

# Long-term Active User Authentication Using Multi-modal Profiles

PIs: Venu Govindaraju, Ifeoma Nwogu, Shambhu Upadhyaya  
Computer Science and Engineering, University at Buffalo

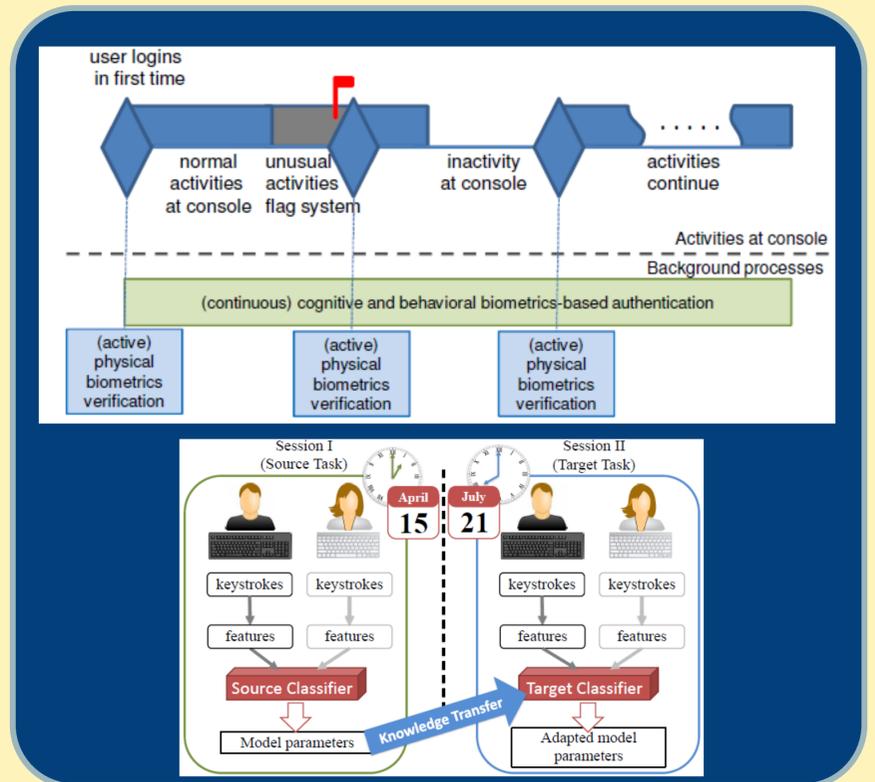
CNS-1314803

## Project Objectives

Develop an adaptive process to advance the current state of identity authentication in computer systems, using different novel individual biometrics traits

An intelligent environment where a user identifies him/herself at a console and simply starts working, while **continuous authentication** occurs in the background, actively increasing the authentication processes when the **evidence is weak**, but invisible to the user, as he/she works without interruptions or performance compromises

- Data collection
- Analysis of secondary features of key stroke dynamics
- Machine learning algorithms for biometric recognition
- Development of language usage as a cognitive biometric



## Approach

### Shared Keystroke Dataset for Continuous Authentication

- One of the largest publicly accessible keystroke datasets for long text (> 300 users)
- Characterized to reflect
  - Temporal aspects of typing patterns
  - Effect of keyboard layout variability
- Textual data included
- Mouse movements and system events data

### Related Work

	#Subject	#Sessions	Duration	Gap b/w Sessions	Clock Resolution	Keyboard variability	Gender (M:F)	Age
Clarkson	39	2	1 hour	Mostly 1 or 2 month	-	-	-	-
MSU P1	51	2	10 – 16 min	Same day	-	-	-	-
MSU P2	30	Around 5	60 sec	-	-	-	-	-
Ours	148	3	50 min	28 days	15 ms	Yes	113 : 35	20-30

### Our Experiment

A large scale data collection campaign • 4 months from Sept. to Dec. 2015 • 157 volunteers recruited • 2 keystroke activities involved • Transcribed and free text • 3 sessions for each participant • 50 minutes for each session • Approximately 1 month between sessions • 4 different types of keyboards utilized

### Data Anonymization and Quality Assurance

#### Privacy protection

- Randomly generated ID; dummy email accounts
- Built-in rule based sanitization functions
  - Remove username, email address, phone numbers

#### Incomplete data files removed

- 9 subjects removed
- 157 subjects → 148 subjects in first round

### Dataset Statistics

#### Number of raw keystrokes

- 5,700 keystrokes per session; Minimum 10,000 overall
- 17,000 keystrokes each subject

#### Time intervals between sessions

- 28 days on average

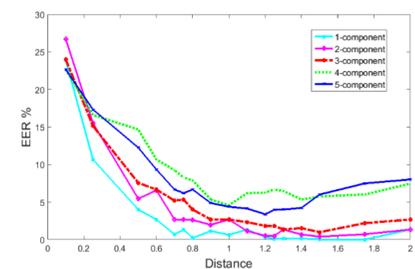
#### Gender information

- Female 35, Male 113

### Data Quality

#### Experiments on digrap using GMM

- Create a reference profile for each user using training feature set
- Test records compared against reference profile to measure similarity score
- EER comparison
- 0.01% (ours), 0.08% (Clarkson)



# Components	1	2	3	4	5
EER (%)	0.01	0.39	0.98	4.58	3.37

### Publications

- Y. Sun and S. Upadhyaya, "Secure and Privacy Preserving Data Processing Support for Active Authentication", *Information Systems Frontiers*, Volume 17, Issue 5, pp. 1007-1015, October 2015.
- H. Çeker and S. Upadhyaya, "Enhanced Recognition of Keystroke Dynamics using Gaussian Mixture Models", *MILCOM 2015*, pp. 1305– 1310, 2015.
- H. Çeker and S. Upadhyaya, "User Authentication with Keystroke Dynamics in Long-Text", *IEEE BTAS*, Niagara Falls, NY, 2016.
- H. Çeker and S. Upadhyaya, "Adaptive Techniques for Intra-User Variability in Keystroke Dynamics", *IEEE BTAS*, Niagara Falls, NY, 2016.
- Y. Sun, H. Çeker and S. Upadhyaya, "An Anatomy of Secondary Features in Keystroke Dynamics - Achieving More with Less", *8th WIFS 2016*, Abu Dhabi, UAE, December 2016.
- N. Pokhriyal, I. Nwogu and V. Govindaraju, "Cognitive-Biometric Recognition from Language Usage: A Feasibility Study", *IEEE Trans. Information Forensics and Security*, 12 (1), Jan. 2017.

Interested in meeting the PIs? Attach post-it note below!



National Science Foundation  
WHERE DISCOVERIES BEGIN

The 3<sup>rd</sup> NSF Secure and Trustworthy Cyberspace Principal Investigator Meeting  
January 9-11, 2017  
Arlington, Virginia

