## SSID: WWCode Password: password



## WOMEN WHO CODE MANILA



# Machine Learning & Al Study Group

Twitter: @wwcodemanila FB: fb.com/wwcodemanila

#WWCodeManila #YourProgrammingLanguage #StudyGroup



#### **Issa Tingzon**

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#### **OUR MISSION**

Inspiring women to excel in technology careers.





#### **OUR VISION**

A world where women are representative as technical executives, founders, VCs, board members and software engineers.





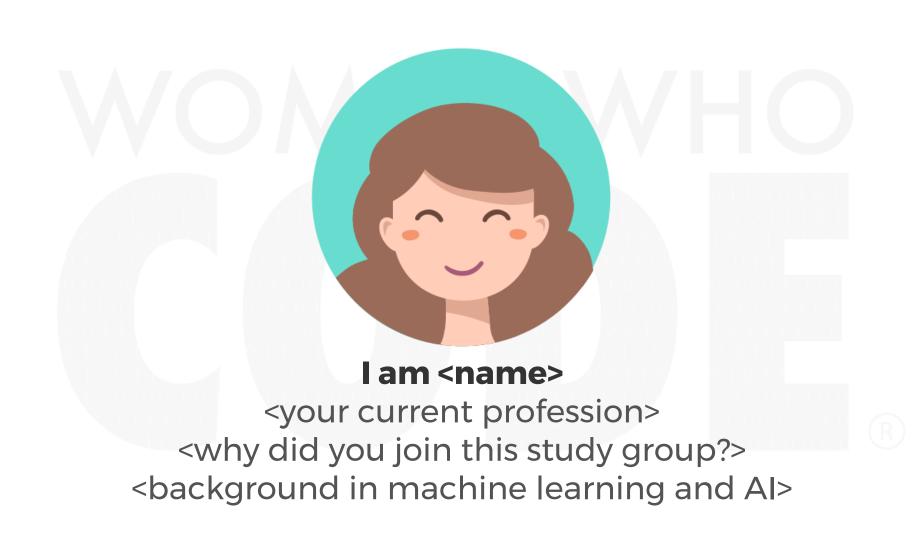
#### STUDY GROUP

Study groups are events where women can come together and help each other learn and understand a specific programming language, technology, or anything related to coding or engineering.

#### **GUIDELINES**

- Study groups are **not** a class/lecture
- If you have a question, just ask
- If you have an idea, share it
- Make friends and learn from your study groupmates
- **Do not** promote your recruit or promote your business

## New Member's Introduction



#### **AGENDA**

- 1. Review: Descriptive Statistics
- 2. Today's Topic: Feature Scaling
- 3. Exercise
- 4. Presentations

#### **REVIEW**

## DESCRIPTIVE STATISTIC IN PYTHON

#### **TODAY'S TOPIC**

## DATA PRE-PROCESSING: FEATURE SCALING

#### **FEATURE SCALING**

Different features → measured on different scales.

- height centimetres
- weight kilograms
- blood pressure mmHg

Some classifiers combine and compare feature values (e.g. Euclidean distance).

#### **FEATURE SCALING**

Features with a broad range of values  $\rightarrow$  dominate features with a smaller range of values:

- percentage of unemployment in a city ranges from 0.0 to 1.0
- o population of the city can range up to 500,000

Feature scaling transforms the data so that the features have a uniform range.

Scales values to a range of [0, 1].

Rescaling feature vector *X*:

$$z_i = \frac{x_i - x_{min}}{x_{max} - x_{min}}$$

Example:

$$z_1 = \frac{22 - 22}{42 - 22} = 0.0$$

ID	Age	Age_Scaled
1	22	0.00
2	25	0   0   0   1   1   1   1   0
3	30	011
4	42	1101000

Rescaling feature vector *X*:

$$z_i = \frac{x_i - x_{min}}{x_{max} - x_{min}}$$

Example:

$$z_2 = \frac{25 - 22}{42 - 22} = 0.15$$

ID	Age	Age_Scaled
1	22	0.00
2	25	0.15
3	30	011
4	42	1101000

Rescaling feature vector *X*:

$$z_i = \frac{x_i - x_{min}}{x_{max} - x_{min}}$$

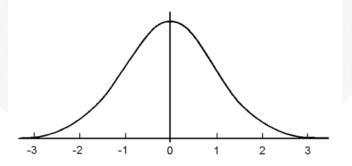
Example:

$$z_3 = \frac{30 - 22}{42 - 22} = 0.4$$

ID	Age	Age_Scaled
1	22	0.00
2	25	0.15
3	30	0.40
4	42	1.00

#### Standardization

Scales features so that they are centered around 0 with a standard deviation of 1.



#### Standardization

Rescaling feature vector *X*:

$$z_i = \frac{x_i - \mu}{\sigma}$$

where  $\mu$  is the mean (average)

 $\sigma$  is the standard deviation

Exercise 1: Check that  $\mu = 29.75$ ,  $\sigma = 8.81$  and that the values in the Age\_Scaled are correct.

ID	Age	Age_Scaled
1	22	-1.01
2	25	-0.62
3	30	0.03
4	42	1.60

$$\sigma = \sqrt{\frac{\sum (x_i - \bar{x})^2}{n-1}}$$

#### Standardization

Rescaling feature vector *X*:

$$z_i = \frac{x_i - \mu}{\sigma}$$

where  $\mu$  is the mean (average)

 $\sigma$  is the standard deviation

Exercise 2: Check that after scaling, the values for
$\mu$ and $\sigma$ are approximately 0 and 1, respectively.

ID	Age	Age_Scaled
1	22	-1.01
2	25	-0.62
3	30	0.03
4	42	1.60

$$\sigma = \sqrt{\frac{\sum (x_i - \bar{x})^2}{n-1}}$$

#### Normalization

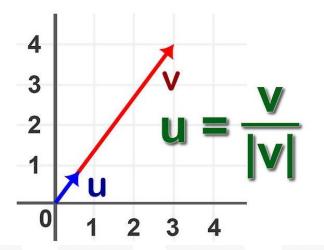
Scales the feature vector to a unit vector

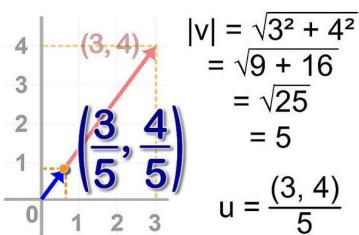
#### **Normalization**

ID	Age	Age_Scaled
1	3	$^{3}/_{5}=0.6$
2	4	$^{4}/_{5} = 0.8$

(Norm) A vector with n elements has length:

$$||v|| = \sqrt[2]{v_1^2 + v_2^2 + \dots + v_n^2}$$





#### **Feature Scaling**

Min-max Scaling
Standardization
Normalization
Binarization

## Partner/Group/Individual Exercise:

### 1. DESCRIPTIVE STATISTICS REVIEW 2. WINE DATA CLASSIFICATION

Note: First-timers/beginners are recommended to start with the Introduction to ML Tutorial (see official github repo)

## Partner/Group/Individual Presentation

#### Assignment

# Binarize Features in the Handwritten Digit Recognition Exercise

#### References:

**WWCodeLondon Slides** 

http://scikit-learn.org/stable/modules/preprocessing.html

http://sebastianraschka.com/Articles/2014\_about\_feature\_scaling. html

## T.I.L.

#### SHARE IT! In front!

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# THANK YOU:)