

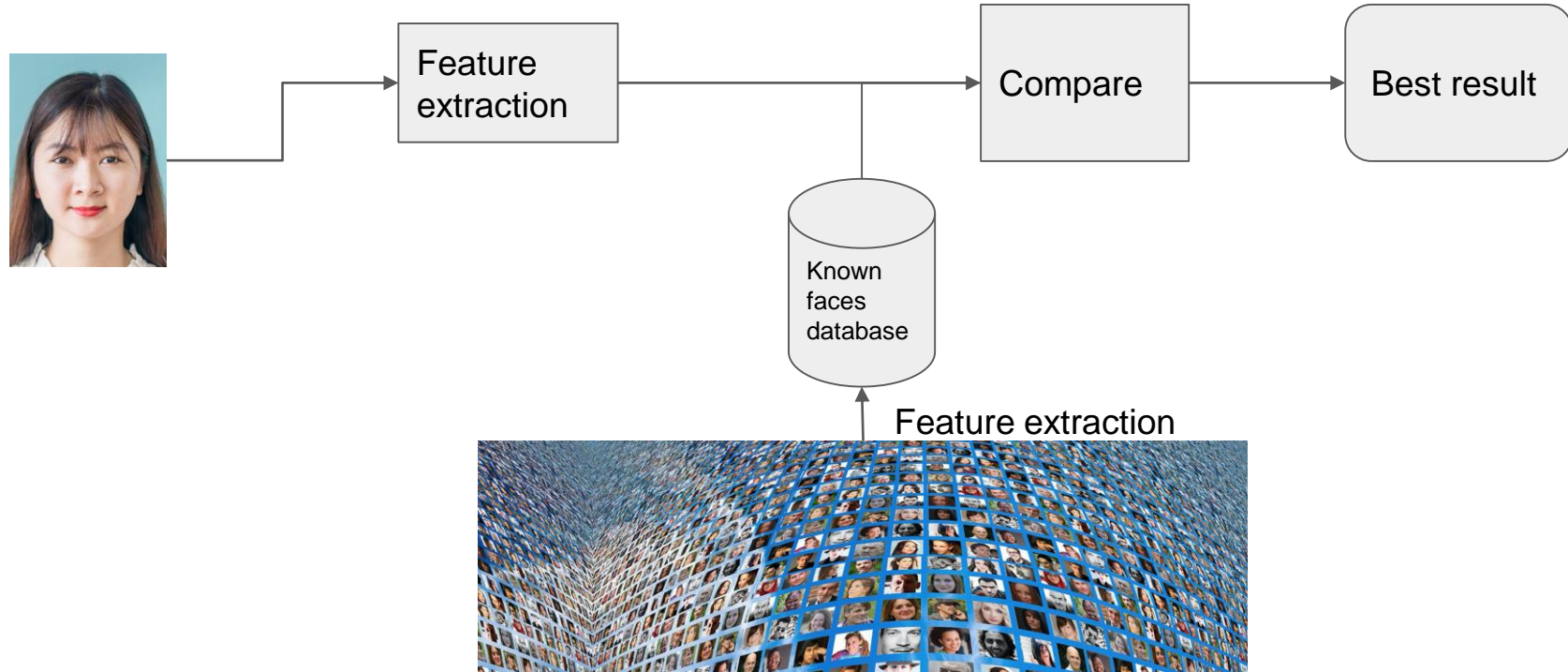
# HOW TO SEARCH FOR AN IMAGE IN MILLIONS OF RECORDS IN JUST 0.1S

# Content

- Why do we need to extract some features for images?
- How to organize photo storage for easy search?

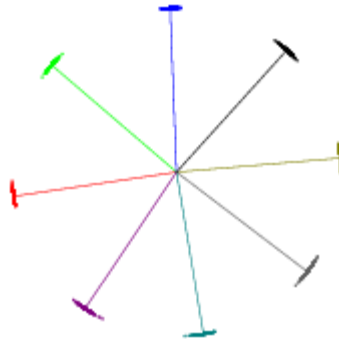
# Purpose

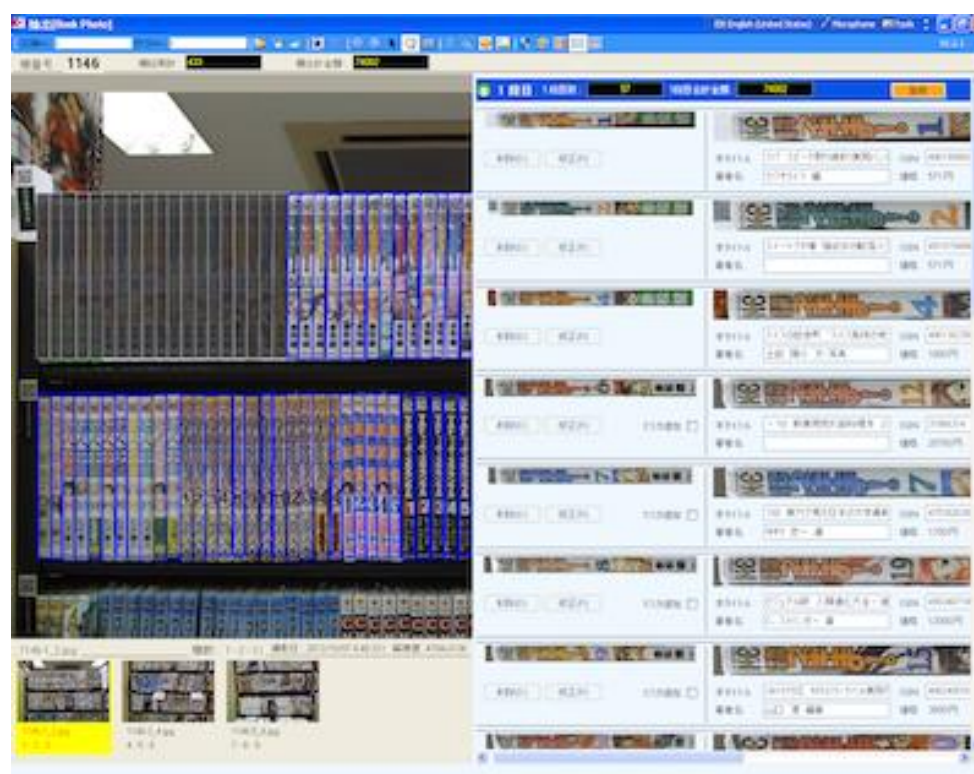
- Search an image in 100M records in real time with popular server



# Feature extraction

- Using Convolution neural Network and one shot learning to extract face feature as 512D vector with length = 1
- The feature extracted by neural network will be as below: (sample on 8 identities with 2D features)





The system automatically identify and extract the book back-covers from the images of bookshelves. It then uses to perform matching on the images of back-covers to identify the books.

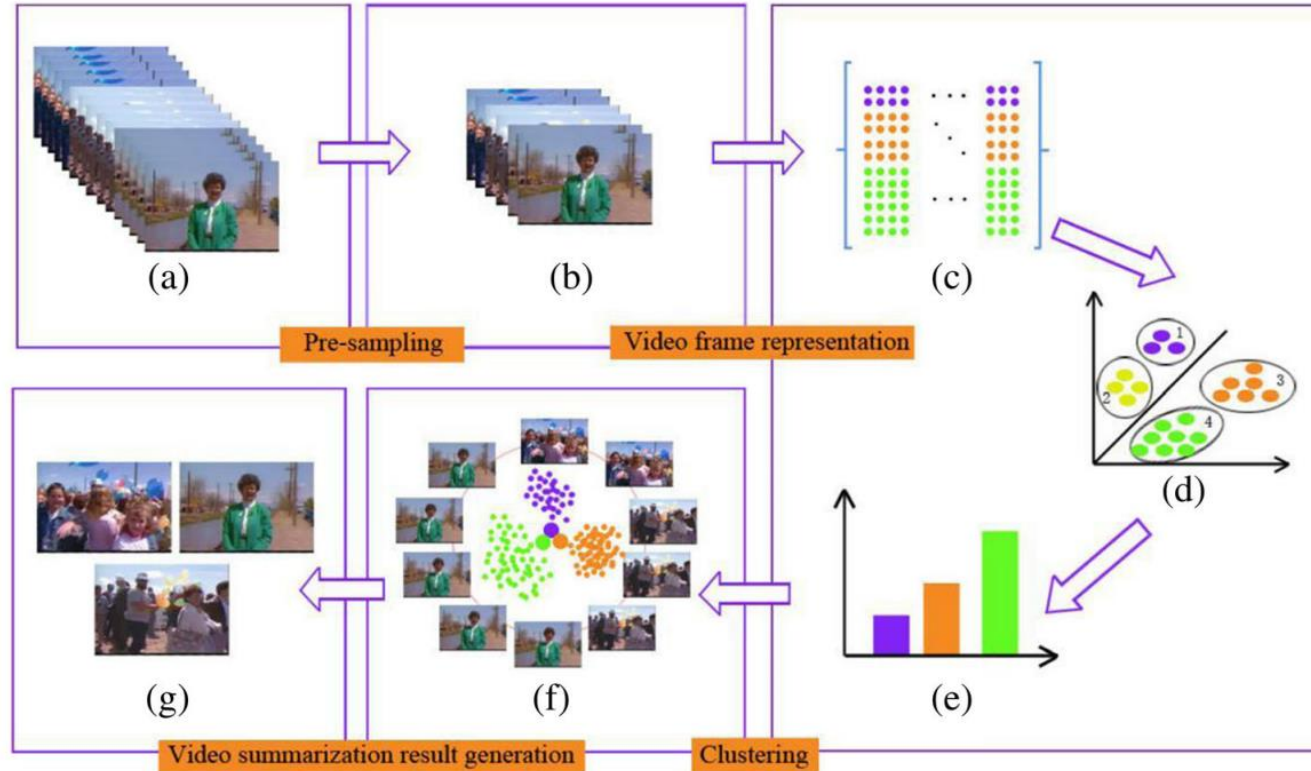
# Feature extraction



This automatic stocktaking system is used in Japan bookstores to perform stocktaking on their book inventory.

It can search through several hundred thousand images in a database in a few seconds. The recognition accuracy has currently reached 92%.

# Feature extraction



# Image searching - compare

- Compare 2 features: using euclidean distance

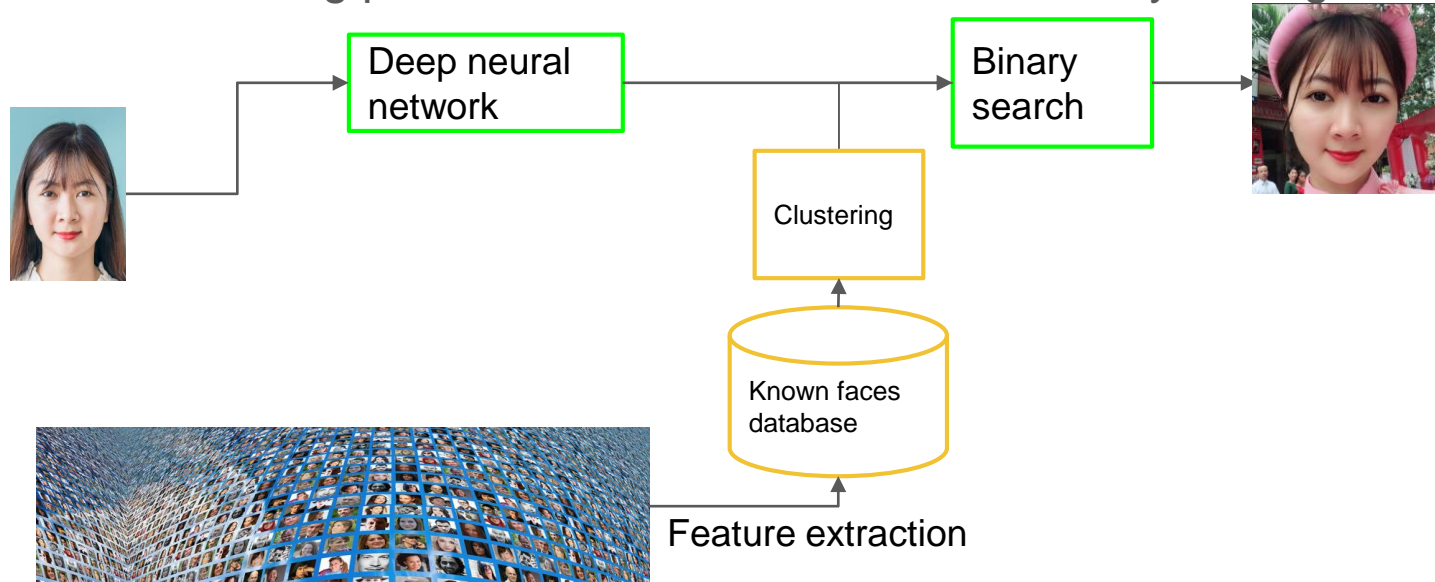
$$\begin{aligned}d(\mathbf{p}, \mathbf{q}) &= d(\mathbf{q}, \mathbf{p}) = \sqrt{(q_1 - p_1)^2 + (q_2 - p_2)^2 + \cdots + (q_n - p_n)^2} \\ &= \sqrt{\sum_{i=1}^n (q_i - p_i)^2}.\end{aligned}$$

- In case, the number known image database is small(example 1000 records), compare each features in database with input image's feature can get the most similar images
- But, known images database contain a hundred million of records→ compare sequentially will take a huge computation cost



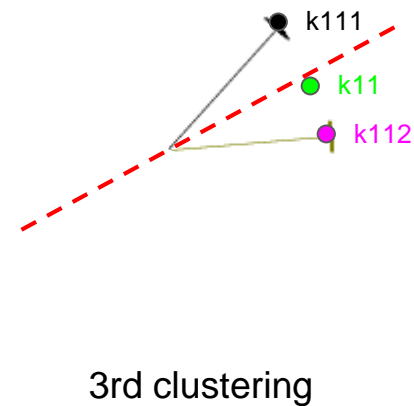
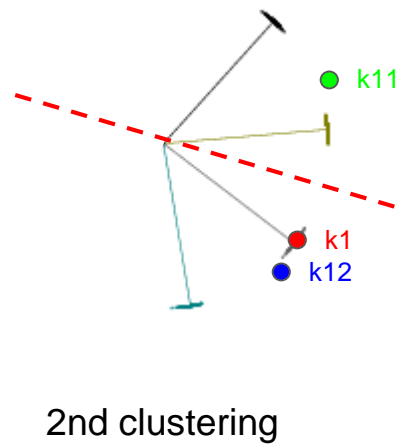
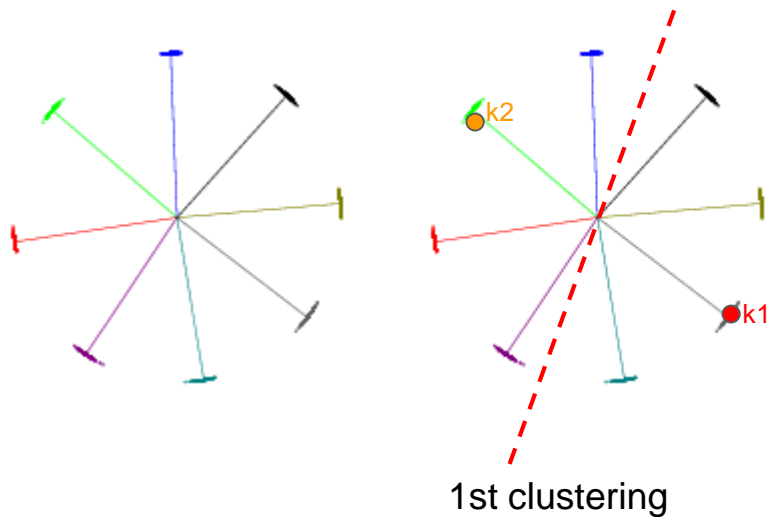
# Image searching: binary tree

- The idea of this solution is using k-mean with  $k=2$  to clustering known image to 2 cluster. Then for each cluster, continue clustering to 2 sub cluster. We can do this clustering process until each cluster contain only 1 image.

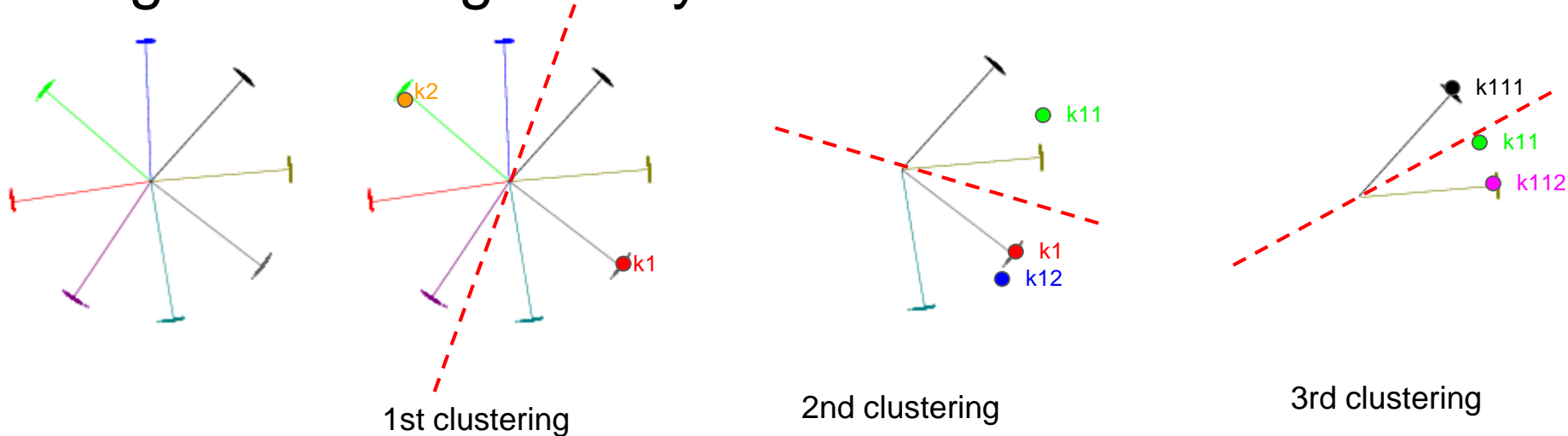


# Image searching: binary tree

- Example on 8 identities with 2D features

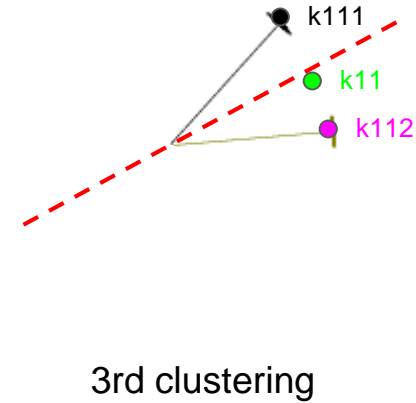
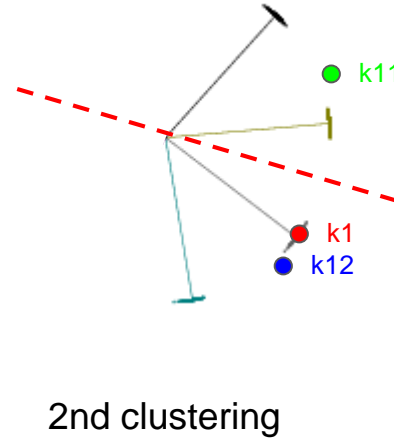
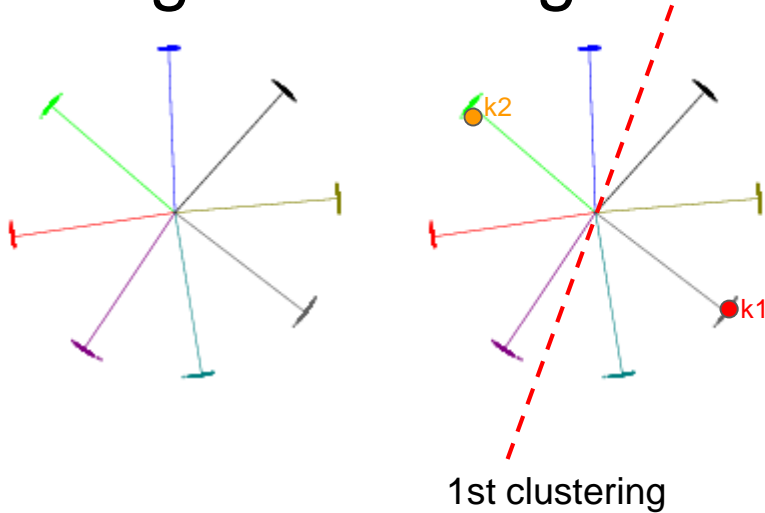


# Image searching: binary tree



- To compare input face(with feature vector  $f$ ) with known database:
  - Compare  $f$  with cluster kernel  $k1, k2 \rightarrow$  example we got  $d(f, k1) < d(f, k2)$
  - Compare  $f$  with cluster kernel  $k11, k12 \rightarrow$  example we got  $k11$
  - Compare  $f$  with cluster kernel  $k111, k112 \rightarrow$  we can get the most similar features vector

# Image searching: binary tree



- By this solution(k-mean clustering):
  - The clustering doing in offline mode
  - The complexity is  $O(\log n)$  instead of  $O(n)$  for sequential searching