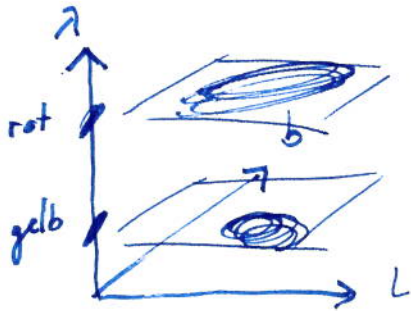


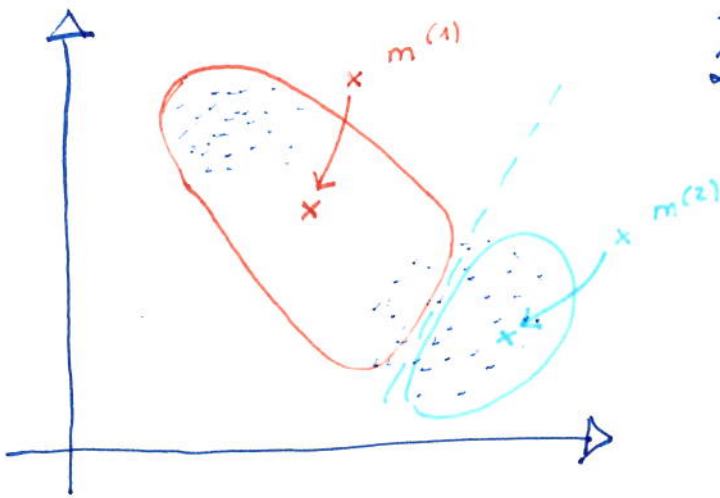
Bananen: "gelb", "krumm/lang"

Äpfel: "rot", "rund"

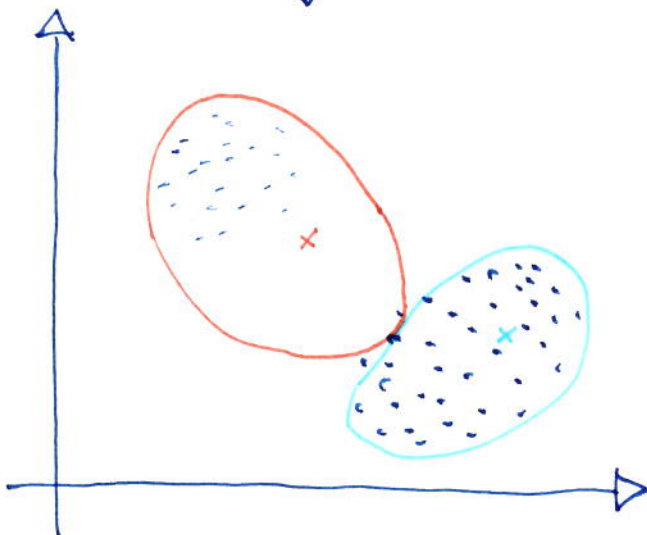


Beispiel

1. Wähle # Cluster  $K$
2. Wähle zufällige Cluster-Zentren
3. repeat
  - "assignment": "Zuständigkeit"
  - "update"



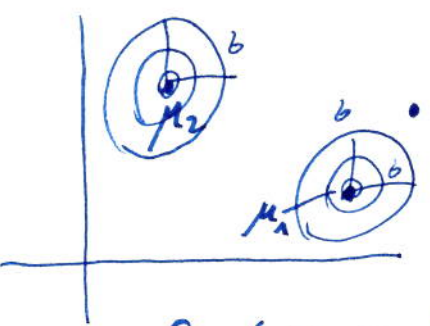
↓



(Cluster verschieben sich in jedem Schritt)

Programm versagt bei best. Beispielen  
(es sucht weisrunde Cluster)

zB   usw.



$$f_{x|\theta} = \sum_{k=1}^2 \pi_k \frac{1}{\sqrt{2\pi} b} \exp\left(-\frac{(x-\mu_k)^2}{2b^2}\right)$$

$\{x_n\}_{n=1}^N$  Daten  $\sum_{k=1}^2 \pi_k = 1$

$\theta = (\mu_1, \mu_2, b)$   $\{k_n\}_{n=1}^N$  Label "Verteilung 1/2"

$$P(k_n = 1 | x_n, \theta)$$

$$= \frac{f_{x|\theta}(x_n | k_n = 1) \pi_1}{f_{x|\theta}(x_n | k_n = 1) \pi_1 + f_{x|\theta}(x_n | k_n = 2) \pi_2} = f_{x|\theta}(x_n)$$

$$f_{x|\theta}(x_n | k_n = 1) = \frac{1}{\sqrt{2\pi} b} \exp\left(-\frac{(x_n - \mu_1)^2}{2b^2}\right)$$

$f_{\mu_1, \mu_2 | \{x_n\}, b}$  likelihood  $\leftarrow$  Daraus ein Max. finden

$= \underbrace{f_{\{x_n\} | \mu_1, \mu_2, b} \cdot \text{prior } \mu_1, \mu_2}_{\text{likelihood} \cdot \text{prior}}$

$f_{\{x_n\} | b} \leftarrow$  konstant

$$L := \log f_{\{x_n\} | \mu_1, \mu_2}$$

$$\frac{\partial}{\partial \mu_k} L = \left( \frac{\pi_k \dots \exp(\dots)}{\sum} \right) \leftarrow 1 \text{ Term} \cdot \left( \frac{x_n - \mu_k}{b^2} \right) \leftarrow 2 \text{ Terme}$$

$$\frac{\partial}{\partial \mu_k} L = \sum_n \frac{(x_n - \mu_k)}{b^2} f_{\mu_k | x_n}$$

(Finde Nullstellen der Ableitung mit (Quasi-)Newton)

$$\frac{\partial^2}{\partial \mu_k^2} L \approx - \sum_n f_{\mu_k | x_n} \frac{1}{b^2}$$

$$\mu_{k, \text{neu}} = \frac{\sum f_{\mu_k | x_n} \cdot x_n}{\sum f_{\mu_k | x_n}}$$

so berechnet man den  
neuen Schwerpunkt

③

Schätzer für den bisherigen Cluster