

# Feature Scaling

↳ Feature Scaling is ALWAYS applied to columns

Applied

X1	X2	X3	X4
64	104	81	62
108	93	55	44
30	35	51	63

↳ Feature Scaling is NOT applied across columns  
i.e it is not applied for a row

X1	X2	X3	X4
64	104	81	62
108	93	55	44
30	35	51	63

Not applied

## Feature Scaling

Normalization

Standardization

$$X' = \frac{X - X_{\min}}{X_{\max} - X_{\min}}$$

range  
[0, 1]

$$X' = \frac{X - \mu}{\sigma}$$

$\mu \rightarrow$  average, mean  
 $\sigma \rightarrow$  standard deviation  
range  
[-3, +3]

Let us consider a dataset:

	Annual income (\$)		Age (yrs)
1	70000		45
2	60000		44
3	52000		40

is person 2 similar to person 1 or person 3



unscaled values (differences)

Comparing Salary to years - not comparable

↳ important to scale your features

After Normalization

$$x' = \frac{x - x_{\min}}{x_{\max} - x_{\min}}$$

	Annual income (\$)	Age (yrs)
1	1	1
2	0.444	0.8
3	0	0

$$x' = \frac{45 - 40}{45 - 40} = 1$$

$$x' = \frac{44 - 40}{45 - 40} = \frac{4}{5} = 0.8$$

$$x' = \frac{40 - 40}{45 - 40} = 0$$

$$x' = \frac{52000 - 52000}{70000 - 52000} = 0$$

more similar Person 1, 2

$$x' = \frac{70,000 - 52,000}{70,000 - 52,000} = 1$$

$$x' = \frac{60,000 - 52,000}{70,000 - 52,000} = 0.44$$

According to Annual Income column, person 2 is similar to both person 1, person 3

According to Age column person 2 is similar to person 1

Standardization Vs Normalization

Normalization is recommended when we have a normal distribution in most of our features

*\*\*\** Standardization works well all the time  
*Recommended*