

1. What type of Machine Learning approach you will follow for the following set of scenarios? 3

- a) Given: training data (without desired outputs)

ML Approach: unsupervised / clustering

- b) Given: training data + desired outputs (labels)

ML Approach: supervised / classification

- c) Given: training data + a few desired outputs

ML Approach: Semi-supervised

2. When supervised learning fails in ML?

for numeric ~~attribute~~ attributes. The answers are:

- Because of outliers it shows skewed distribution

- Non monotonous effect of attributes

When we provide completely different dataset for test

3. How to handle missing data in a dataset?

Categorical: Put N/A

Numerical: - put mean

any of { - remove the instance

there } - remove the attribute column from all instances

4. What is a class imbalanced dataset in machine learning? 3

If a dataset has so many data of one label and a very few of another class label then the dataset is imbalanced. It is not good for ML. for example,

| Happy | Sad | Play |
|-------|-----|------|
| 1 | 0 | Yes |
| 0 | 1 | Yes |
| 1 | 1 | Yes |

→ no other class label given.

5. ^{continued} $P(\text{Pos} \mid \text{Play cricket} \cap \text{sad}) = P(\text{Pos}) * P(\text{Play} \mid \text{Pos}) * P(\text{cricket} \mid \text{Pos}) * P(\text{sad} \mid \text{Pos})$

$$= 0.5 * \frac{2}{11} * \frac{2}{11} * \frac{2}{11} = 0.0030$$

$P(\text{Neg} \mid \text{Play cricket} \cap \text{sad}) = P(\text{Neg}) * P(\text{Play} \mid \text{Neg}) * P(\text{cricket} \mid \text{Neg}) * P(\text{sad} \mid \text{Pos})$

$$= 0.5 * \frac{2}{12} * \frac{2}{12} * \frac{3}{12} = 0.0035$$

As, Negative probability is greater so the given new twitter is negative.

6. ^{continued} Taking Attribute = Home Owner, Attribute = Marital Status

| Home Owner | Yes | No | Entropy |
|------------|-----|----|---------|
| Yes | 0 | 3 | 0 |
| No | 3 | 4 | 0.985 |

| Marital Status | Yes | No | Entropy |
|----------------|-----|----|---------|
| Single | 2 | 2 | 1 |
| Married | 0 | 4 | 0 |
| Divorced | 1 | 1 | 1 |

$$I(\text{Home owner}) = \frac{0+3}{10} \times 0 + \frac{3+4}{10} \times 0.985$$

$$= 0.6895$$

$$\text{Gain}(\text{Homeowner}) = E(S) - I(\text{Homeowner})$$

$$= 0.881 - 0.6895$$

$$\rightarrow 0.1915$$

$$I(\text{marital status})$$

$$= \frac{2+2}{10} \times 1 + \frac{0+4}{10} \times 0 + \frac{1+1}{10} \times 1$$

$$= 0.6$$

$$G(\text{Marital Status})$$

$$= 0.881 - 0.6$$

$$\rightarrow 0.281$$

Attribute = Annual Income

| Annual income | Yes | No | Entropy |
|---------------|-----|----|---------|
| High | 0 | 4 | 0 |
| Low | 3 | 3 | 1 |

$$I(\text{Annual income}) = \frac{0+4}{10} \times 0 + \frac{3+3}{10} \times 1$$

1. Solve the problem following Naïve Bayes algorithm from a labeled dataset of twitter. Find out whether the new twitter = "I am playing cricket and sad" is negative or positive. 8

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| Document | Label | $P_{Pos} = \text{positive} = 2$ |
|---|----------|---------------------------------|
| I am <u>happy</u> because I am <u>playing cricket</u> . | Positive | $Neg = \text{Negative} = 2$ |
| I am <u>happy</u> , <u>not sad</u> . | Positive | $P(Pos) = \frac{2}{2+2} = 0.5$ |
| I am <u>sad</u> , I am <u>not playing cricket</u> . | Negative | $P(Neg) = \frac{2}{2+2} = 0.5$ |
| I am <u>sad</u> , <u>not happy</u> . | Negative | |

| (2) | Pos | Neg | |
|---------|-----|-----|--|
| happy | 2+1 | 1+1 | $P(\text{Play} Pos) = \frac{2}{11} \rightarrow P(\text{happy} Pos) = \frac{3}{11}$ |
| Play | 1+1 | 1+1 | $P(\text{cricket} Pos) = \frac{2}{11}, P(\text{not} Pos) = \frac{2}{11}$ |
| cricket | 1+1 | 1+1 | |
| not | 1+1 | 2+1 | $P(\text{sad} Pos) = \frac{2}{11}$ |
| sad | 1+1 | 2+1 | $P(\text{Play} Neg) = \frac{2}{12}, P(\text{happy} Neg) = \frac{2}{12}$ |
| | 11 | 12 | $P(\text{cricket} Neg) = \frac{2}{12}, P(\text{not} Neg) = \frac{3}{12}, P(\text{sad} Neg) = \frac{3}{12}$ |

Q1 P(Pos) "I am playing cricket and sad" = P(Pos | play, cricket, sad)
 ← See here

6. Use the naïve Bayes method to determine whether a loan X=(Home Owner = No, Marital Status=Married, Income=High)should be classified as a Defaulted Borrower or not. (Write the calculations only in the blank) 3

| Tid | Home Owner | Marital Status | Annual Income | Defaulted Borrower |
|-----|------------|----------------|---------------|--------------------|
| 1 | Yes | Single | High | No |
| 2 | No | Married | High | No |
| 3 | No | Single | Low | No |
| 4 | Yes | Married | High | No |
| 5 | No | Divorced | Low | Yes |
| 6 | No | Married | Low | No |
| 7 | Yes | Divorced | High | No |
| 8 | No | Single | Low | Yes |
| 9 | No | Married | Low | No |
| 10 | No | Single | Low | Yes |

i. $P(\text{Yes}) = \dots 3/10 = 0.3$ and $P(\text{No}) = \dots 7/10 = 0.7$

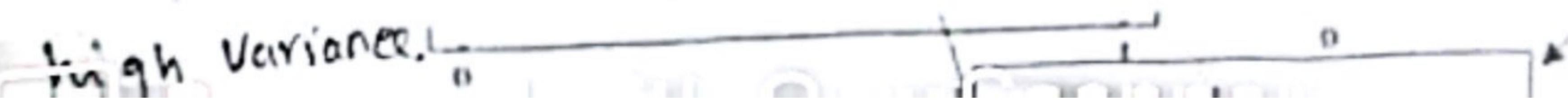
ii. $P(X|\text{No}) = P(\text{Home Owner}=\text{No}|\text{No}) \times P(\text{Status}=\text{Married}|\text{No}) \times P(\text{Income}=\text{High}|\text{No})$
 $= 4/7 \times 4/7 \times 4/7 = 0.187$

7. Solve the above problem Q.6 using Decision Tree, find the Root node only. JD3 8

Overall entropy $E(S) = -\frac{3}{3+7} \log\left(\frac{3}{3+7}\right) - \frac{7}{3+7} \log\left(\frac{7}{3+7}\right)$
 $= 0.881$

Yes = 3
No = 7

← see here.



↑ Variance

| Home owner | P | n | entropy |
|------------|---|---|-------------------|
| yes | 0 | 3 | 0.98 0 |
| No | 3 | 4 | 0.98 |

| marital status | P | n | entropy |
|----------------|---|---|-------------------|
| Single | 2 | 2 | 0.21 0 |
| MARRIED | 0 | 1 | 0 |
| Divorced | 1 | 1 | 0 |

| Annual income | P | n | entropy |
|---------------|---|---|--------------------|
| High | 0 | 4 | 0 |
| Low | 3 | 3 | 0.681 0 |

$$\therefore I(\text{Home owner}) =$$

$$= \frac{3}{10} \times 0 + \frac{7}{10} \times 0.98 = 0.686$$

$$I(\text{marital status})$$

$$= \frac{2}{10} \times 0 + \frac{8}{10} \times 0.21 + \frac{2}{10} \times 0$$

$$= 0.473 - 0.6$$

$$\therefore \text{Gain}(\text{Home owner})$$

$$= 0.88 - 0.686 = 0.194$$

$$\therefore \text{Gain}(\text{marital status})$$

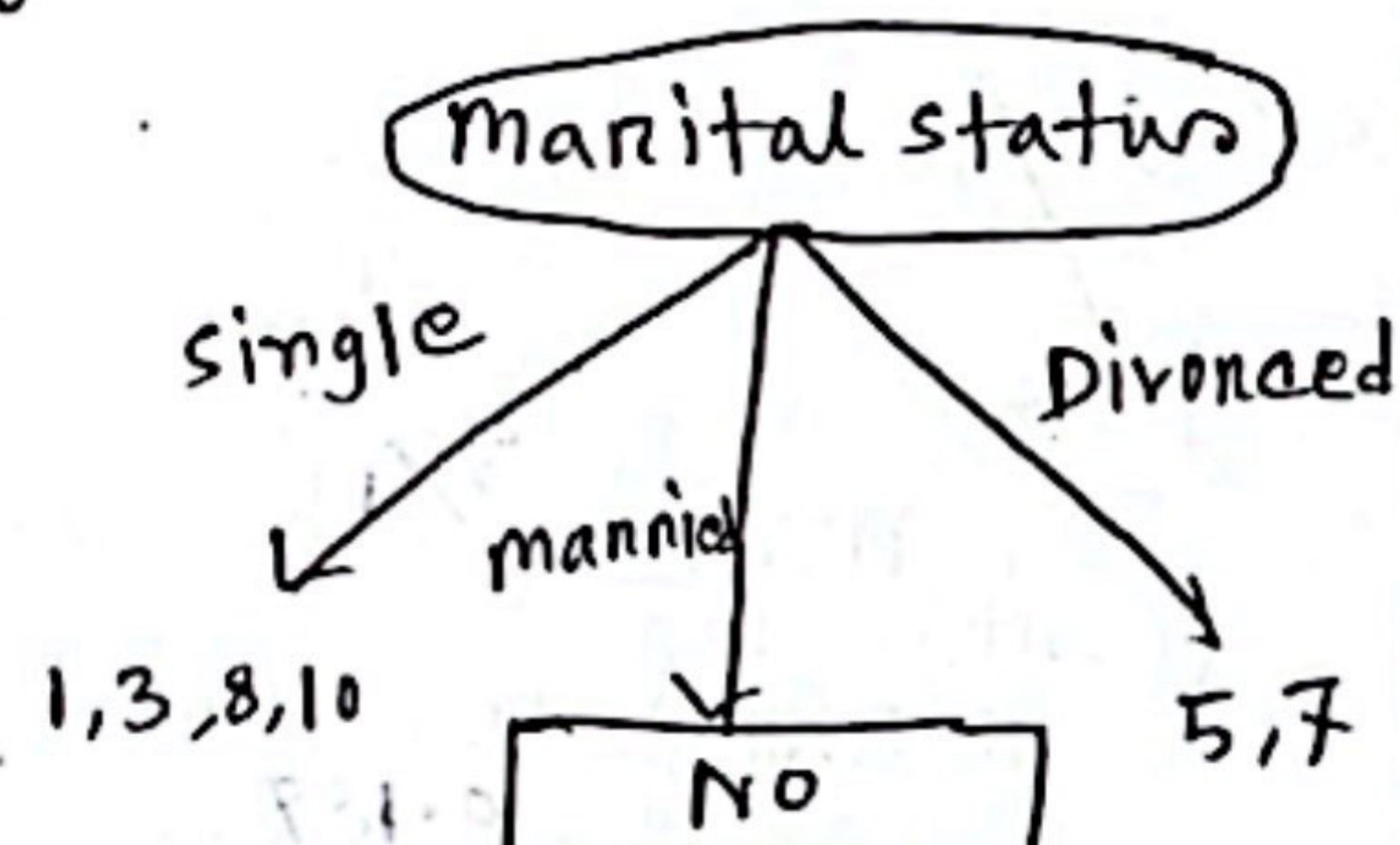
$$= 0.88 - 0.473 = 0.407$$

$$\therefore \text{Gain}(\text{Annual per income})$$

$$= 0.88 - 0.484 = 0.406$$

$$I(\text{Annual income})$$

$$= \frac{6}{10} \times 0 + \frac{4}{10} \times 0.681 = 0.264 - 0.6$$



\therefore the root node is Marital status as

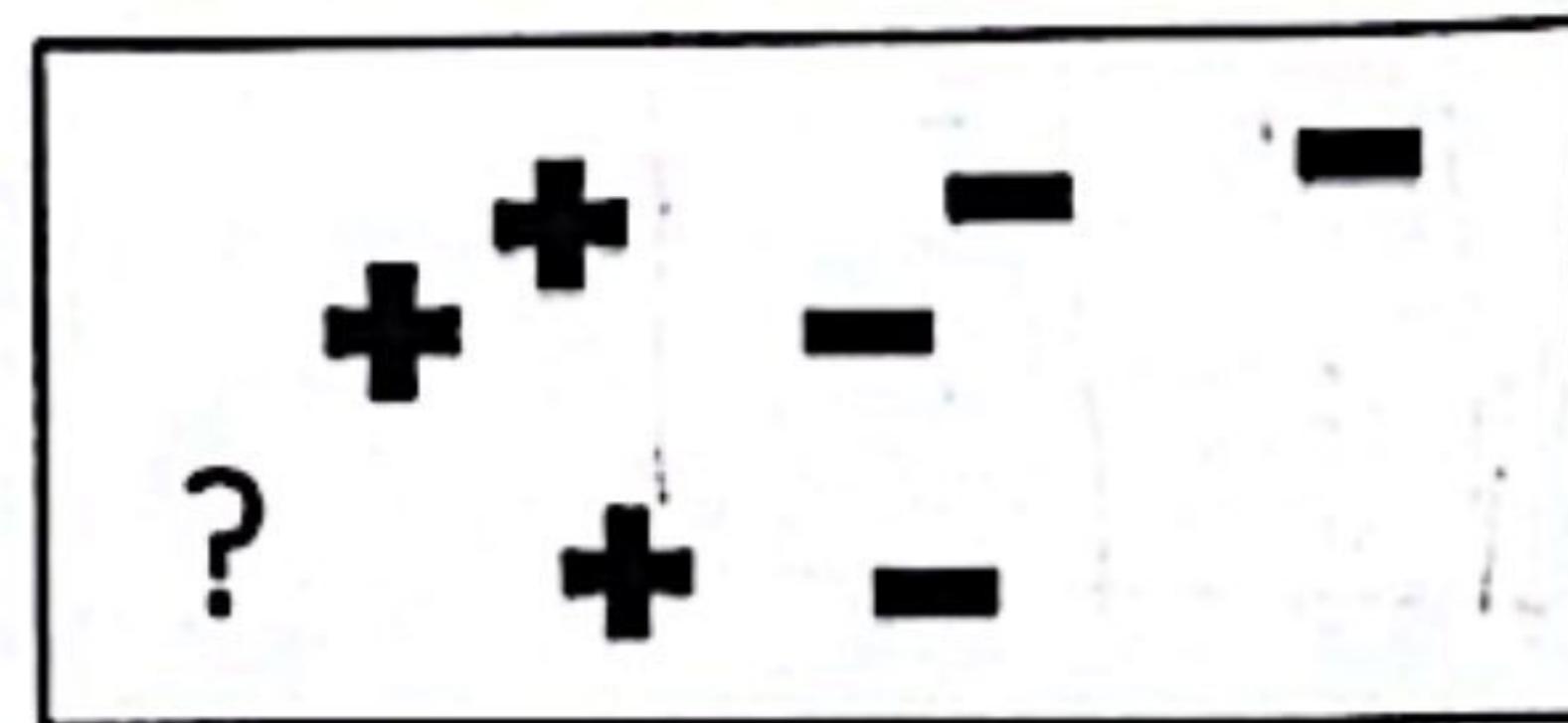
its gain is highest



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1. [10] Given the following labeled dataset:

For what value of k(minimal) will be the query point "?" be negative? Show it thoroughly using K-NN. (ties are broken at random, do not consider ties output)



2. [5] How can you identify a *High Bias model*? How can you fix it? [5]

→ A model has high bias if the model is unable to cover the true relationship between variables. for ex.: In linear regression method, a straight line has high bias as it is inflexible and unable to cover the true relationship. High bias can be fixed by finding a sweet spot between two models. 3 methods: i) regularization ii) Bagging iii) Boosting

3. [5] What happens if you use a very large k on the dataset in K-NN? Why might too small values of k also be bad?

→ If I use very large value of k, then a category with a few samples will always be out voted by other categories. Too small values of k (such as k=1 or 2) might cause noise and subject to the effect of outliers.

4. [5] Suppose, we use a logistic regression model to predict whether or not 400 different college basketball players get drafted into the NBA. From the predicted and actual test outcome the confusion matrix formed as the following. Calculate Precision, Recall and Accuracy and F1-measure.

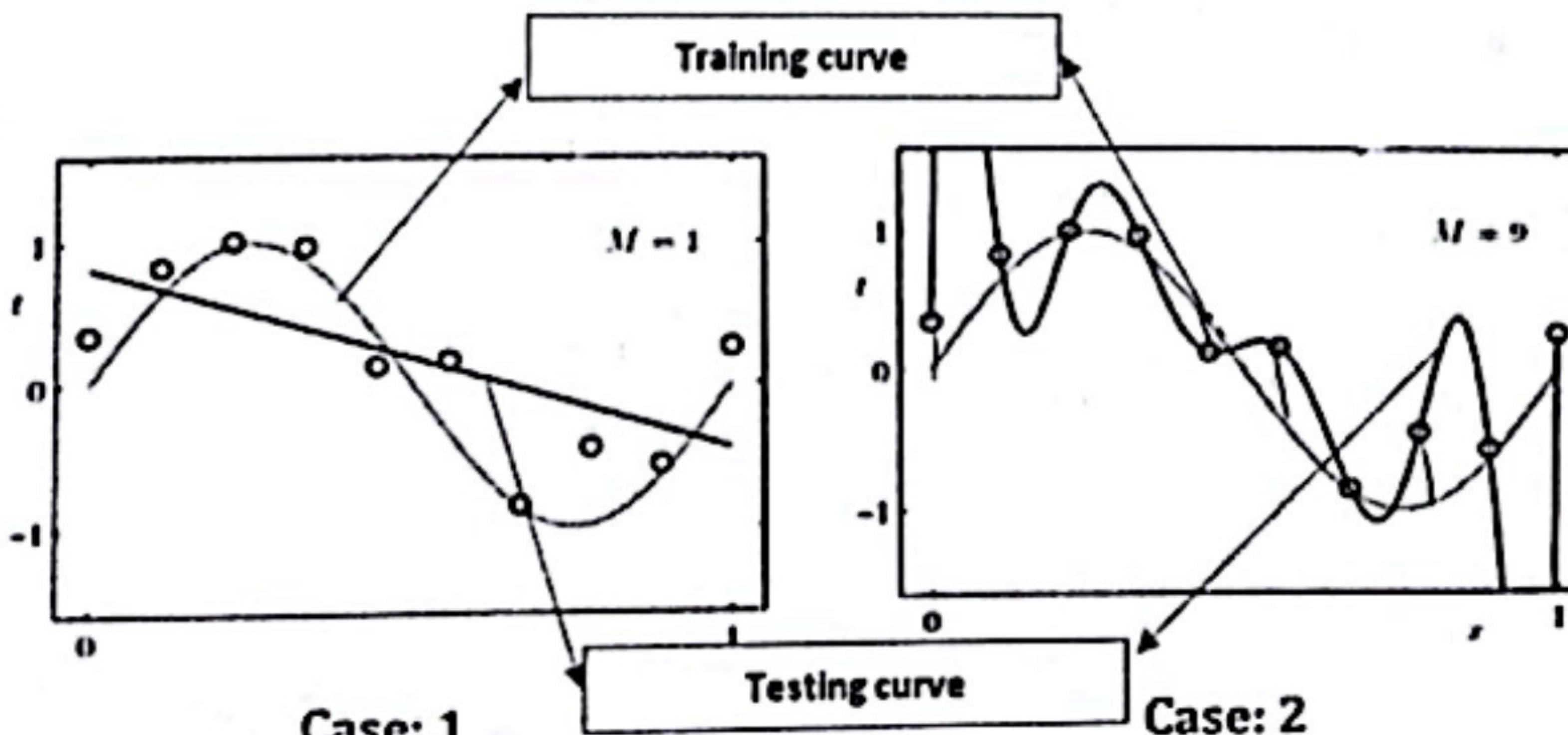
| | Actual "Yes" | Actual "No" |
|-----------------|--------------|-------------|
| Predicted "Yes" | 120 TP | 40 FN FP |
| Predicted "No" | 70 FP | 170 TN |

$$\therefore \text{Precision} = \frac{\text{TP}}{\text{TP} + \text{FP}} = \frac{120}{120 + 40} = 0.632 \approx 0.75$$

$$\therefore \text{Recall} = \frac{\text{TP}}{\text{TP} + \text{FN}} = \frac{120}{120 + 70} = 0.675 \approx 0.632$$

$$\therefore \text{Accuracy} = \frac{\text{TP} + \text{TN}}{\text{TP} + \text{TN} + \text{FP} + \text{FN}} = \frac{120 + 170}{120 + 170 + 70 + 40} = 0.725$$

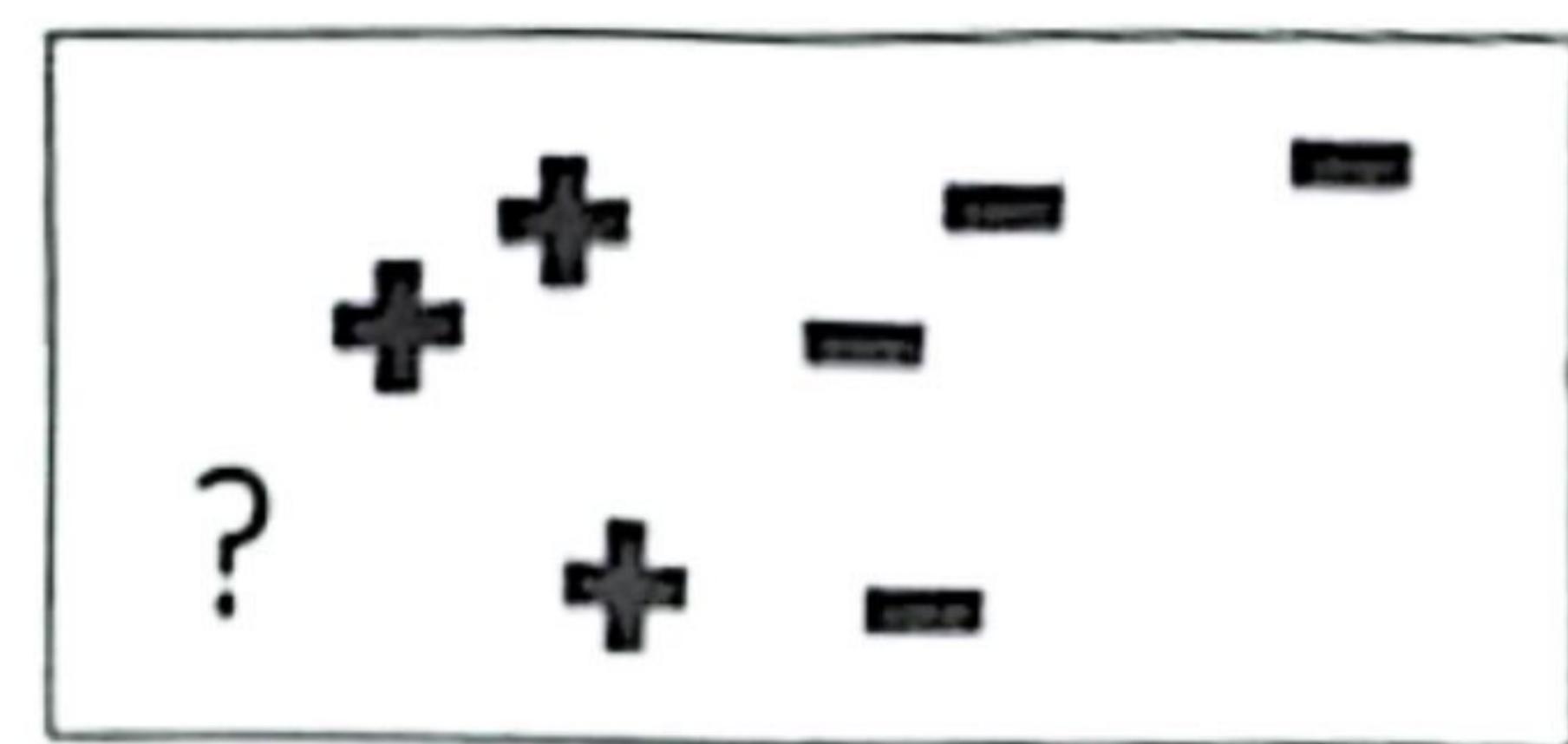
5. [5] Define Overfitting and Underfitting for the following two figures (Case1 and Case 2). What is wrong with them?



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1. [10] Given the following labeled dataset:

For what value of k(minimal) will be the query point "?" be negative? Show it thoroughly using K-NN. (ties are broken at random, do not consider ties output)



2. [5] How can you identify a *High Bias model*? How can you fix it? [5]

~~Bias means the inability to identify the true relationship of a dataset. For different data points we can calculate the predicted values and use mean square error to determine high bias with error mean square. If error mean square is more, bias is high. To fix, we can use squiggly line rather than straight line.~~

3. [5] What happens if you use a very large k on the dataset in K-NN? Why might too small values of k also be bad?

~~If we take large value of K, then cluster with low data points will always be ignored.~~

~~To small value for K, can identify ~~other~~ a data point in a cluster of noise, also can be affected by outliers~~

4. [5] Suppose, we use a logistic regression model to predict whether or not 400 different college basketball players get drafted into the NBA. From the predicted and actual test outcome the confusion matrix formed as the following. Calculate Precision, Recall and Accuracy and F1-measure.

| | Actual "Yes" | Actual "No" |
|-----------------|--------------|-------------|
| Predicted "Yes" | 120 | 40 |
| Predicted "No" | 70 | 170 |

$$\text{Precision: } \frac{120}{120+40} = \frac{120}{160} = 0.75$$

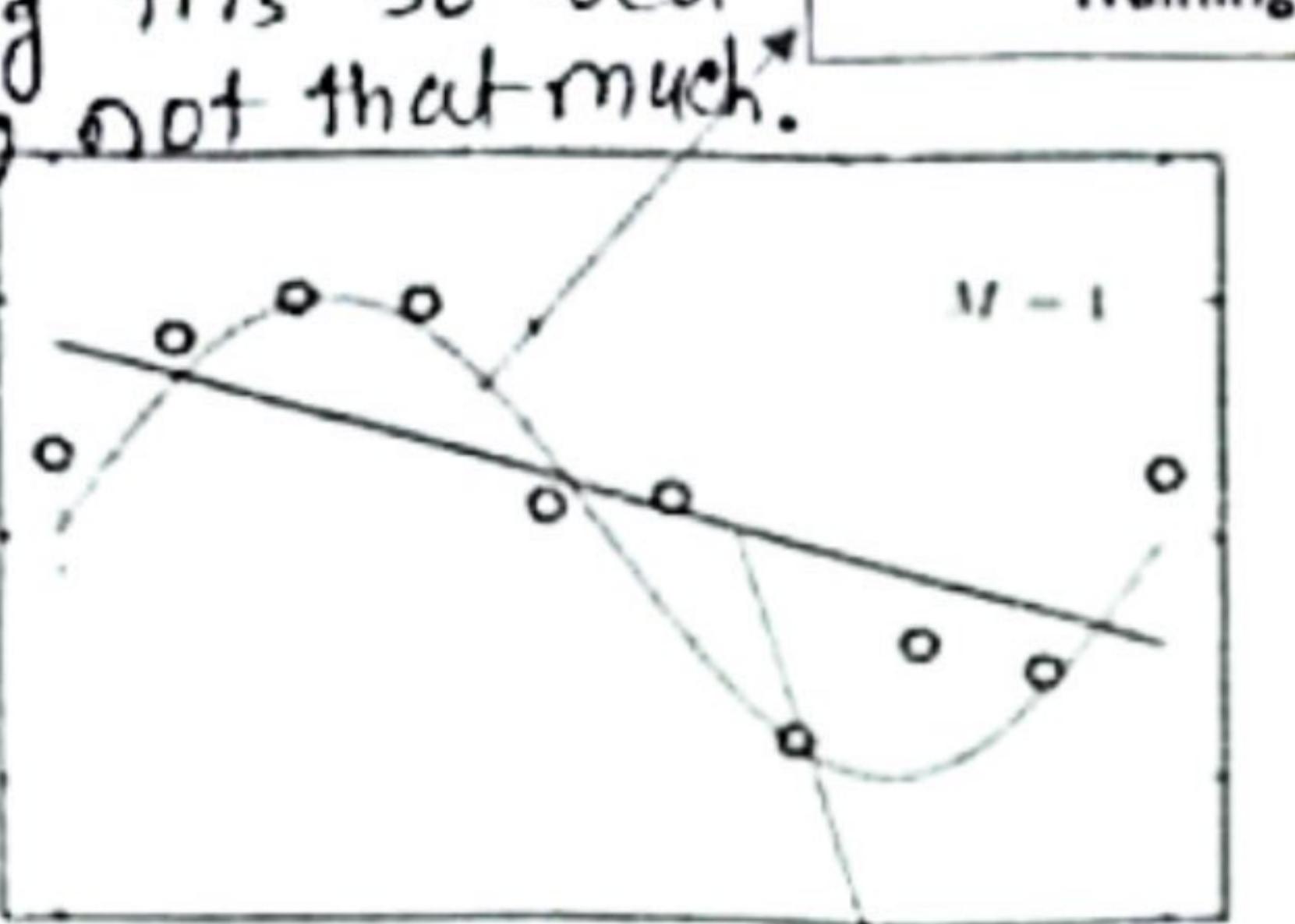
$$\text{Recall: } \frac{120}{120+70} = 0.63$$

$$\text{Accuracy: } \frac{120+170}{120+40+70+170} = ?$$

5. [5] Define Overfitting and Underfitting for the following two figures (Case1 and Case 2). What is wrong with them?

~~Overfitting occurs here as training fits so well but testing not that much.~~

~~Underfitting,
The wrong
thing is
it has
high variance.~~

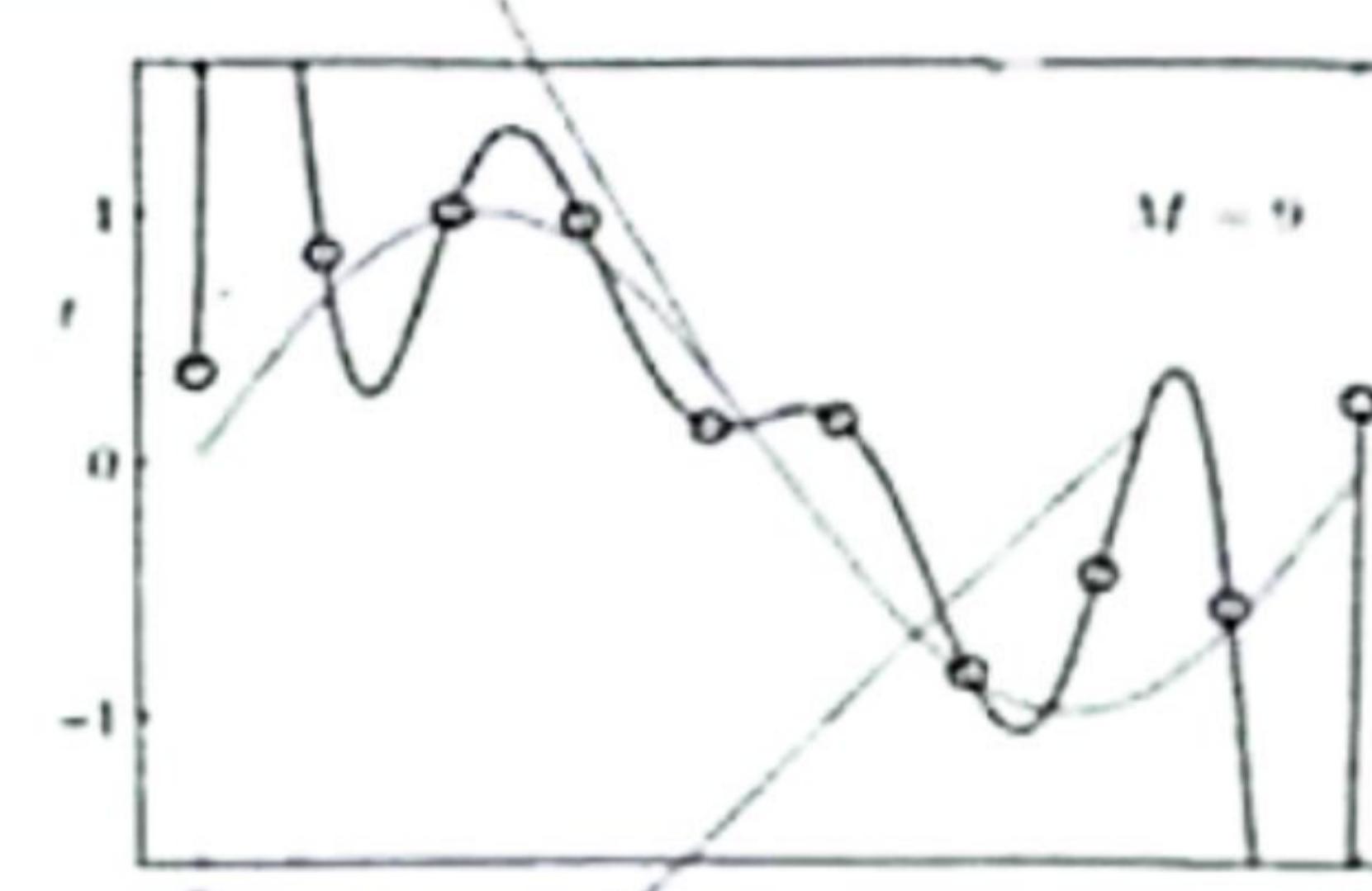


Training curve

Testing curve

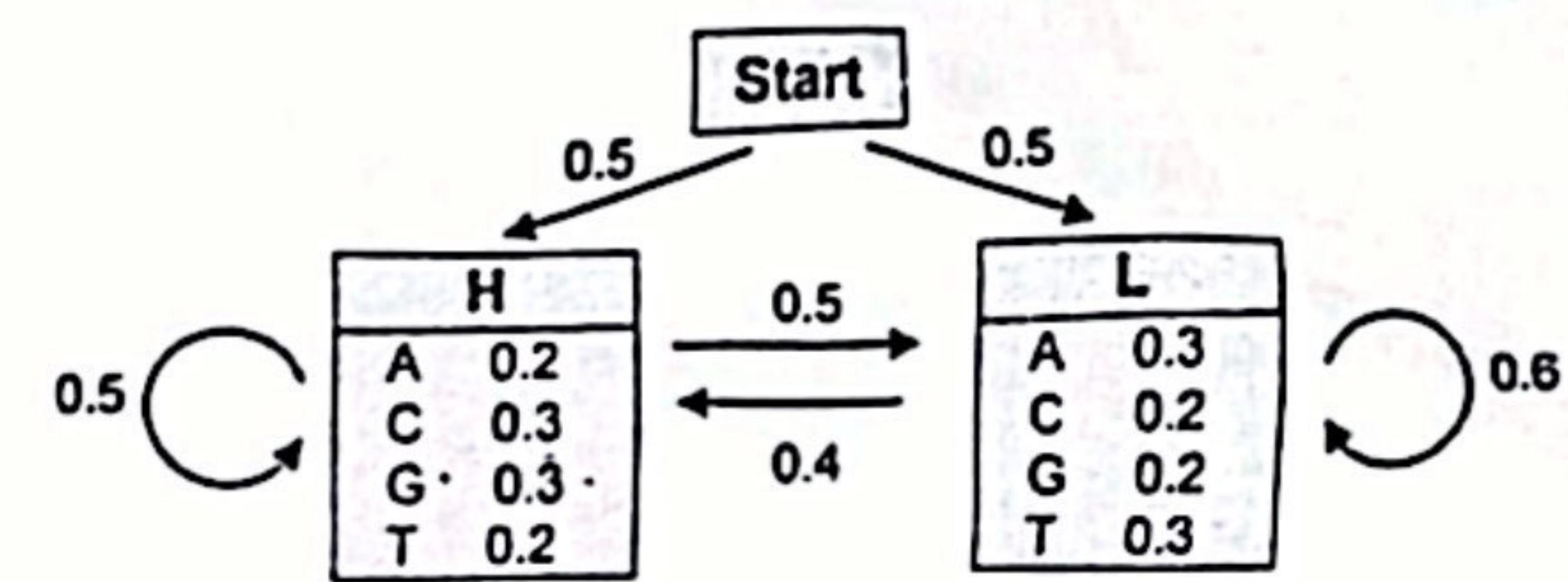
~~Here underfitting occurs for training as it doesn't fit that much but for testing it fits so well.~~

~~The wrong thing is that it also has high variance~~



Case: 2

1. [5points] Consider the Sequence, $S = \text{GGCA}$. There are several paths through the hidden states (H and L) that lead to the given sequence. Find the probabilities of getting outcomes (G, G,C,A) using the Forward Algorithm generating of the following combination. i) (H,L,L,H) ii) (H,H,L,L)

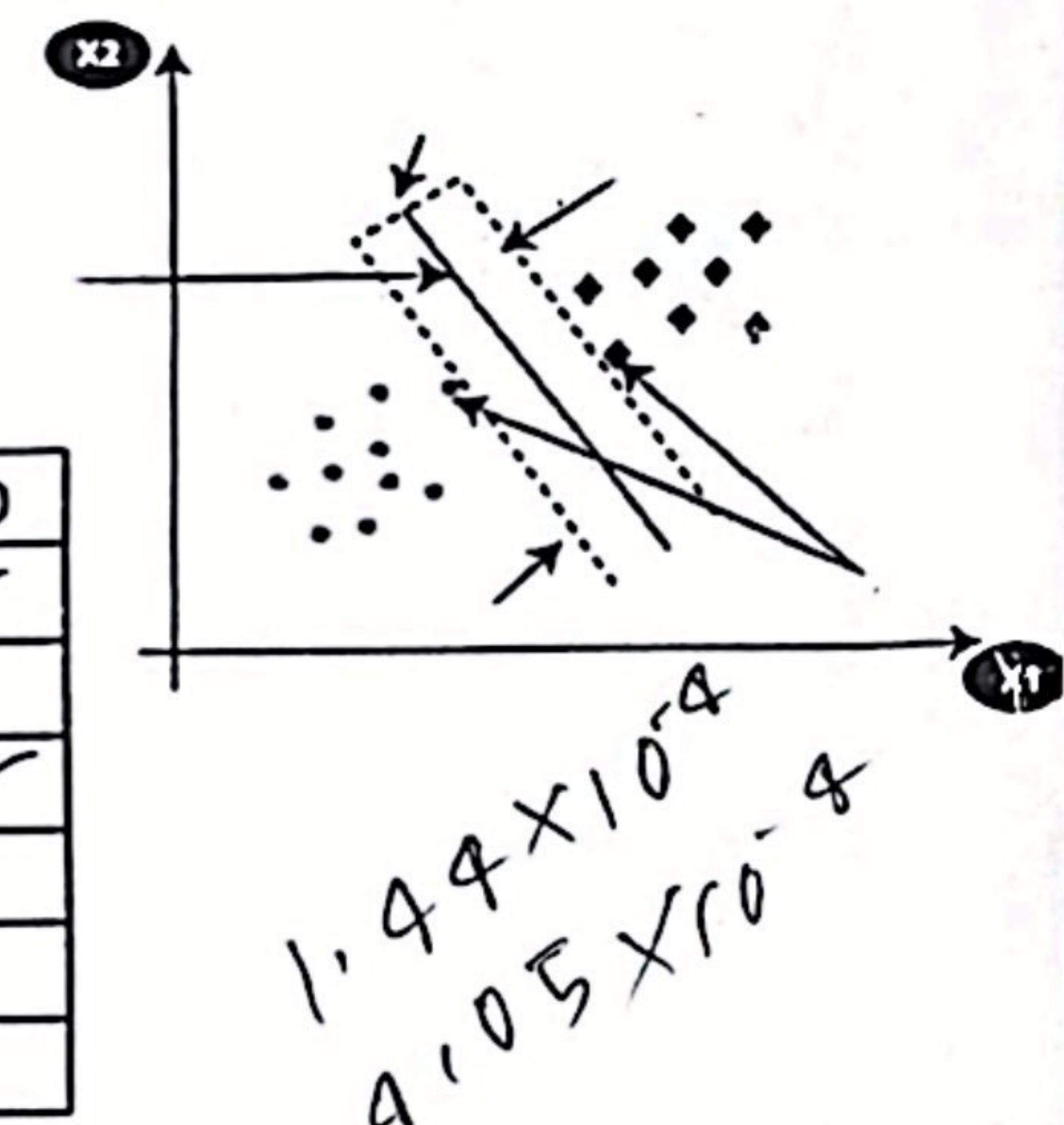


2. [5 points] While clustering analysis in Machine Learning, Inter-cluster distances are minimized and Intra-cluster distances are maximized,"- agree or disagree? Justify your answer.
3. [5 points] Identify the indicated arrow sign using the SVM algorithm from the following diagram. →

4. Given the following labeled dataset:
Determine the centers of the new clusters and show the clusters after the first epoch and the new centroids.

| EmployeeID | YearService | Income (K) |
|------------|-------------|------------|
| E01 | 4 | 9 ✓ |
| E02 | 8 | ④ |
| E03 | 2 | 10 ✓ |
| E04 | 5 | ⑧ |
| E05 | 6 | ⑥ |
| E06 | 7 | ⑦ |

Table 1



(3, 9, 5, 6, 7, 5, 2, 6)