

Types of data

- Categorical
 - > nominal (color, hobby)
 - > ordinal (level of education, marks at school)
- Quantitative
 - > numerical (blood pressure, car accidents)

How to describe categorical data?

Categorical nominal

We can calculate:

mode - most frequent element
frequency

Categorical ordinal

x_1, \dots, x_n

Order statistic:

$$x_{(1)} \leq x_{(2)} \leq \dots \leq x_{(n)}$$

Ranks: r_1, \dots, r_n

if $x_{(1)} < \dots < x_{(n)}$ then rank of $r(x_{(k)}) = k$

ties in data

$$X_{(1)} < X_{(2)} = X_{(3)} < X_{(4)}$$

$$r_2 = r_3 = 2.5$$

if we have more
tie elements
we calculate
mean

We have n ranks

$$\sum_{i=1}^n r_i = \frac{n(n+1)}{2}$$

We can calculate for ordered data:

- mode
- quantiles
- sample mean (careful with interpretation)

Dependence measure

X, Y random vars. measures on
 n objects

x_1, \dots, x_n

y_1, \dots, y_n

e.g. do tall people
have also bigger
weight?

Motivation of correlation

Correlation measures the degree
of linear association between two
numeric variables

Pearson correlation coefficient
(linear correlation coefficient)

$$r(X, Y) = \frac{\text{Cov}(X, Y)}{\sqrt{\text{Var}(X) \text{Var}(Y)}}$$

Linear correlation: Pearson correlation

Props:

- When X and Y are independent

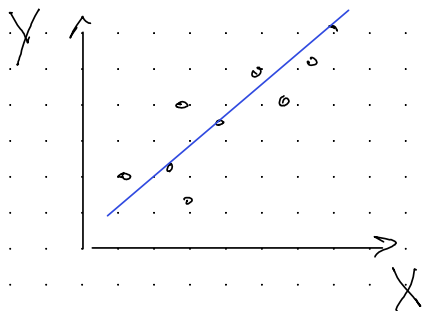
$$r(X, Y) = 0$$

- $-1 \leq r(X, Y) \leq 1$

- When $Y = aX + b$, $a, b \in \mathbb{R}$ and $a > 0$
then $r(X, Y) = 1$

> and $r(X, Y) = -1$ when $a < 0$

Correlation plot



Statistical significance of Pearson's correlation

CC measure is descriptive statistic
(not inferential statistic measure)

$H_0: r = 0$ vs $H_1: r \neq 0$ (two tailed hypothesis)

If $p < \alpha = 0,05$ reject H_0

correlation is stat-y significant

Classification (not ML)

Often we want to classify numerical or ordinal data into classes

Rule of thumb: number of classes $k \approx \sqrt{n}$

Rank correlations

For ordinal data we can't use linear correlation

monotone dependence

Assume k values $x_i^* \sim X$ l values

$$y_j^* \sim Y$$

denote ranks X by $r_1 \dots r_k$

Y by $q_1 \dots q_l$

Denote the number of pairs in the sample where $X = x_i^*$ and

$Y = y_j^*$ by n_{ij}

$$D = \sum_{i=1}^k \sum_{j=1}^l (r_i - q_j)^2 n_{ij}$$

if $D=0$ then

X and Y increasing
with each other

if all elements x_i, y_j
are different
 $k = l = n$

If Y depends on X decreasingly
then D has max value

Rank correlation

Def