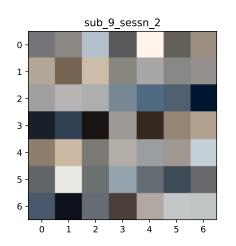


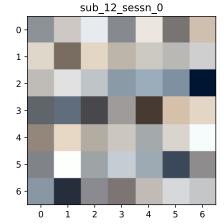
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# Different subjects performing same activity





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#### BEHAVE PASS DB

#### Includes several touch gestures

- Free-text keystroke
- Swipe
- tap dynamics

#### Background sensors

- Accelerometer
- Gyroscope
- Magnetometer
- linear accelerometer
- gravity sensor).

El-Abed, Mohamad, Mostafa Dafer, and Ramzi El Khayat, 'RHU Keystroke: A Mobile-Based Benchmark for Keystroke Dynamics Systems', Proceedings - International Carnahan Conference on Security Technology, 2014-Octob.October (2014), 4–7 <a href="https://doi.org/10.1109/CCST.2014.6986984">https://doi.org/10.1109/CCST.2014.6986984</a>

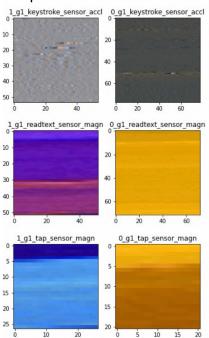
#### **EXAMPLE**







#### Impersonator vs authentic user.

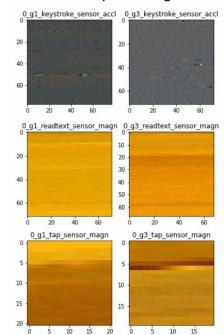


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#### Authentic User performing same activity





#### GITHUB REPOSITORY WITH SAMPLE TRANSFORMATION CODE

https://github.com/ashhadulislam/ICCST2022KeyStrokeDynamics

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  - <u>aislam@hbku.edu.qa</u>