

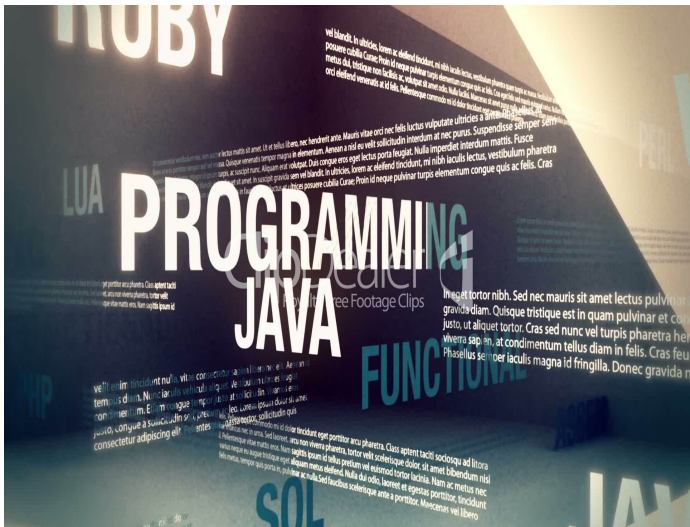
# Indian Statistical Institute, Kolkata at PR-SOCO 2016 : A Simple Linear Regression Based Approach

**Kripabandhu Ghosh<sup>1,2</sup>**  
**Swapan Kumar Parui<sup>1</sup>**

<sup>1</sup>Indian Statistical Institute, Kolkata, India

<sup>2</sup>Indian Institute of Technology, Kanpur, India

To predict the BIG5 personality traits of a person from her Java program code



# Programming and personality



# Programming and personality





# Outline

1 BIG5 personality

2 Features

3 Methodology

4 Results

5 Analysis

## BIG5 personality traits



# BIG5 personality : Neuroticism



# BIG5 personality : Neuroticism



## Motivation

Neurotics exhibit low emotional stability and so is likely to be less methodical in writing a code.

# BIG5 personality : Extroversion



# BIG5 personality : Extroversion



## Motivation

Extroverts are likely to express themselves and possibly provide meaningful comments in their code.

# Outline

- 1 BIG5 personality
- 2 Features**
- 3 Methodology
- 4 Results
- 5 Analysis

## FEATURES



## Determining factors

- Readability
- Efficiency

## Features : Multi-line comments (MLC)

- The number of genuine comment words in multi-line comments, i.e., between `/*` and `*/` found in the program code.
- We have not considered the cases where lines of code were commented.
- Eliminate code lines – E.g., using `[a-zA-Z][a-zA-Z]*[ ]*( matching System.out.println(“Even”); used in a Java code.`
- This feature value was normalized by dividing it by the total number of words in the program file
- Indicator of code readability and meticulousness of the coder.

# Features : Multi-line comments (MLC)

Feature	Positive example	Negative example
MLC	<pre>/**  * Make the hash table logically empty.  */</pre>	<pre>/*System.out.println("Even");  printQ(qEven);  System.out.println("Odd");  printQ(qOdd);*/</pre>
SLC	<pre>// Create a new double-sized, empty table</pre>	<pre>//String[] ss = linea.readLine().split(" ");</pre>
NES	<pre>for (int i=1; i&lt;=casos; i++)</pre>	<pre>for (int i = 1; i &lt; = casos; i++)</pre>
IS	<pre>import java.io.FileNotFoundException</pre>	<pre>import java.io.*</pre>

## Features : Single-line comments (SLC)

- This is the number of genuine single-line comment words in single line comments, i.e., comments following “//” .
- We have not considered the cases where lines of code were commented.
- Eliminate code lines – same as MLC.
- This feature value was normalized by dividing it by the total number of words in the program file.
- Indicator of code readability and meticulousness of the coder.

# Features : Single-line comments (SLC)

Feature	Positive example	Negative example
MLC	<pre>/**  * Make the hash table logically empty.  */</pre>	<pre>/*System.out.println("Even");  printQ(qEven);  System.out.println("Odd");  printQ(qOdd);*/</pre>
SLC	<pre>// Create a new double-sized, empty table</pre>	<pre>//String[] ss = linea.readLine().split(" ");</pre>
NES	<pre>for (int i=1; i&lt;=casos; i++)</pre>	<pre>for (int i = 1; i &lt; = casos; i++)</pre>
IS	<pre>import java.io.FileNotFoundException</pre>	<pre>import java.io.*</pre>

## Features : Non-existent spaces (NES)

- This is the number of lines containing non-existent spaces
- $i=1; i \leq \text{casos};$  as opposed to  $i = 1; i < = \text{casos};$
- Regular expression **[a-z][a-z]\* [a-z][a-z]\*[=<>+]** (e.g., `int i=1`)
- This feature value was normalized by dividing it by the total number of lines in the program file.
- Indicator of code readability and meticulousness of the coder.

# Features : Non-existent spaces (NES)

Feature	Positive example	Negative example
MLC	<pre>/**  * Make the hash table logically empty.  */</pre>	<pre>/*System.out.println("Even");  printQ(qEven);  System.out.println("Odd");  printQ(qOdd);*/</pre>
SLC	<pre>// Create a new double-sized, empty table</pre>	<pre>//String[] ss = linea.readLine().split(" ");</pre>
NES	<pre>for (int i=1; i&lt;=casos; i++)</pre>	<pre>for (int i = 1; i &lt; = casos; i++)</pre>
IS	<pre>import java.io.FileNotFoundException</pre>	<pre>import java.io.*</pre>

# Features : Import Specific (IS)

- This is the number of instances where the programmer exported the specific libraries only
- E.g., cases of import **java.io.FileNotFoundException** as opposed to **import java.io.\***
- This feature value was normalized by dividing it by the total number of lines in the program file.
- Indicator of code efficiency as well as experience, prudence of the coder



# Features : Import Specific (IS)

Feature	Positive example	Negative example
MLC	<pre>/**  * Make the hash table logically empty.  */</pre>	<pre>/*System.out.println("Even");  printQ(qEven);  System.out.println("Odd");  printQ(qOdd);*/</pre>
SLC	<pre>// Create a new double-sized, empty table</pre>	<pre>//String[] ss = linea.readLine().split(" ");</pre>
NES	<pre>for (int i=1; i&lt;=casos; i++)</pre>	<pre>for (int i = 1; i &lt; = casos; i++)</pre>
IS	<pre>import java.io.FileNotFoundException</pre>	<pre>import java.io.*</pre>

# Outline

1 BIG5 personality

2 Features

**3 Methodology**

4 Results

5 Analysis

## METHODOLOGY

# Method : Multiple Linear Regression

- Four features – explanatory variables
- Each of the five BIG Five traits is the dependent variable.

# Method : Multiple Linear Regression

For a program code  $p$ , given as follows:

$$\begin{aligned} score_{BIG5}(p) = & \alpha + \beta_1 MLC(p) + \beta_2 SLC(p) \\ & + \beta_3 NES(p) + \beta_4 IS(p) \end{aligned} \quad (1)$$

We calculate the values of  $\alpha$  and  $\beta_i$ ,  $i = 1, 2, 3, 4$  from the training data using the linear regression implementation in R.<sup>a</sup>

---

<sup>a</sup>https:

[//www.r-bloggers.com/r-tutorial-series-multiple-linear-regression/](https://www.r-bloggers.com/r-tutorial-series-multiple-linear-regression/)

# Outline

- 1 BIG5 personality
- 2 Features
- 3 Methodology
- 4 Results**
- 5 Analysis

## RESULTS

- 1 **Run1.txt:** The values of the dependent variables were generated on the test data using the regression equation (1) learned from the training data.
- 2 **Run2.txt:** For this run, for each BIG Five trait, we calculated the values of the dependent variables given by the linear regression equation (1) on the training set. We then calculated the error and removed the files in the training set with the three highest error values. We then trained the linear regression on the new training set and calculated the coefficients. Finally, values of the dependent variables were calculated on the test data. The purpose of this run is to remove some outliers from the training set.



# Results : RMSE

Method	NEUROTICISM	EXTROVERSION	OPENNESS	AGREEABLENESS	CONSCIENTIOUSNESS
Run1.txt	10.22	<b>8.60</b>	7.16	9.60	9.99
Run2.txt	10.04	10.17	7.36	9.55	10.16
Baseline (bow)	10.29	9.06	7.74	9.00	8.47
Baseline (mean)	10.26	9.06	7.57	9.04	8.54
Reported best	9.78	8.60	6.95	8.79	8.38

**Table** : Root Mean Squared Error (RMSE). The best result produced by our submitted runs when compared to all the submitted runs is shown in bold.

# Results : PC

Method	NEUROTICISM	EXTROVERSION	OPENNESS	AGREEABLENESS	CONSCIENTIOUSNESS
Run1.txt	<b>0.36</b>	0.35	0.33	0.09	-0.20
Run2.txt	0.27	0.04	0.27	0.11	-0.13
Baseline (bow)	0.06	0.12	-0.17	0.20	0.17
Baseline (mean)	0.00	0.00	0.00	0.00	0.00
Reported best	0.36	0.47	0.62	0.38	0.33

**Table** : Pearson Product-Moment Correlation (PC). The best result produced by our submitted runs when compared to all the submitted runs is shown in bold.

# Outline

- 1 BIG5 personality
- 2 Features
- 3 Methodology
- 4 Results
- 5 Analysis**

## ANALYSIS

BIG5 Trait	$\alpha$ (Intercept)	$\beta_1$ (MLC)	$\beta_2$ (SLC)	$\beta_3$ (NES)	$\beta_4$ (IS)
Neuroticism	55.30	10.82	-331.58	-57.15	-282.14
Extroversion	39.58	50.49	261.44	67.38	163.28
Openness	46.63	46.07	98.92	28.20	49.48
Agreeableness	42.521	-1.103	78.905	90.909	196.740
Conscientiousness	-1.708	-1.708	225.988	-67.633	135.353

Table : The regression coefficients for Run1

# Analysis : Insights

- The negative value of high magnitude of  $\beta_2$  indicates that a person who frequently provides Single Line Comments (SLC) in her code is likely to exhibit low Neuroticism.
- The negative value of high magnitude of  $\beta_4$  indicates that a person who tends to import libraries selectively, is likely to have low Neuroticism
- The positive values of  $\beta_1$ ,  $\beta_2$  and  $\beta_4$  indicates that a person who tends to provide genuine comments (both Multi Line and Single Line) and import specific libraries in her code is likely to have high Extroversion.
- The observations for *Openness* are almost identical to those for *Extroversion*.

# Thank you!

