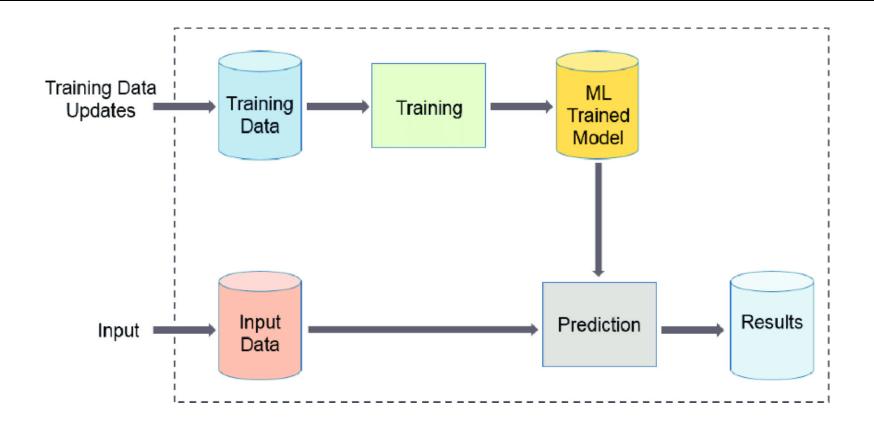
# Machine Learning and Artificial Intelligence

Lab 07 – ML Pipelines

### The Machine Learning workflow



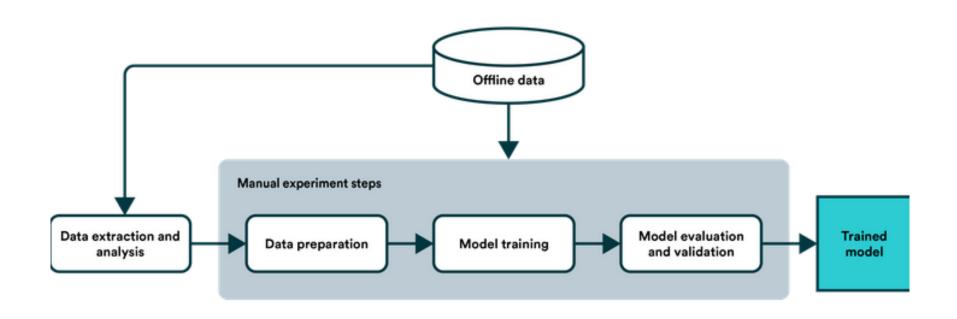
## Manual workflow

• Typical problems tend to be specific and related to a single business problem, e.g. recognise the logo.

 Teams tend to start with a manual workflow, where no real infrastructure exists.

In this paradigm and first stage, the model is the product.

#### Manual workflow

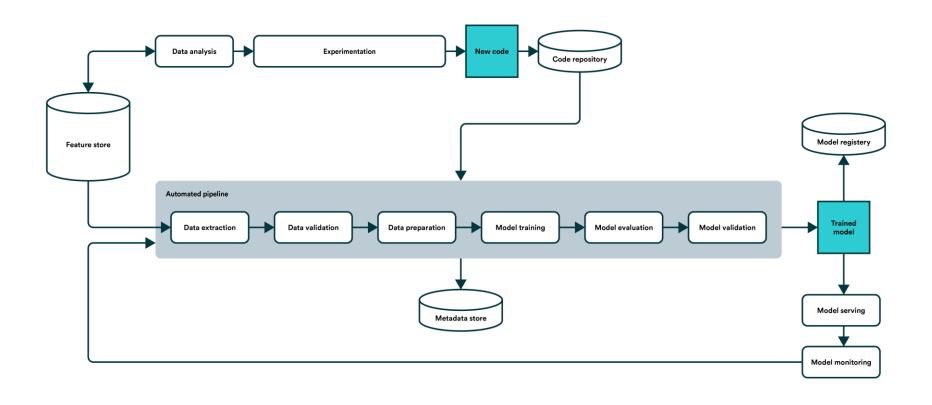


## Automated workflow

 Once the problem is clear and the team has a solution, the problem shifts towards a way to keep updating the model in production.

• The product is not the model anymore, but the whole process, aka the **pipeline**.

#### Automated workflow



# Chaining components

- Once we have known solutions and re-usable components, we can chain them together and form a sequential pipeline, without needing to manually adjust the single components.
- The components can be the following:
  - o Data validation
  - o Data cleanup
  - Model training
  - Model evaluation

# Practical example: PCA + K-Means

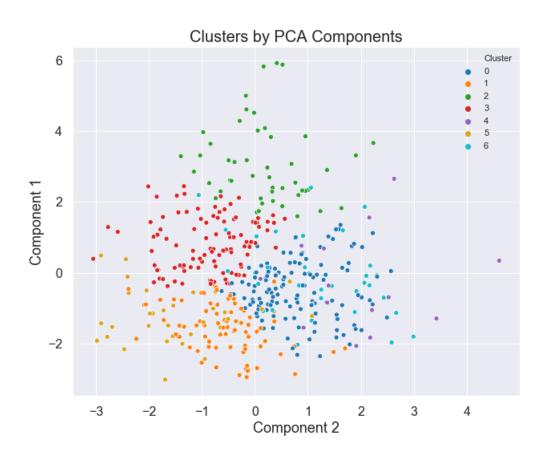
• A well-known combination, stemming from the work of Ding et al. (2004) «*K*-means clustering via principal component analysis».

• We can first reduce the dimensionality of the data, obtaining in this way a feature space where the clustering result can be understandable (remember orthogonal dimensions!!!).

## PCA + K-Means

- We want to create a sequential process which:
  - 1. Pre-processes the data.
  - 2. Applies PCA to the pre-processed data (Nr. Of components?).
  - 3. Applies K-Means clustering to the reduced data (K?).
  - 4. Displays the results on the reduced data.
  - 5. Displays a general per cluster analysis on the real data.

## PCA + K-Means



## Sklearn links

- <a href="https://scikit-learn.org/stable/modules/generated/sklearn.decomposition.PCA.html">https://scikit-learn.org/stable/modules/generated/sklearn.decomposition.PCA.html</a>
- https://scikitlearn.org/stable/modules/generated/sklearn.preprocessing.MinMaxScaler. html#sklearn.preprocessing.MinMaxScaler
- https://scikitlearn.org/stable/modules/generated/sklearn.cluster.KMeans.html
- <a href="https://scikit-learn.org/stable/modules/generated/sklearn.pipeline.Pipeline.html">https://scikit-learn.org/stable/modules/generated/sklearn.pipeline.Pipeline.html</a>

