

Session 4 :

4 مہ
ML Studies

① Parameter — آسان

② Non-Parameter — آسان

محل کے لیے داتا کی روشنی میں
مثبت: سادہ، سریع، فراہم شدہ داتا

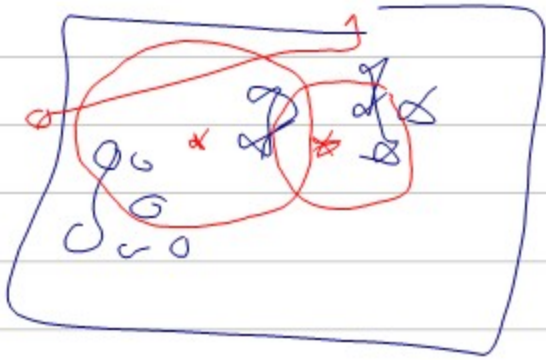
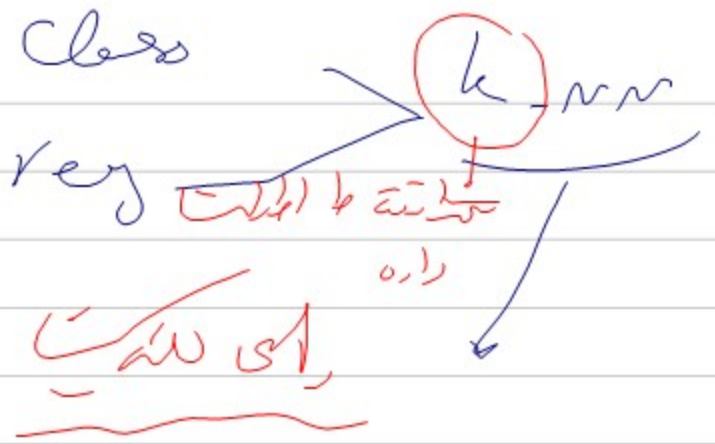
مثبت: داتا کی بہت حد تک

k -NN

k nearest neighbors

① memory-based

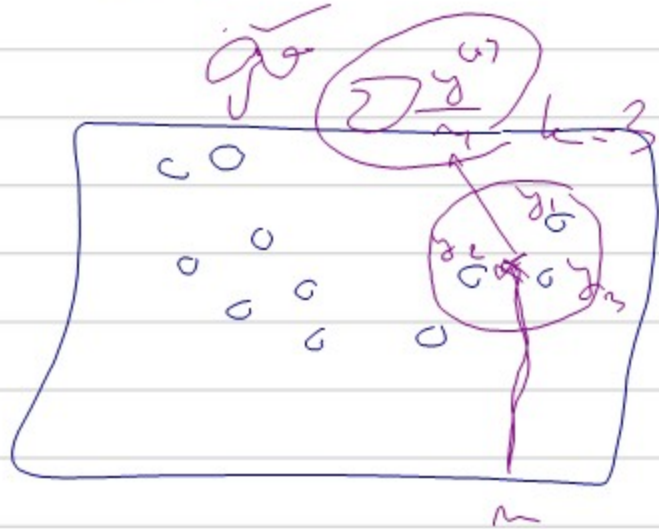
② Instance-based
model



ک و انجمن

ک

ک



overfitt \downarrow $k \downarrow$ \uparrow non-linear

underfit \downarrow $k \uparrow$ linear

و

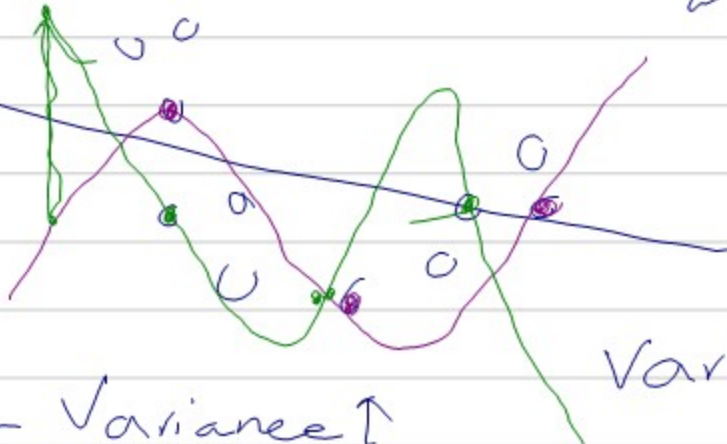
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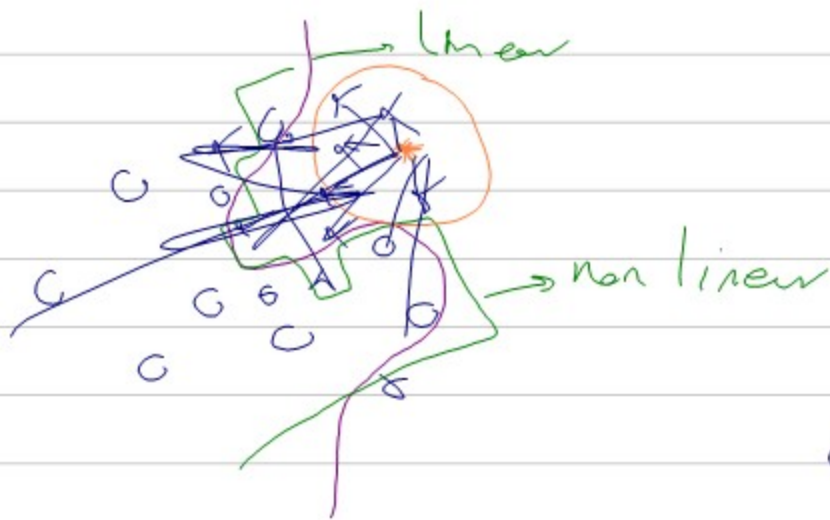
overfit \leftarrow Variance \uparrow

underfit \leftarrow bias \uparrow



Variance \checkmark

bias \checkmark



distance metrics

Euclidean (1)

$$d(u, u') = \sqrt{(u_1 - u'_1)^2 + (u_2 - u'_2)^2 + \dots + (u_D - u'_D)^2}$$

$$u = \begin{bmatrix} u_1 \\ u_2 \\ \vdots \\ u_D \end{bmatrix} \quad u' = \begin{bmatrix} u'_1 \\ u'_2 \\ \vdots \\ u'_D \end{bmatrix}$$

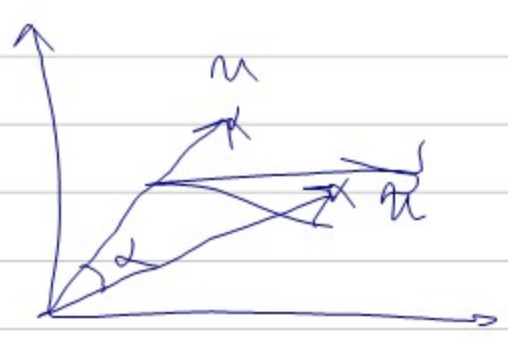
Weighted (2)

$$d_w(u, u') = \sqrt{\omega_1 (u_1 - u'_1)^2 + \omega_2 (u_2 - u'_2)^2 + \dots + \omega_D (u_D - u'_D)^2}$$

Minkowski (3)

$$d(u, u') = \left(\sum_{i=1}^D (u_i - u'_i)^p \right)^{\frac{1}{p}} \quad \text{distance}$$

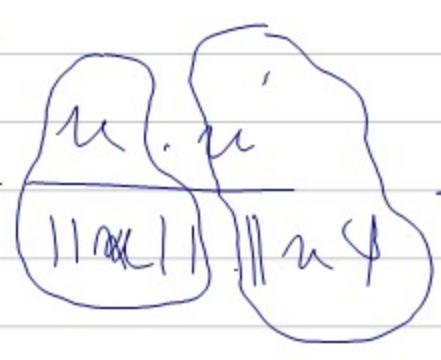
Cosine distance (4)



$$d(u, u') = 1 - \cos \alpha$$

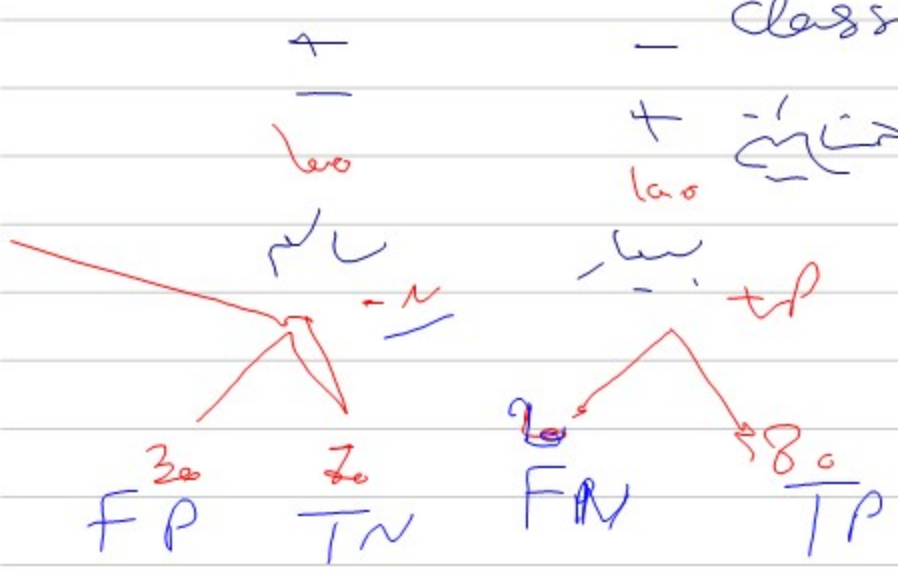
similarity score

$$\cos \theta(u, u') = \frac{u \cdot u'}{\|u\| \|u'\|}$$



$$\frac{\sum u_i u'_i}{\sqrt{\sum u_i^2} \sqrt{\sum u'^2_i}}$$

classification stage



accuracy (1)

u
T
F

	real	
	P	N
predicted	TP	FP
	FN	TN

P
N

$$acc = \frac{TP + TN}{N}$$

$$\left. \begin{array}{l} + 10 \\ - 990 \end{array} \right\} 1000$$

$$\text{acc} = \frac{0 + 990}{1000} = 99\%$$

imbalanced data

0	1	
TP	FP	$\rightarrow \frac{TP}{TP+FP}$ Sensitivity (Recall) (2)
FN	TN	$\rightarrow \frac{TN}{FN+TN}$ Precision (3)

$$\frac{TP}{TP+FN} = \frac{0}{0+990} = 0\%$$

$$F1_Score = \frac{2PR}{P+R} = \frac{2 \times 1}{\frac{1}{P} + \frac{1}{R}}$$

Recall

F1-Score (4)

class key \rightarrow Ensemble learning

~~Strong learning~~

Just weak \rightarrow weak learning

$N_1, N_2, N_3, \dots, N_D$

g_1, g_2, \dots

h

Parallel (1)

N_1 just
 N_2 at
 N_3 then

\rightarrow cost
end-to-end training

$P_1 N_1 \xrightarrow{L_2} N_2 \rightarrow \dots \rightarrow N_D$ just (2)

Random Forest Parallel — bagging ①
 جاکتار ۵۰۰ ✓

جاکتار — Boosting ①
 ✓ Bias —
 ✓ Adaboost
 ✓ marginboost ✓

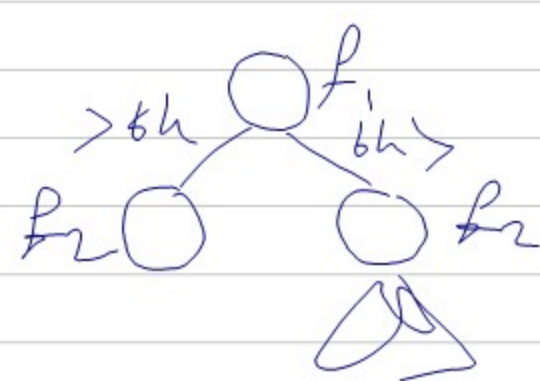
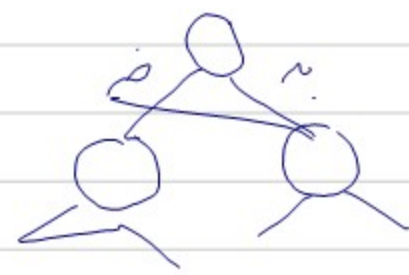
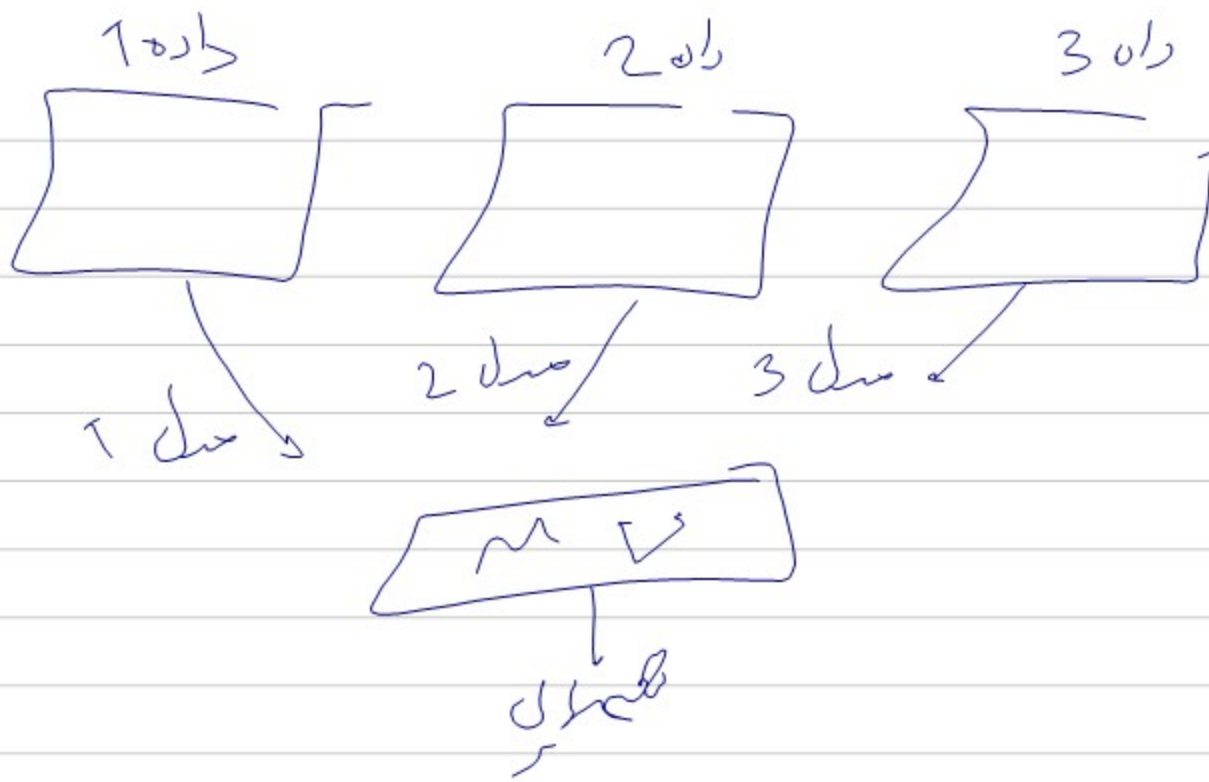
bagging جاکتار
 ≡ Bootstrap aggregating

Bootstrap جاکتار
 جاکتار ۵۰۰ ✓

✓ overlapping
 ✓ جاکتار

۵
 ۰۰۰
 n1
 ۰۰۰
 n2
 ۰۰۰
 n3

0
 0
 0
 0
 0
 0



Decision Tree In
R

Classification

Information gain

MSE

reg

Shannon

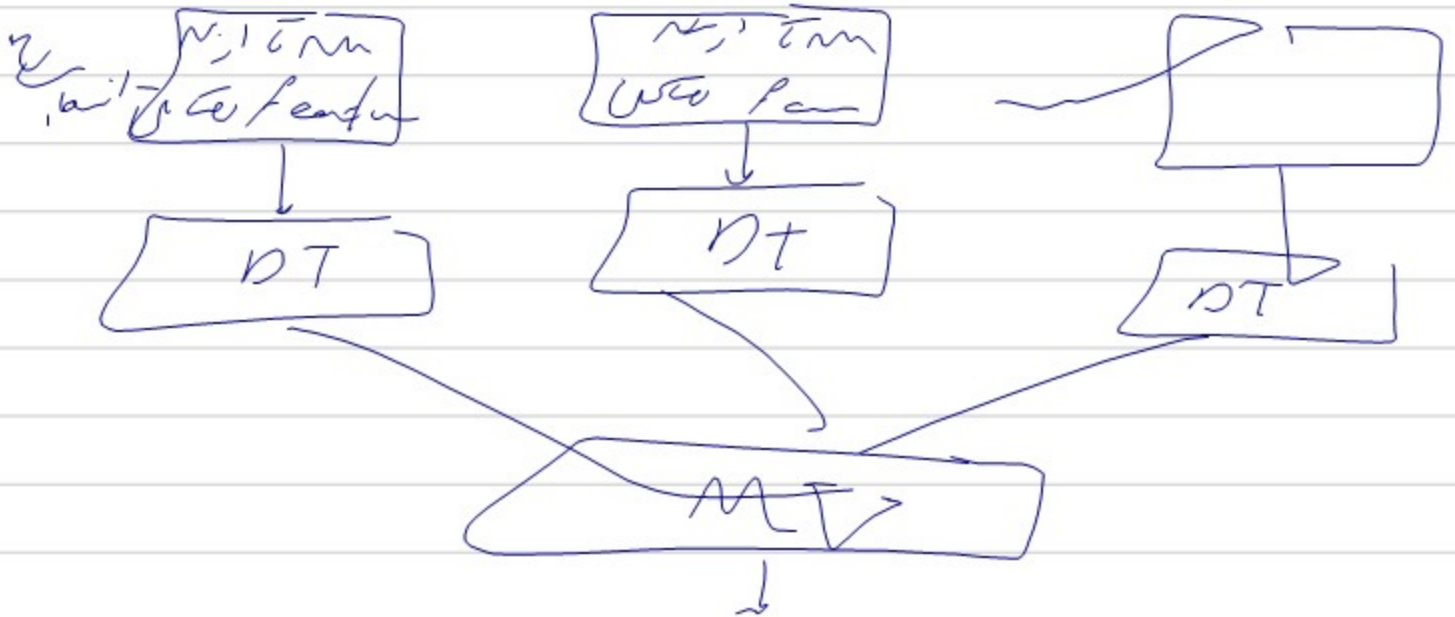
Entropy

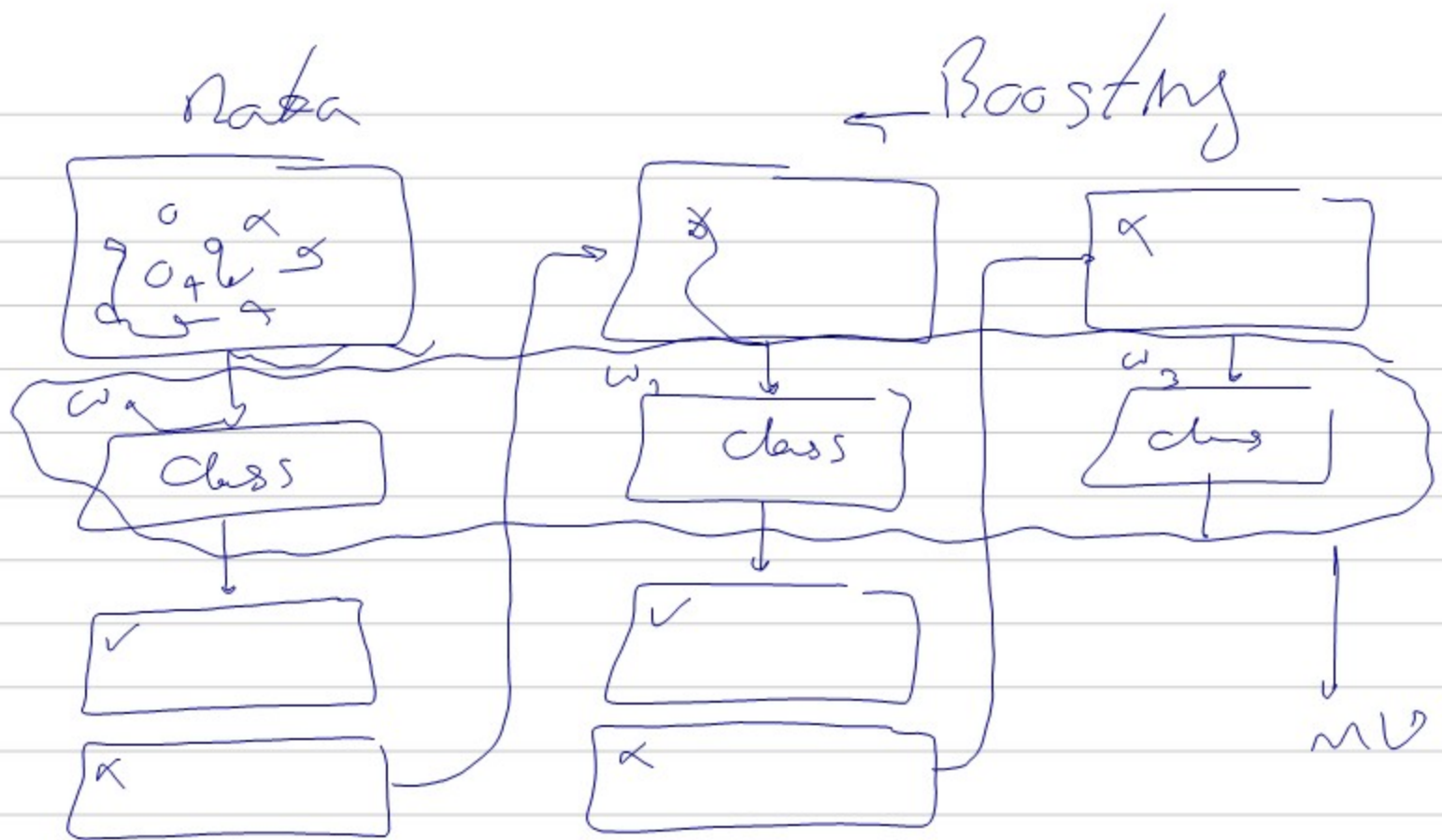
Random Forest

bagging

DT \rightarrow W

D_{set} } $N \rightarrow P$
non





Adaboost

Aggregates

$$H_m(x) = \alpha_1 H_1(x) + \alpha_2 H_2(x) + \dots + \alpha_n H_n(x)$$

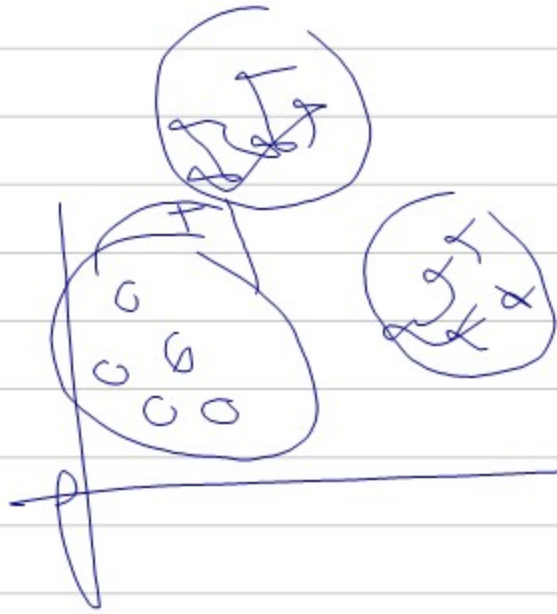
$$\text{Prediction} = \text{sign}(H_m(x))$$

clustering

کلاسوں کو

گروپس بنانا

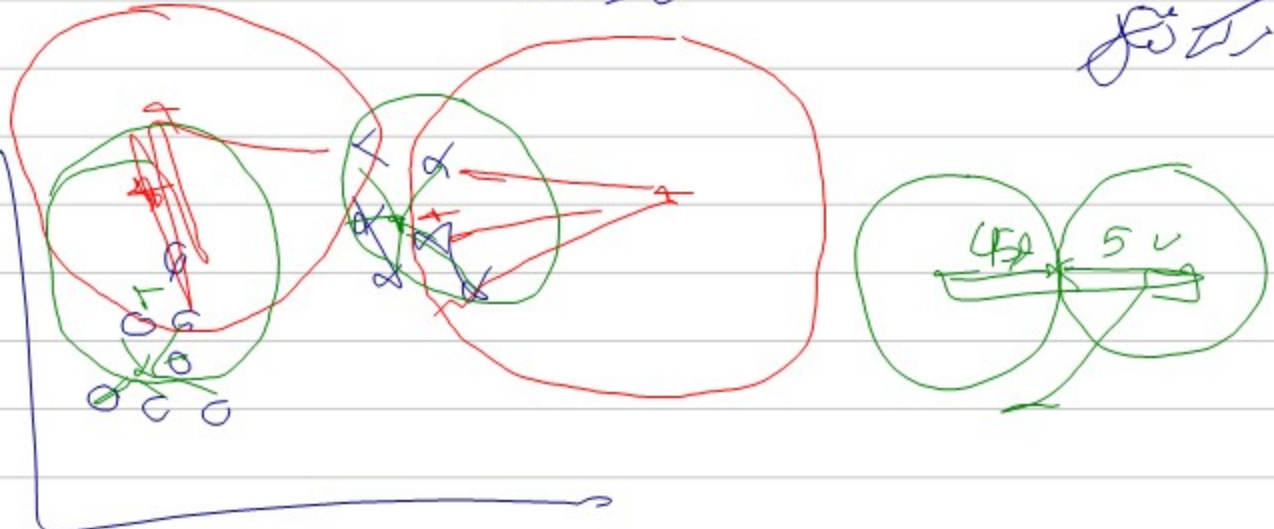
①



k-means

کلاسوں کو

گروپس



within-cluster sum of square WCSS

$$WCSS = \sum_{k=1}^K \sum_{u \in K_k} \|u - \mu_k\|^2$$

مجموعہ کلاسوں کے within-cluster sum of square



$w_{CSS_1} > w_{CSS_2}$

