

An Introduction to Machine Learning with Python Programming  
12 Sep 2023 - 20 Oct 2023

iHUB, DivyaSampark, IIT Roorkee  
**Performance Evaluation**

Ritvij Bharat Private Limited (RBPL)

## Regression Metrics

Presented By:  
Shreyas Shukla

# Evaluating Regression

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**How do we decide if those predictions are any good?**

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# Evaluating Regression

- Accuracy
- Recall.
- These sort of metrics aren't useful for regression problems, we need metrics designed for **continuous** values!

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# Evaluating Regression

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- Mean Absolute Error
- Mean Squared Error
- Root Mean Square Error

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## Mean Absolute Error (MAE)

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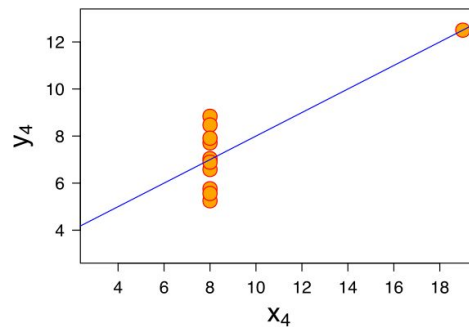
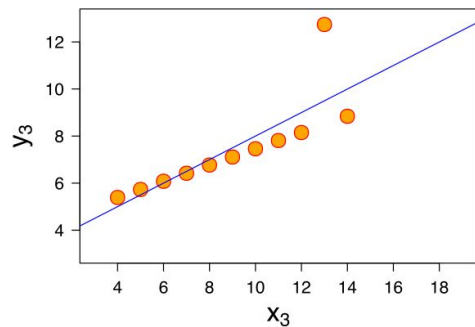
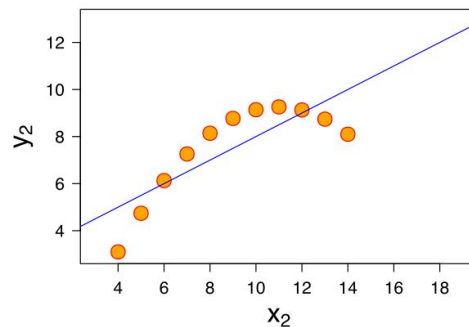
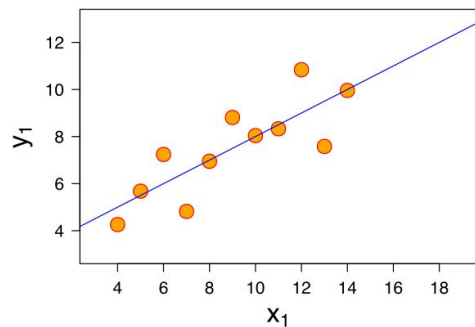
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$$\frac{1}{n} \sum_{i=1}^n |y_i - \hat{y}_i|$$

# Evaluating Regression

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MAE won't punish large errors however.



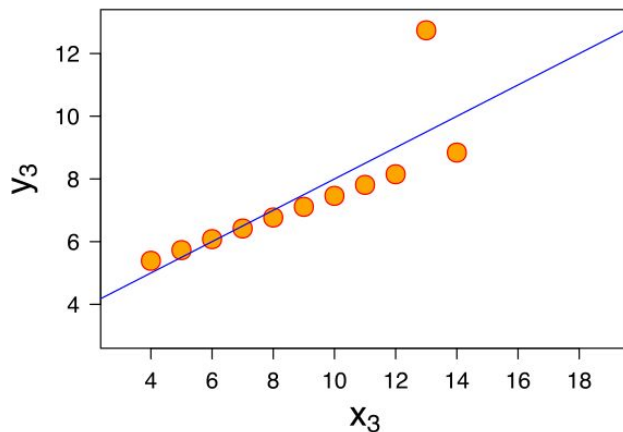
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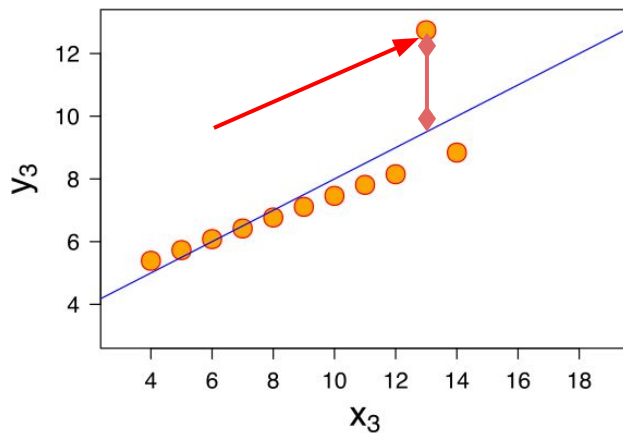
# Evaluating Regression

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# Evaluating Regression

## Mean Squared Error (MSE)

- Issue with MSE:
  - Different units than  $y$ .
  - It reports units of  $y$  squared!

$$\frac{1}{n} \sum_{i=1}^n (y_i - \hat{y}_i)^2$$

# Evaluating Regression

- Root Mean Square Error (RMSE)
  - root of the mean of the squared errors.
  - Most popular (has same units as y)

$$\sqrt{\frac{1}{n} \sum_{i=1}^n (y_i - \hat{y}_i)^2}$$

# Machine Learning

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**Compare your error metric to the average value of the label in your data set to try to get an intuition of its overall performance.**

**Domain knowledge also plays an important role here!**

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**Context of importance is also necessary to consider.**

**We may create a model to predict how much medication to give, in which case small fluctuations in RMSE may actually be very significant.**

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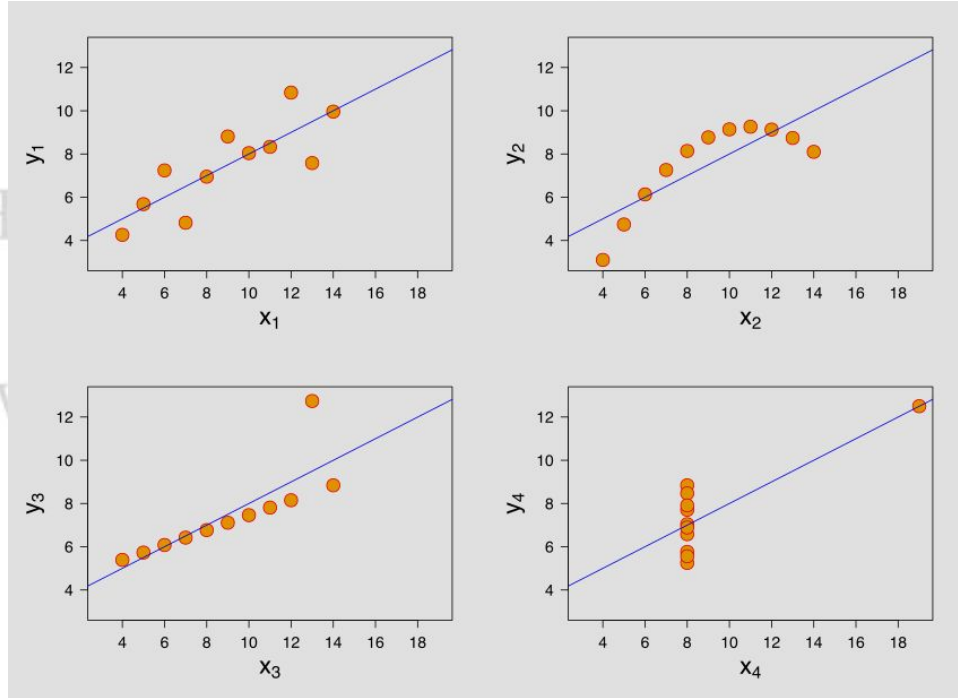
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# Evaluating Residuals

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# Anscombe's quartet:



Clearly Linear Regression is not suitable

# Linear Regression

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But how can we tell if we're dealing with more than one  $x$  feature?

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# Linear Regression

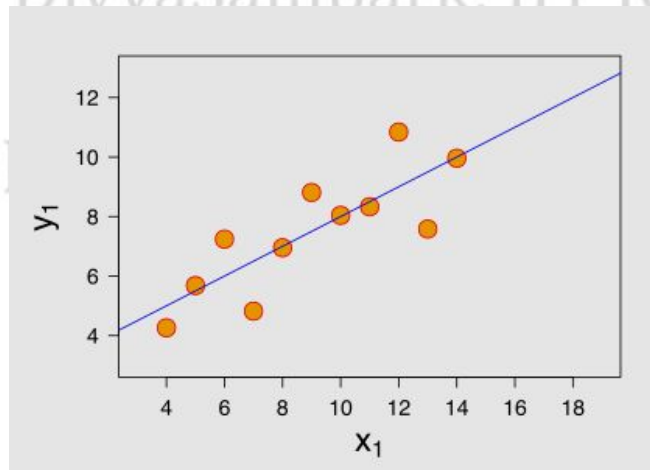
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Consider an appropriate data set:

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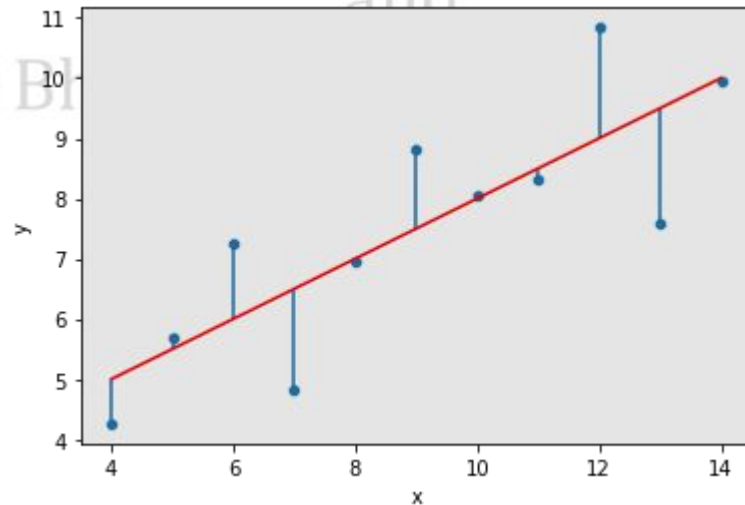
# Linear Regression

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The residual errors.

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# Linear Regression

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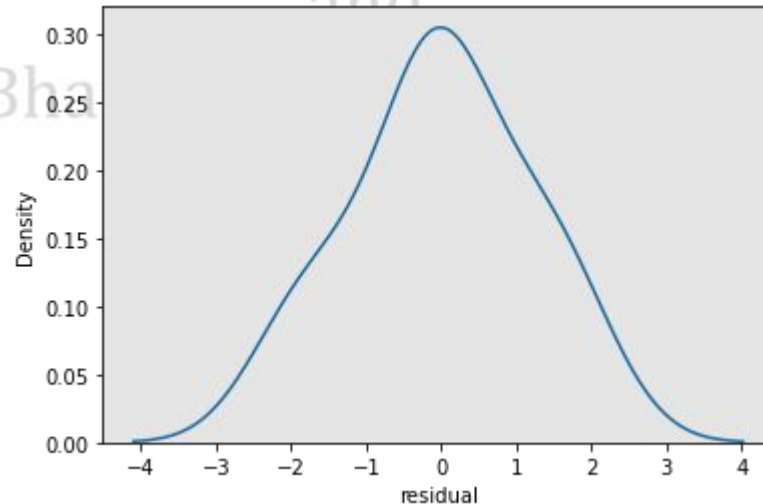
The residual errors should be random and close to a normal distribution.

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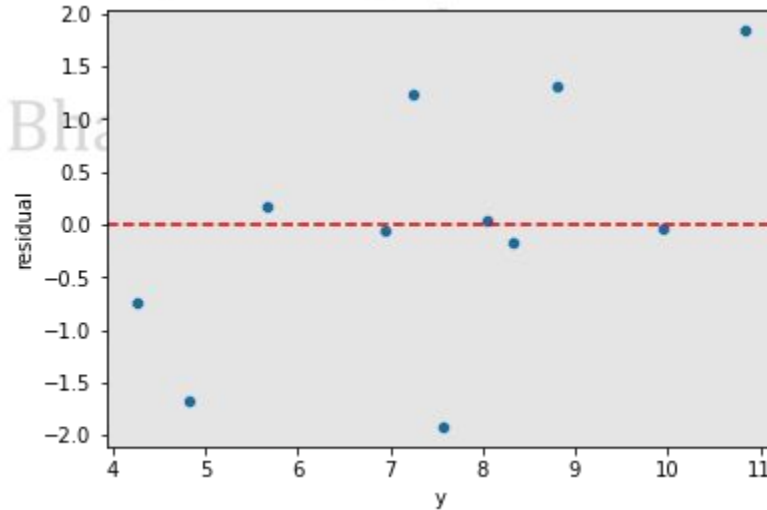
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# Linear Regression

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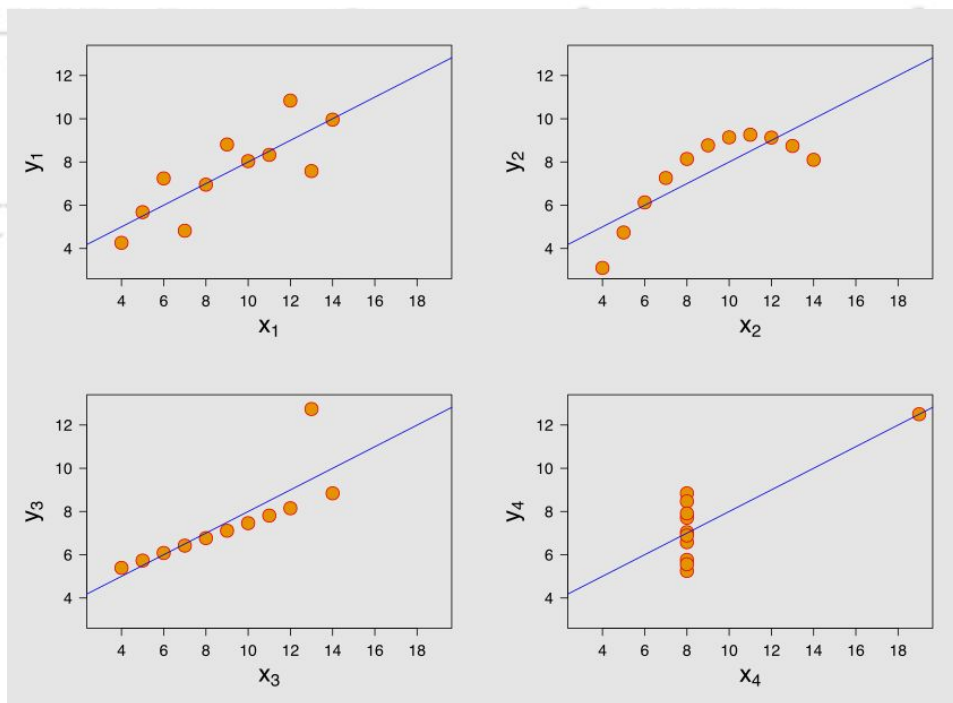
Residual plot shows residual error vs. true y value.  
There should be no clear line or curve.



# Linear Regression

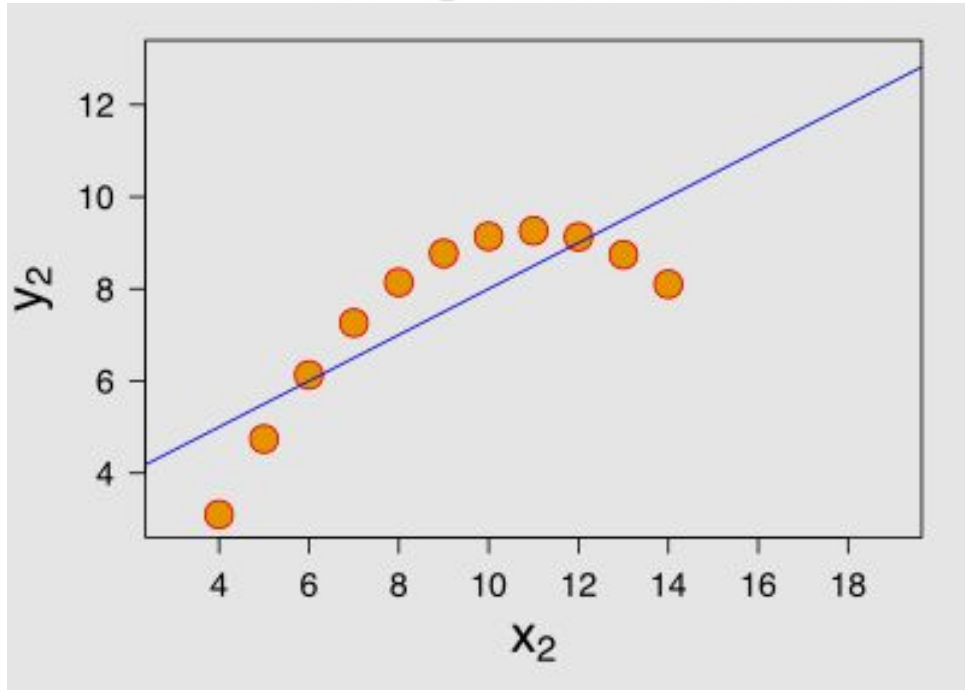
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Let's see 2nd one



# Linear Regression

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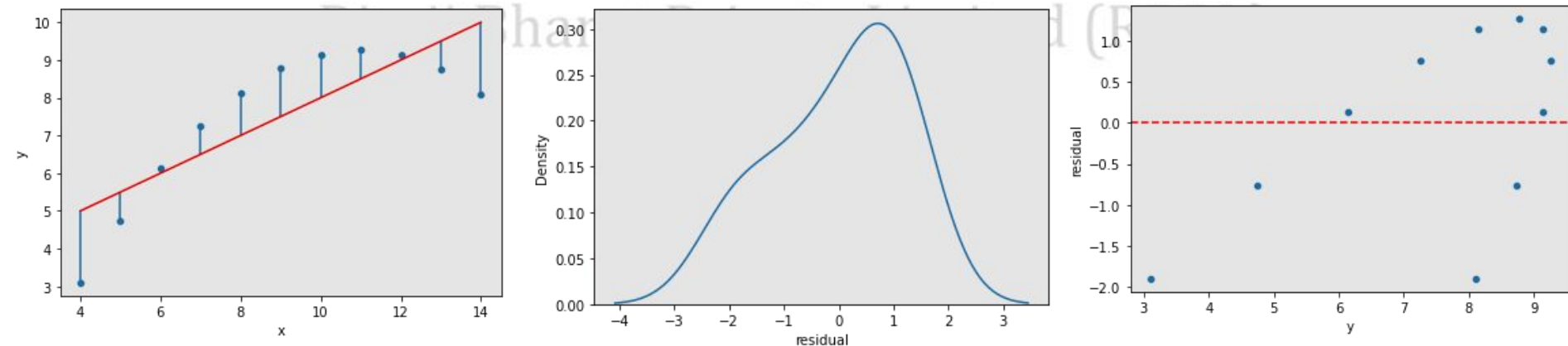
# Linear Regression

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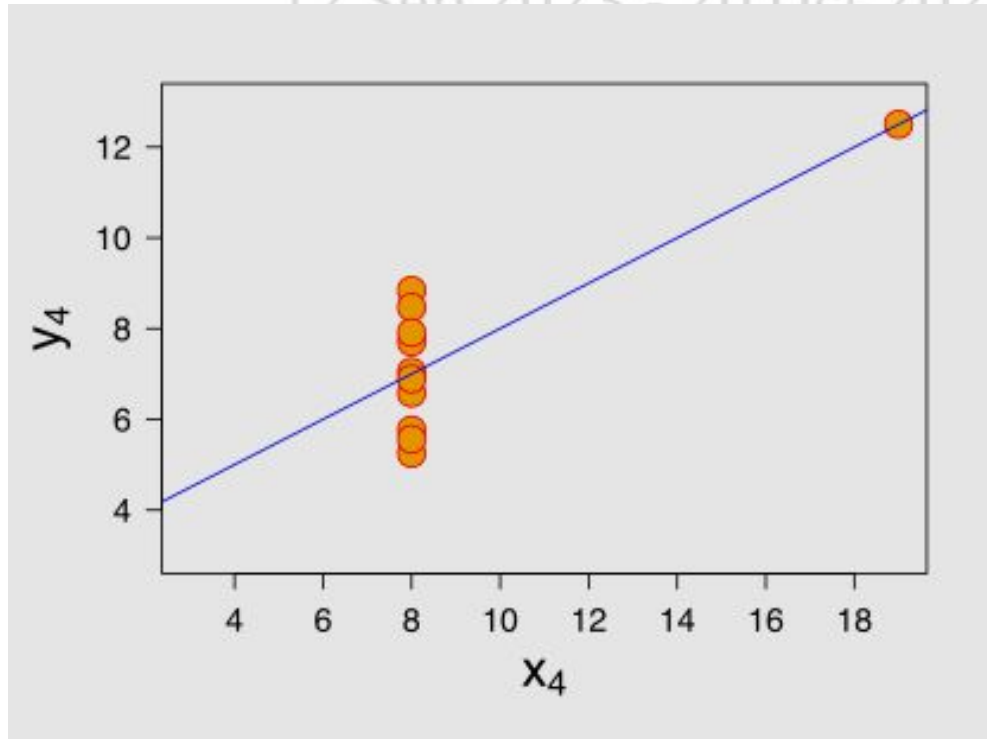
Residual plot showing a clear pattern, indicating Linear Regression no valid!

Especially the 3rd plot

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# Linear Regression



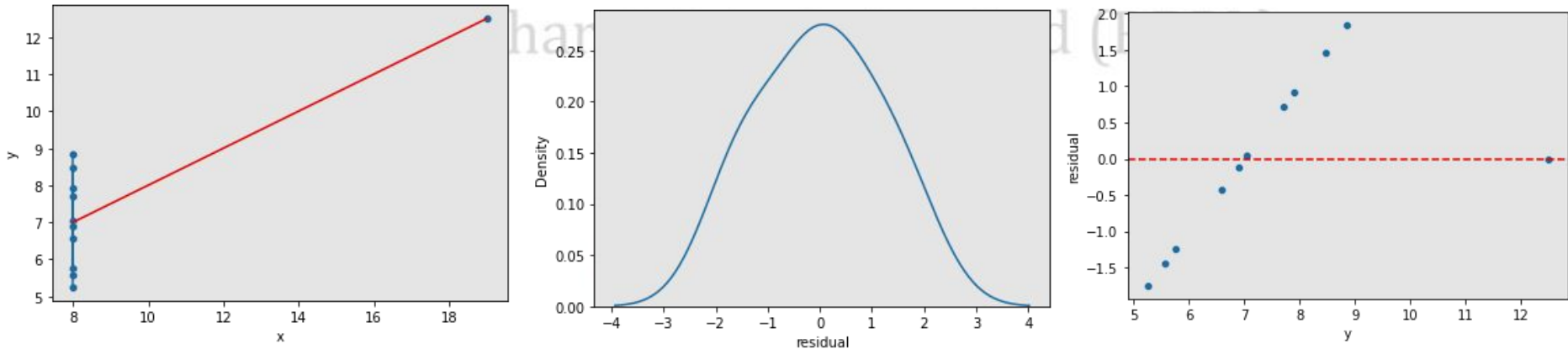
# Linear Regression

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Residual plot showing a clear pattern, indicating Linear Regression not valid!

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Let's create in Python

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