

Applied Linear Algebra for Data Science

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First...

Any comments on this?

| traming | nam_ | heart_ | disease |
|---------|------|--------|---------|
| | | | |

| (| male | age | education | currentSmoker | cigsPerDay | BPMeds | prevalentStroke | prevalentHyp | diabetes | te |
|---|----------|-----|-----------|---------------|------------|--------|-----------------|--------------|----------|----|
| | \smile | 39 | 4 | 0 | 0 | 0 | 0 | 0 | 0 | Г |
| | 0 | 46 | 2 | 0 | 0 | 0 | 0 | 0 | 0 | |
| | 1 | 48 | 1 | 1 | 20 | 0 | 0 | 0 | 0 | |
| | 0 | 61 | 3 | 1 | 30 | 0 | 0 | 1 | 0 | |
| | 0 | 46 | 3 | 1 | 23 | 0 | 0 | 0 | 0 | |
| | 0 | 43 | 2 | 0 | 0 | 0 | 0 | 1 | 0 | |
| | 0 | 63 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | |

Apparently there exist only male and non-males (=0) in the world

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General things

- No need to form C explicitly $(C = \frac{1}{n-1}A^TA)$ and therefore relation between SVD of data A and eigenvalues/vectors of C
- ...but A must be centered first!
- ...and remove NaN's
- Principal components = AV or $U\Sigma$
- Note...

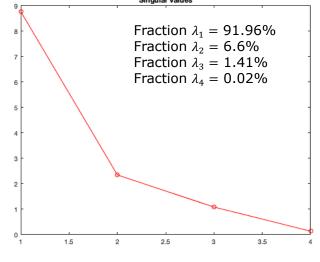
"In both exercises below, use linear algebra built-in functions in Python in your code, such as built-in functions for SVD. Do not use higher-level libraries for PCA"

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Q1a)



Almost all variance in the first two directions – reduce dimension to 2

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Q1b)

- Variables = columns (movies) => work with $C = \frac{1}{n-1}A^TA$ and n = 5 (number of samples)
- First principal component (= Av_1 or σ_1u_1):

-3.9465 4.5370 -1.7661 -3.7083 4.8838

Look for "orthogonal" groups

- The principle components show where we have the largest variance in the samples (explains 91.96% of the variance)
- Largest variance between Ali, Elsa, Johan on one side and Beatrix, Chandra on the other

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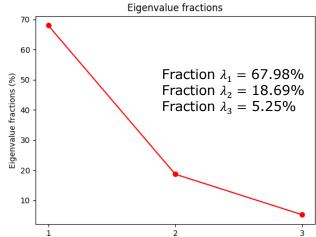
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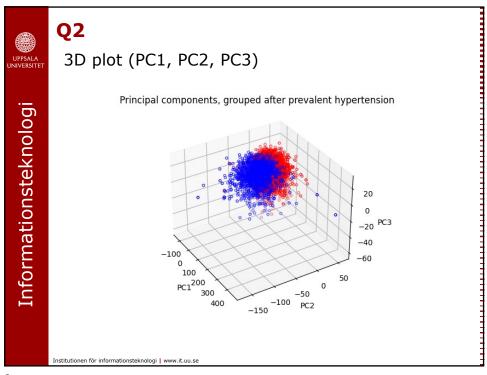
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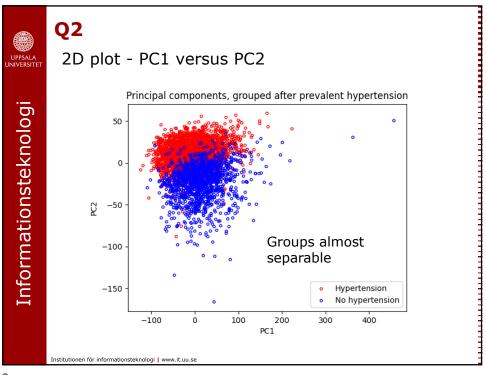
Q2

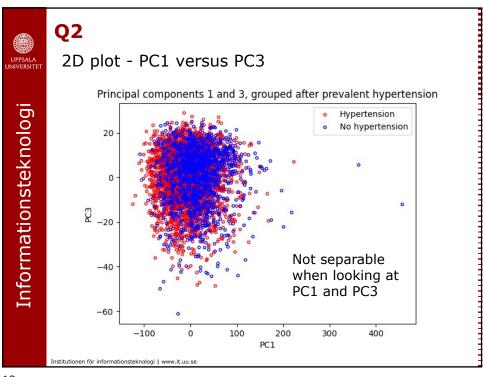
Dominating principal components:



• First 3 components explain ~92% of variance – can reduce dimension to 3







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Q2

First eigenvector v_1

$$v_1 = \begin{pmatrix} 0.0571 \\ -0.01002 \\ \textbf{0.98541} \\ 0.14371 \\ 0.06253 \\ 0.01324 \\ 0.02938 \end{pmatrix} \begin{array}{l} \text{Age} \\ \text{CigsPerDay} \\ \text{totChol} \\ \text{sysBP} \\ \text{diaBP} \\ \text{BMI} \\ \text{Heartrate} \\ \end{pmatrix}$$

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