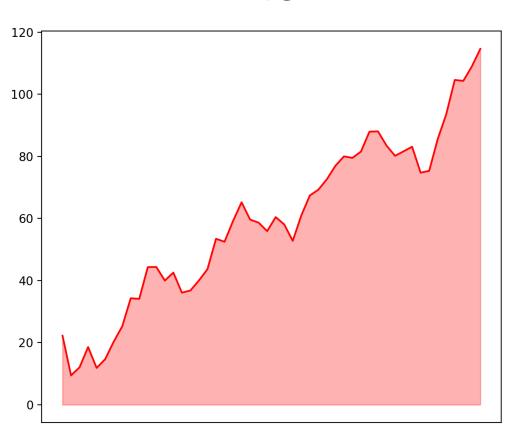
## Data Visualizations

# Why do we need visualizations?

### **Before**

```
array([ 22.2545198 ,
                      9.46306667.
                                  12.06767132,
                                                18.59783811,
       11.86490354, 14.68040278,
                                  20.30153772,
                                                25.24777714,
       34.3022338 .
                     34.12490434,
                                  44.33391473.
                                                44.38379237.
       40.00574845.
                     42.57340636.
                                  36.10801652.
                                                36.80541831.
       40.04538794.
                     43.69025546, 53.46028177,
                                                52.50945039.
                                                58.65185448,
       59.19988263,
                     65.21990689,
                                  59.65118444,
                     60.44817943.
       55.92723599,
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                                                52.79842096.
       60.93714419.
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                     67.40567495.
       76.95759959.
                     80.0000368 .
                                  79.51964481.
                                                81.56353416.
       87.97679347,
                     88.05404069,
                                  83.47695913,
                                                80.17622344,
       81.63942456.
                     83.11399608, 74.75389511, 75.35131548,
       85.5736879 , 93.56250189 ,104.63174345 ,104.31686973 ,
      108.96186346, 114.64848866])
```

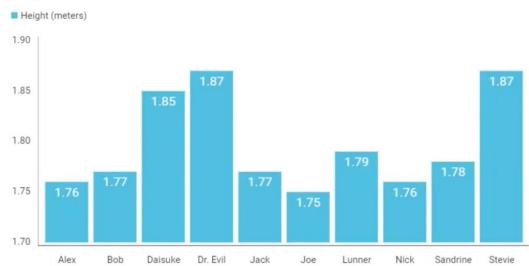
## **After**



Person	Height (meters)
Stevie	1.87
Sandrine	1.78
Nick	1.76
Lunner	1.79
Joe	1.75
Jack	1.77
Dr. Evil	1.87
Daisuke	1.85
Bob	1.77
Alex	1.76

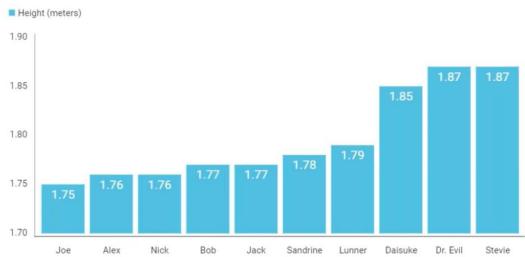
Person	Height (meters)
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Lunner	1.79
Joe	1.75
Jack	1.77
Dr. Evil	1.87
Daisuke	1.85
Bob	1.77
Alex	1.76

#### Height by Person



Person	Height (meters)
Stevie	1.87
Sandrine	1.78
Nick	1.76
Lunner	1.79
Joe	1.75
Jack	1.77
Dr. Evil	1.87
Daisuke	1.85
Bob	1.77
Alex	1.76

### Height by Person



### Global warming of 1.5°C

An IPCC Special Report on the impacts of global warming of 1.5°C above pre-industrial levels and related global greenhouse gas emission pathways, in the context of strengthening the global response to the threat of climate change, sustainable development, and efforts to eradicate poverty

1 / 630

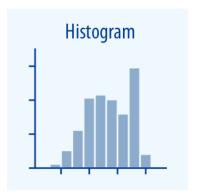


### Global warming of 1.5°C

An IPCC Special Report on the impacts of global warming of 1.5°C above pre-industrial levels and related global greenhouse gas emission pathways, in the context of strengthening the global response to the threat of climate change, sustainable development, and efforts to eradicate poverty

## Directory of visualizations

### **Distributions**



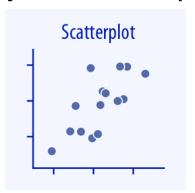
### Amounts



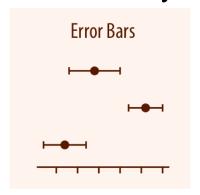
**Proportions** 



x-y relationships



Uncertainty



Geospatial



### **Fundamental**



### **Fundamental**





**Fundamental** 

Interactive







**Fundamental** 

Interactive

Geospatial









**Fundamental** 

Interactive

Geospatial











# Other visualization apps

## Other visualization apps







# How to visualize data distribution





**New Notebook** 



### **Titanic dataset**

Gender submission and test file merged



Data Card Code (394) Discussion (2) Suggestions (1)

#### **About Dataset**



**Usability** ①

10.00

License

CC0: Public Domain

**Expected update frequency** 

Never

Tags

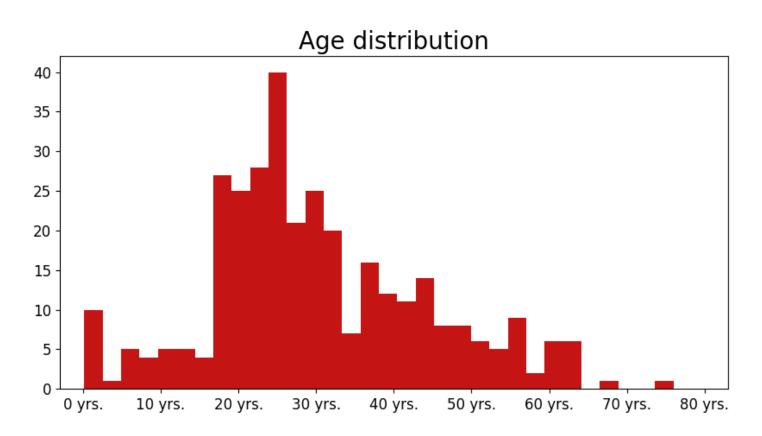
Beginner

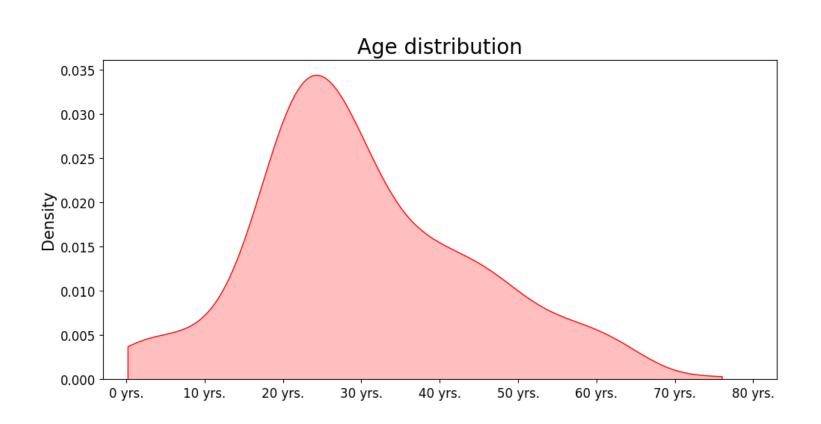
**Data Visualization** 



	Passengerld	Survived	Pclass	Name	Sex	Age	SibSp	Parch	Ticket	Fare	Cabin	Embarked
0	892	0	Third	Kelly, Mr. James	male	34.5	0	0	330911	7.8292	NaN	Q
1	893	1	Third	Wilkes, Mrs. James (Ellen Needs)	female	47.0	1	0	363272	7.0000	NaN	S
2	894	0	Second	Myles, Mr. Thomas Francis	male	62.0	0	0	240276	9.6875	NaN	Q
3	895	0	Third	Wirz, Mr. Albert	male	27.0	0	0	315154	8.6625	NaN	S
4	896	1	Third	Hirvonen, Mrs. Alexander (Helga E Lindqvist)	female	22.0	1	1	3101298	12.2875	NaN	S
5	897	0	Third	Svensson, Mr. Johan Cervin	male	14.0	0	0	7538	9.2250	NaN	S
6	898	1	Third	Connolly, Miss. Kate	female	30.0	0	0	330972	7.6292	NaN	Q
7	899	0	Second	Caldwell, Mr. Albert Francis	male	26.0	1	1	248738	29.0000	NaN	S
8	900	1	Third	Abrahim, Mrs. Joseph (Sophie Halaut Easu)	female	18.0	0	0	2657	7.2292	NaN	С
9	901	0	Third	Davies, Mr. John Samuel	male	21.0	2	0	A/4 48871	24.1500	NaN	S

### Histogram

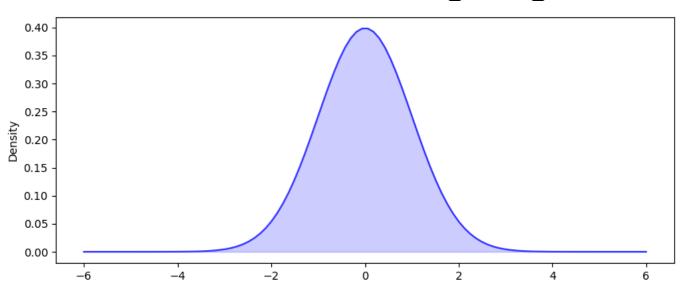




## **KDE**

## KDE - Kernel Density Estimator

$$K(x) = \frac{1}{\sqrt{2\pi}} \exp\left[-\frac{x^2}{2}\right]$$



$$K(x-x_i)$$

$$K(x - x_i)$$

$$K\left(\frac{x - x_i}{h}\right)$$

### h - kernel bandwidth

$$K(x - x_i)$$

$$K\left(\frac{x - x_i}{h}\right)$$

### h - kernel bandwidth

$$K(x - x_i)$$

$$K\left(\frac{x - x_i}{h}\right)$$

$$\frac{1}{h}K\left(\frac{x - x_i}{h}\right)$$

$$X = egin{bmatrix} x_1 \ x_2 \end{bmatrix}$$

$$X = egin{bmatrix} x_1 \ x_2 \end{bmatrix}$$

$$\frac{1}{h}K\left(\frac{x-x_1}{h}\right)$$

$$X = egin{bmatrix} x_1 \ x_2 \end{bmatrix}$$

$$\frac{1}{h}K\left(\frac{x-x_1}{h}\right) + \frac{1}{h}K\left(\frac{x-x_2}{h}\right)$$

$$f(x) = \frac{1}{2} \left[ \frac{1}{h} K \left( \frac{x - x_1}{h} \right) + \frac{1}{h} K \left( \frac{x - x_2}{h} \right) \right]$$

$$f(x) = \frac{1}{2} \left[ \frac{1}{h} K \left( \frac{x - x_1}{h} \right) + \frac{1}{h} K \left( \frac{x - x_2}{h} \right) \right] =$$

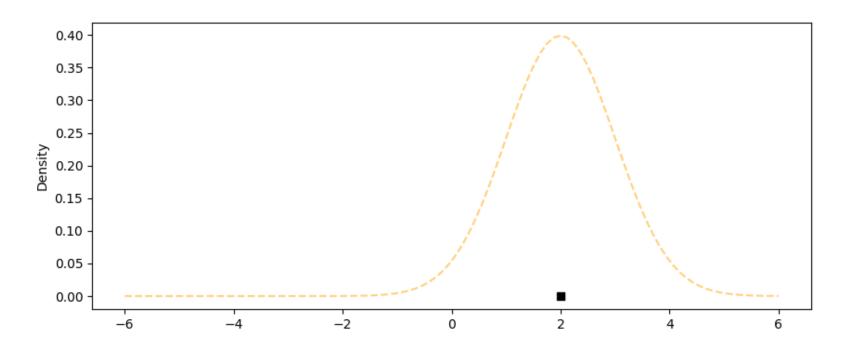
$$= \frac{1}{2h} \left[ K \left( \frac{x - x_1}{h} \right) + K \left( \frac{x - x_2}{h} \right) \right]$$

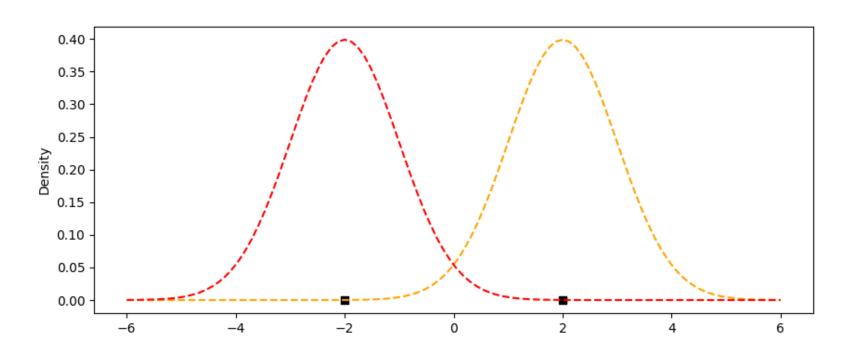
$$f(x) = \frac{1}{2} \left[ \frac{1}{h} K \left( \frac{x - x_1}{h} \right) + \frac{1}{h} K \left( \frac{x - x_2}{h} \right) \right] =$$

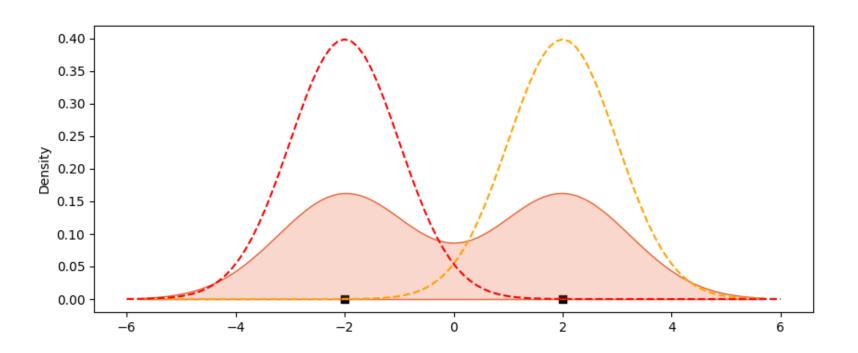
$$= \frac{1}{2h} \left[ K \left( \frac{x - x_1}{h} \right) + K \left( \frac{x - x_2}{h} \right) \right] =$$

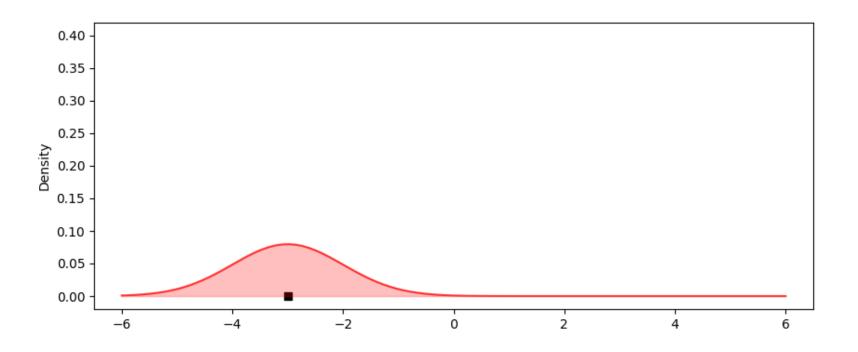
$$= \frac{1}{2h} \sum_{i=1}^{2} K\left(\frac{x - x_i}{h}\right)$$

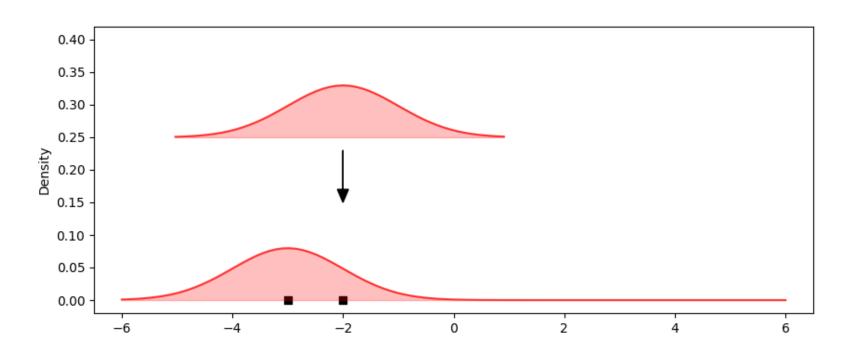
$$f(x) = \frac{1}{nh} \sum_{i=1}^{n} K\left(\frac{x - x_i}{h}\right)$$

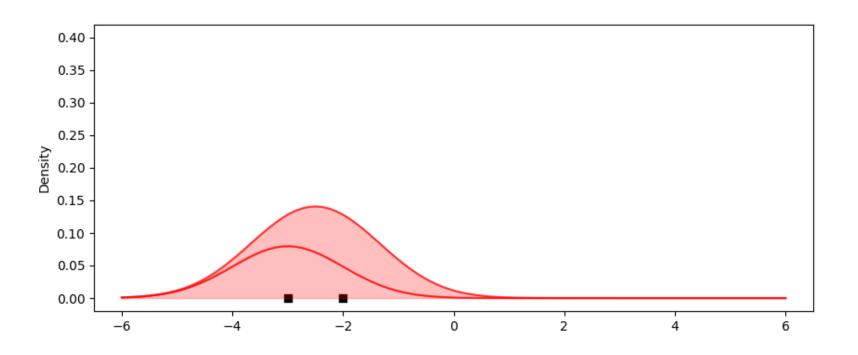


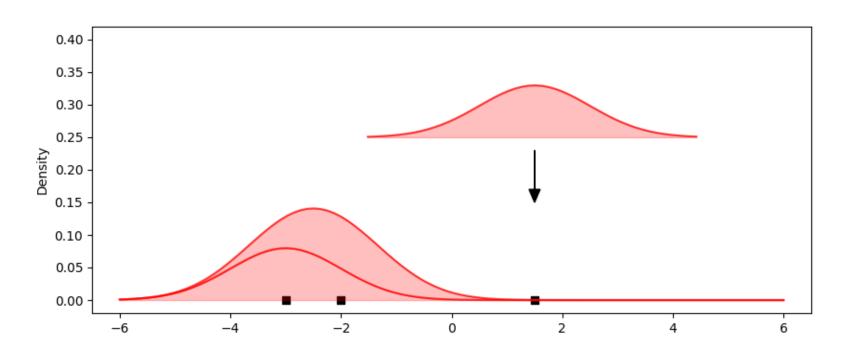


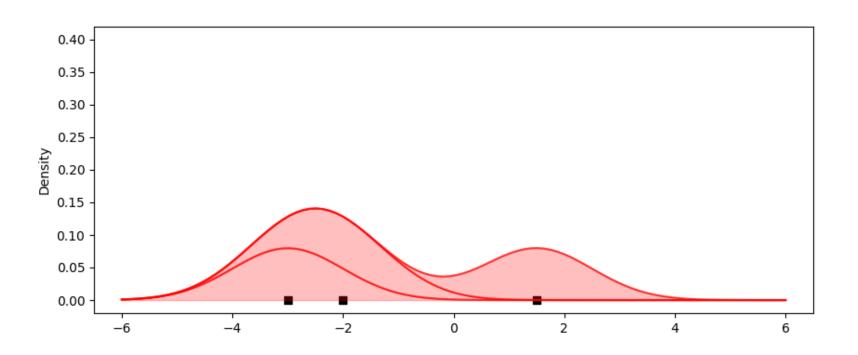


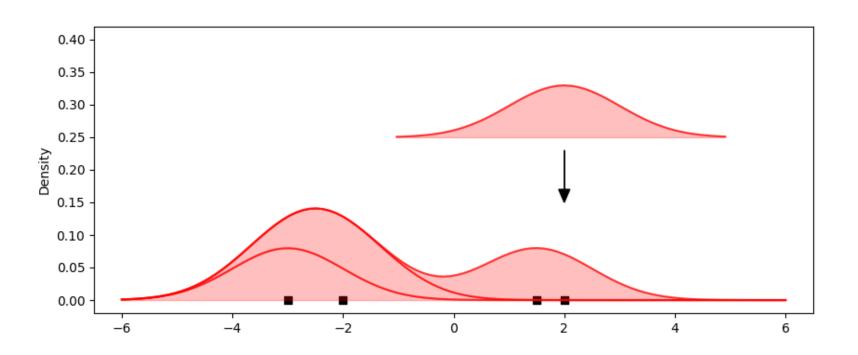


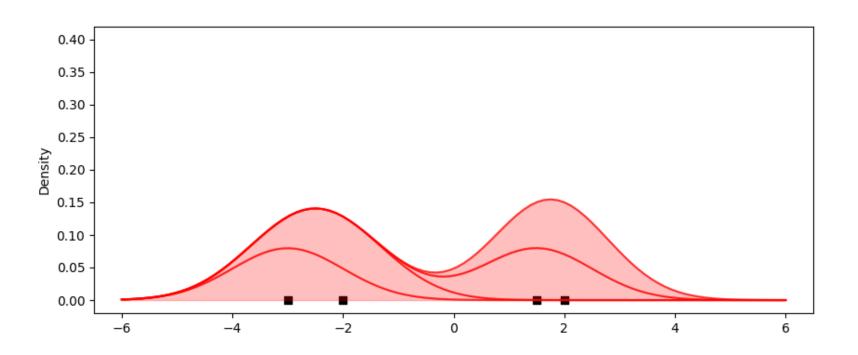


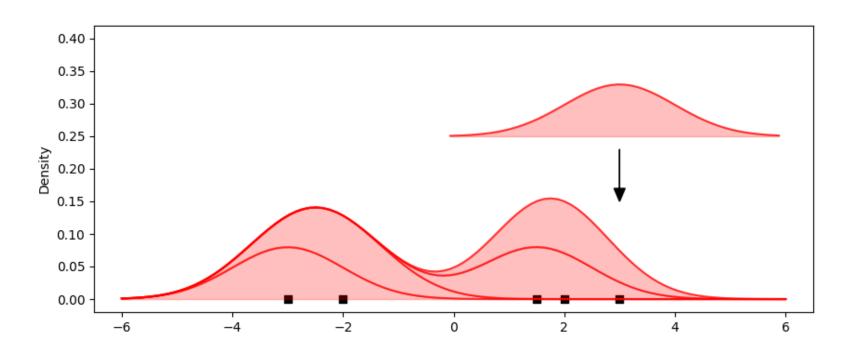


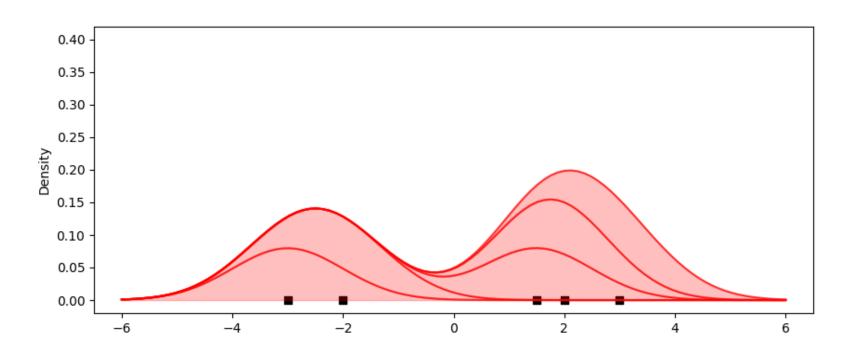


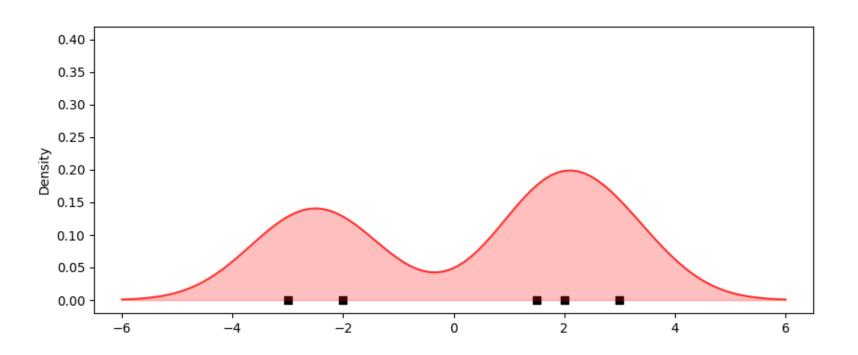




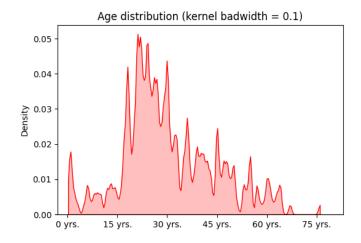


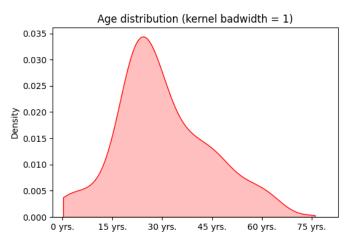


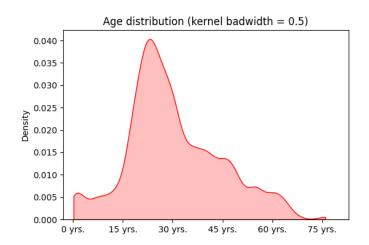


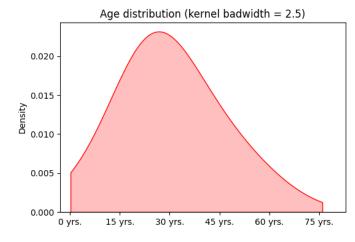


## Kernel Bandwidth



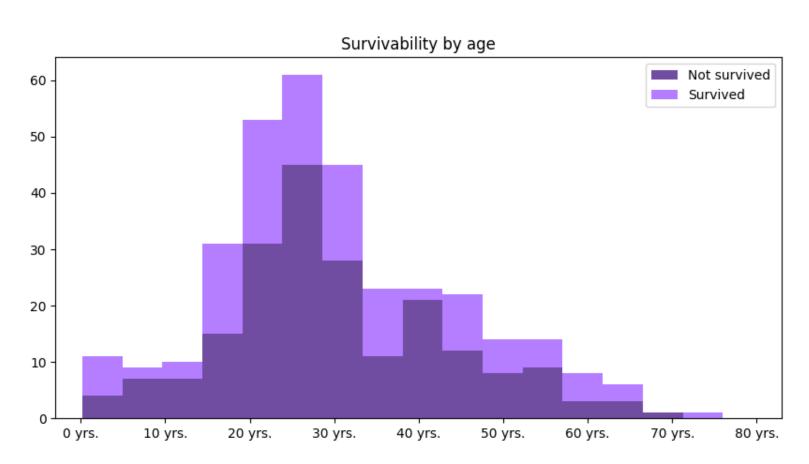




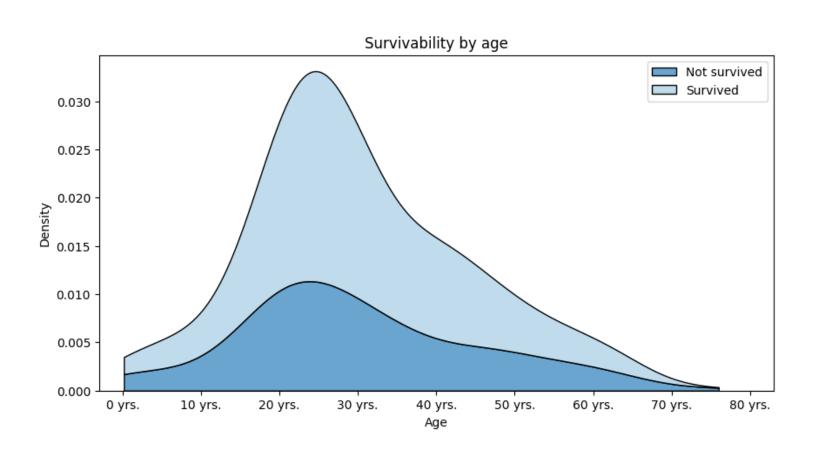


# Comparing multiple distributions

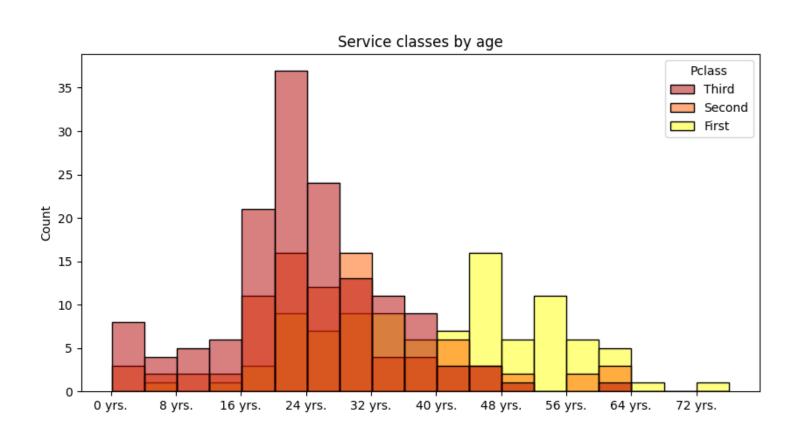
### Stacked histogram



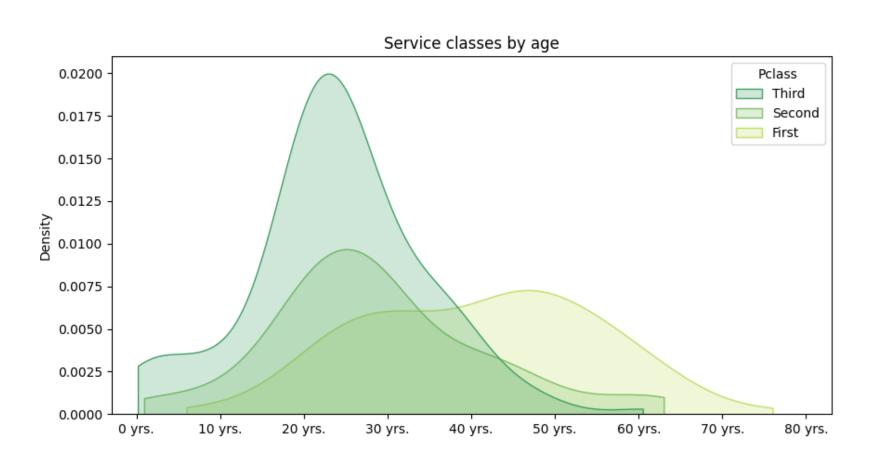
### Stacked density plot



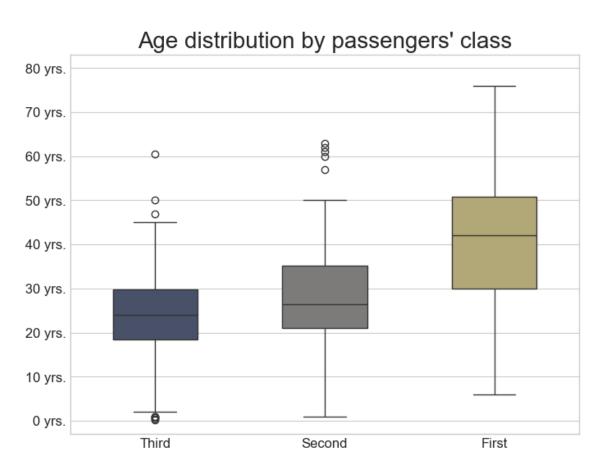
### Overlapping density plot



### Overlapping density plot



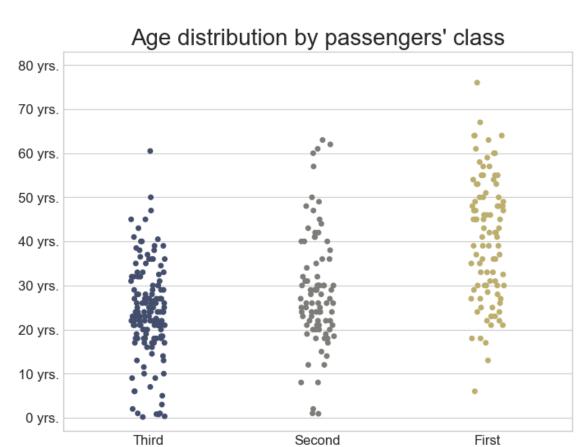
### Box plots



### Violin plot

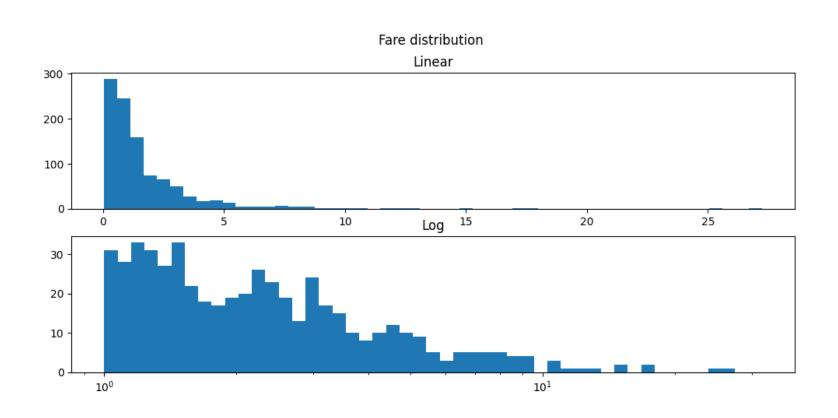


### Strip plot



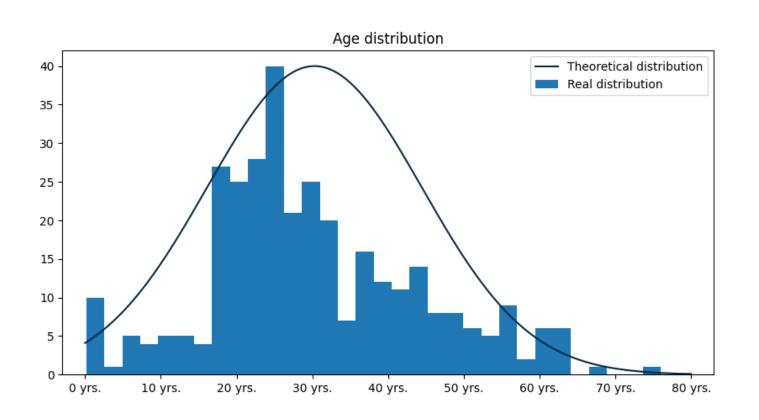
## Logarithmic scale

## Logarithmic scale

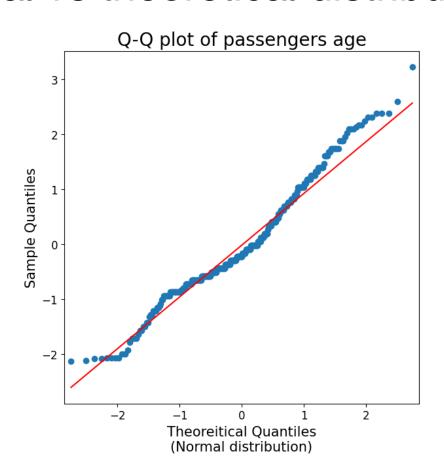


## Real vs theoretical distribution

### Real vs theoretical distribution

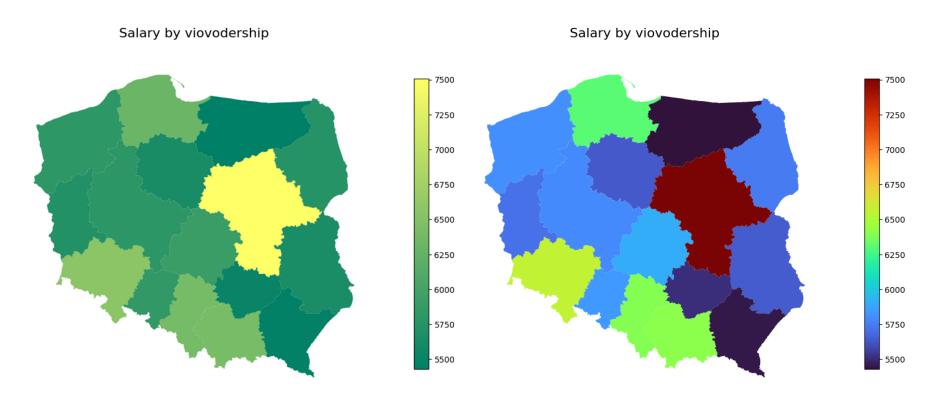


### Real vs theoretical distribution

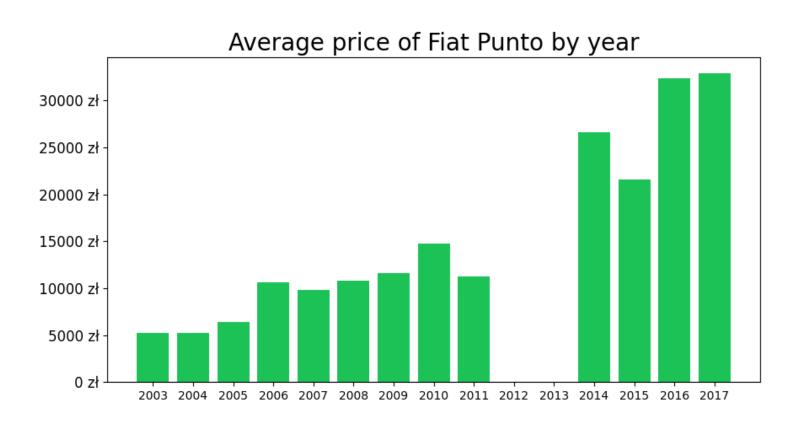


Frequently made mistakes

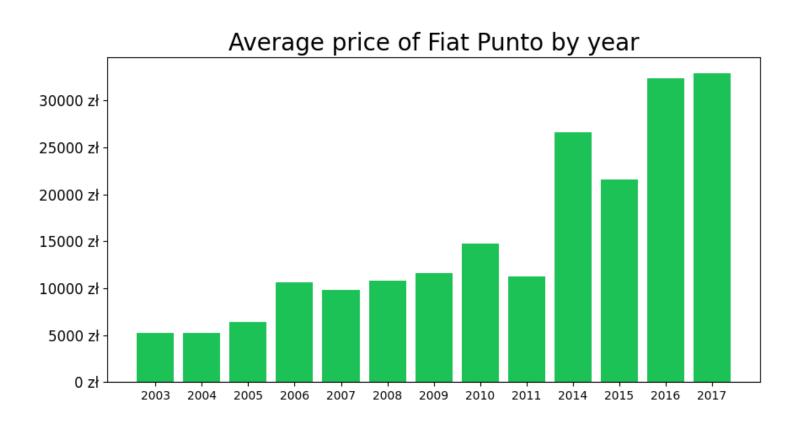
### Incorrect color scale



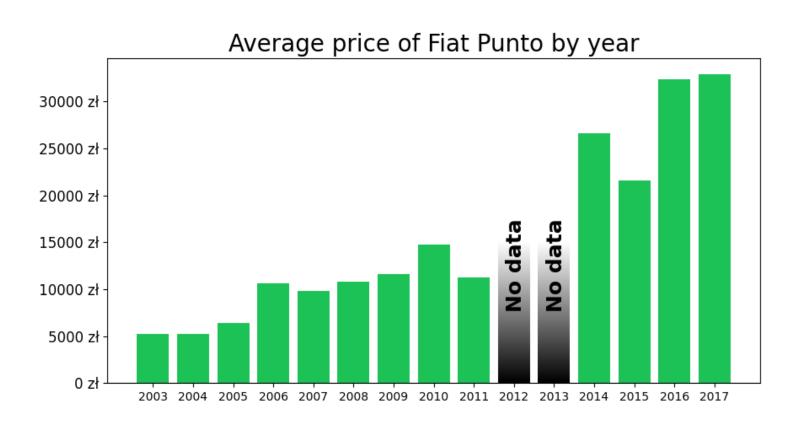
### Informing about missing data

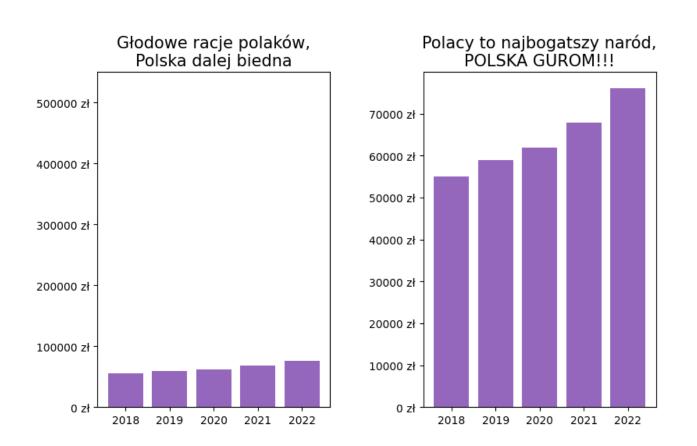


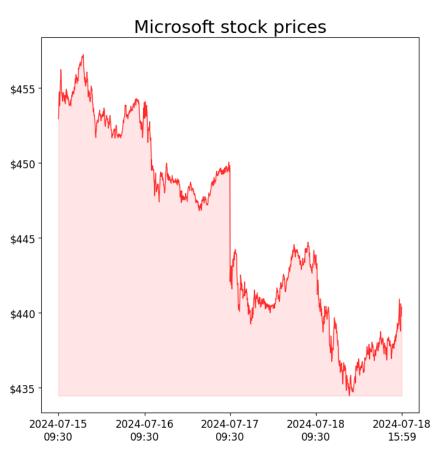
### Informing about missing data



### Informing about missing data





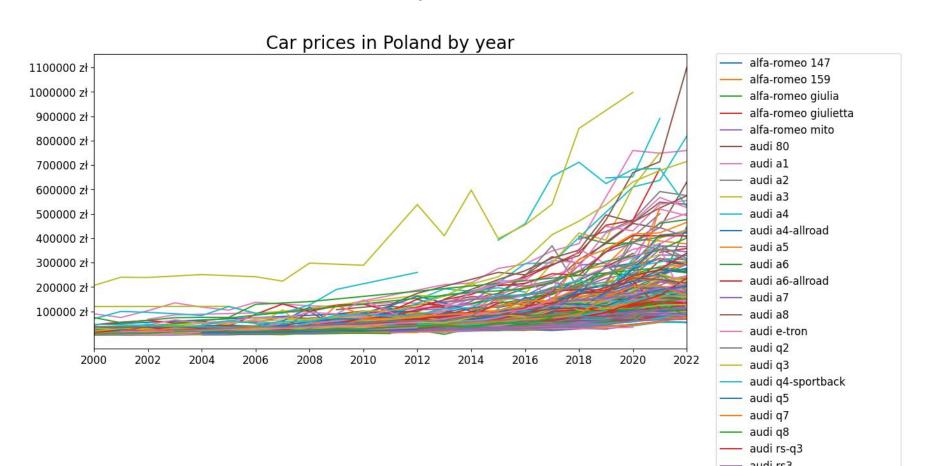




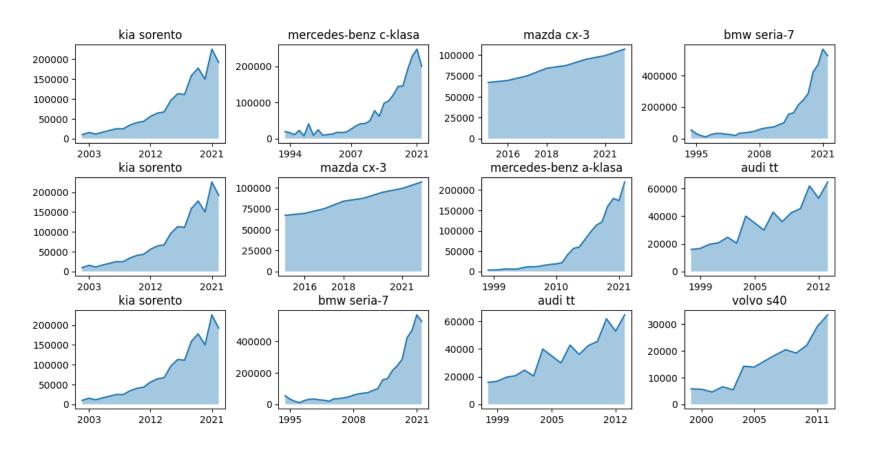




### Too many informations



### Too many informations



### References

### Information sources:

- [1] Wes McKinney, Python for Data Analysis, 3E (2022), Wes's Blog
- [2] Claus O. Wilke, Fundamentals of Data Visualization (2019), Claus Website
- [3] Jarosław Drapala, Kernel Density Estimator explained step by step (2023), Medium Towards Data Science
- [4] 3Blue1Brown (Grant Sanderson), Why  $\pi$  is in the normal distribution (beyond integral tricks) (2023), Youtube
- [5] Reveal BI, The Importance of Data Visualizations (2020), Youtube

### Data sources:

- [5] Brenda N, <u>Titanic dataset</u> (2021), Kaggle
- [6] Główny Urząd Statystyczny, <u>Obwieszczenie w sprawie wysokości przeciętnego miesięcznego wynagrodzenia brutto w gospodarce</u> narodowej w województwach w 2022 roku (2023), GUS
- [7] Aleksandr Glotov, Car Prices Poland (2021), Kaggle

### Other:

[8] My private notes about data visualization an examples

Presentation author: Maksymilian Norkiewicz