# Keystroke Analysis Project for the Data Base and Data Mining course

Paulin Loïs, Badin de Montjoye Xavier, Gaziello Yannis, Menet Hugo

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#### Outline

- 1 Introduction
- 2 State of the art
- 3 Our work
  - First Observations
  - Experimental Protocol
  - Our implementation
  - Results



Keystrokes analysis for biometrics recognition. Why?

Keyboard.



- Keyboard.
- Fast.

- Keyboard.
- Fast.
- Relatively simple.



- Keyboard.
- Fast.
- Relatively simple.
- Reliable.



What is the scope of keystroke analysis?

Fixed text.



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- Fixed text.
- Free Text.

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- Fixed text.
- Free Text.
- Different languages.



#### What is the scope of keystroke analysis?

- Fixed text.
- Free Text.
- Different languages.
- Long time between learning and testing.

#### State of the Art

- Compute distances between two typing sessions
- Consider time sequences of keystroke as patterns
- Not applicable for small free texts (Curse of dimensionality)

First Observations

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First Observations

#### Measures

What can we measure in typing?

- Delay between pair of letters.
- Time on a key.
- Mean.
- Standard deviation.



First Observations

#### Observations

There is a difference in the means (with or without quartile) between the texts typed by two different users.

#### Example

 $X_l$ : learning,  $X_t$ : test

- Distance  $(A_I, B_t) = 459$
- Distance  $(B_l, B_t) = 240$
- Distance  $(A_I, A_t) = 43$
- Distance  $(B_I, A_t) = 153$

Experimental Protocol

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Experimental Protocol

#### Data Set Constructed

#### Data Set

7 persons.

#### Sample

- 6 entry of a same fixed phrase.
- 2 free text of around 60 words.

#### Example

Je certifie que cette soumission est le fruit de mon propre travail effectu en accord avec la Charte Anti-Plagiat.



Our work

Experimental Protocol

#### **Protocols**

#### Protocol 1: Fixed Phrases

Training on 3 fixed phrases. Test on the 3 remaining.



Experimental Protocol

#### **Protocols**

#### Protocol 1: Fixed Phrases

Training on 3 fixed phrases. Test on the 3 remaining.

#### Protocol 2: Free Text

Training on 1 free text. Test on 1 free text.



Our implementation

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```
for all apparition of a pair of letter in the test text do
    for all profiles p do
        \mu training mean for this pair and profile;
        \sigma training standard deviation for this pair and profile;
        d time for this apparition of this pair in the test text;
        \delta parameter of the algorithm, 1.5 here;
        if d = \mu \pm \delta \sigma then
           S_p = S_p + 1 for this profile;
        end
    end
end
```

Return profile with highest score

**Algorithm 1:** Closest profile



Results

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# Results: protocol 1

A correct and an incorrect result			
Name	lois:	Yannis :	
lois	28	22	
Yannis	16	23	
Xavier	15	19	
Angele	13	19	
hugo	20	24	
Emile	23	23	
red	21	24	

Our work

0000

Our work

0000

Results

# Results: protocol 1

# Variation with delta for protocol 1 delta correct/21 1 12 1.4 15 2 16 2.2 13

0000

Results

# Results: protocol 2

#### Few but encouraging results

lois: lois

■ hugo: hugo

■ Emile: Emile

red: Emile

#### Conclusion

Encouraging results, need more testing and narrowing our approach

#### Conclusion

- Encouraging results, need more testing and narrowing our approach
- Outlook
  - If two score are close, we could rerun with a different  $\delta$  (in front of the standard deviation).

# Bibliography I

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