



## 1. Pseudo-code for Genetic Algorithm

Genetic algorithm is population-based algorithm inspired by natural evolution.

(1) Initialize the population (randomly)

(2) Compute the fitness for each chromosome

(3) Pick the best-ranked individual to mate & replenish the population by applying

(a) cross-over operator

(b) Mutation operator

(4) Go to step-2 and repeat until the termination condition.

## 2. Motivation behind the development of Random-forest algorithm.

→ The essential idea of bagging is to average many noisy but unbiased model & hence reduce its variance.

→ Trees are ideal candidate for bagging because they can capture the complex interactions in data. And when they grow deep, they have low bias.

→ Trees are also very noisy & they can be averaged.

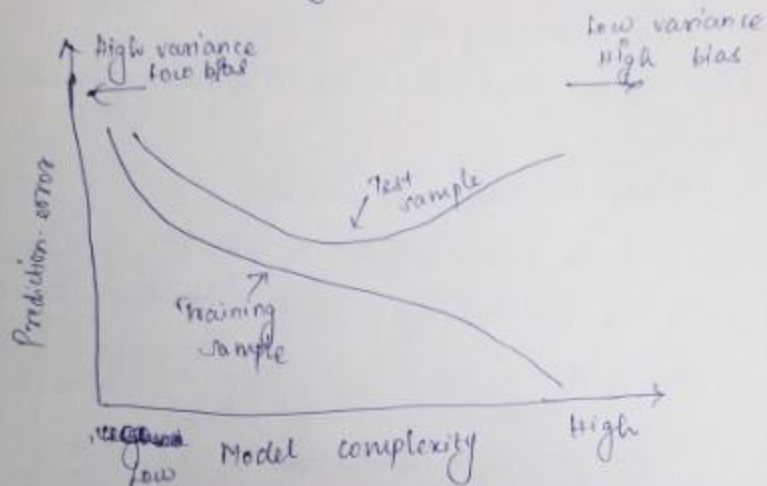
→ When the trees are generated in bagging they are ideally distributed.

→ So the expectation of average of  $B$  such trees is same as the expectation of average of each tree. Also the bias of bagged tree is same as the bias as one & the only hope of improvement is variance reduction.

→ Random forest algorithm is developed so that it can reduce the

variance ~~to~~ without disturbing the bias.

3 (a) figure to show relationship among model complexity, prediction error, bias, variance



(b) The relationship between MSE (Mean square error) & RSS (Residual sum of squares) is given by,

$$MSE = \frac{1}{N} RSS$$
 where  $N$  is the actual & prediction data pairs in RSS.

(c) Relationship between MSE, bias-error & variance error is given by,

$$MSE = (\text{bias-error})^2 + \text{variance-error}$$

4. When the utility matrix is given as

	HP1	HP2	HP3	7W	SW1	SW2	SW3
A	4			5	1		
B	5	5	4				
C			2	4	5		
D		3					

3

②

To compute the normalized rating, subtract each rating from average rating of that user.

So the utility matrix will become

	HP1	HP2	HP3	TV	SW1	SW2	SW3
A	$\frac{4}{3}$			$\frac{5}{3}$	$-\frac{7}{3}$		
B	$\frac{1}{3}$	$\frac{1}{3}$	$-\frac{2}{3}$				
C			$-\frac{5}{3}$	$\frac{1}{3}$	$\frac{4}{3}$		

$$\begin{aligned} \frac{4+5+1}{3} &= \frac{10}{3} \\ \frac{10}{3} - 4 &= \frac{10-12}{3} = -\frac{2}{3} \\ \frac{10}{3} - 5 &= \frac{10-15}{3} = -\frac{5}{3} \\ \frac{10}{3} - (-7) &= \frac{10+21}{3} = \frac{31}{3} \\ \frac{10}{3} - 1 &= \frac{10-3}{3} = \frac{7}{3} \\ \frac{10}{3} - (-2) &= \frac{10+6}{3} = \frac{16}{3} \end{aligned}$$

Now find the cosine distance between the vectors.

$$\text{for eg: } \cos(A, B) = \frac{A \cdot B}{\|A\| \|B\|} = \frac{\frac{4}{3} \cdot \frac{1}{3}}{\sqrt{(\frac{4}{3})^2 + (\frac{5}{3})^2 + (-\frac{7}{3})^2} \sqrt{(\frac{1}{3})^2 + (\frac{1}{3})^2 + (-\frac{2}{3})^2}}$$

$$\cos(A, C) = \frac{\frac{5}{3} \cdot \frac{1}{3} + (-\frac{7}{3}) \cdot (\frac{4}{3})}{\sqrt{(\frac{5}{3})^2 + (\frac{1}{3})^2 + (-\frac{7}{3})^2} \sqrt{(-\frac{5}{3})^2 + (\frac{1}{3})^2 + (\frac{4}{3})^2}}$$

for  $\cos(A, B) = 51$  gives +ve value

$\cos(A, C) = 91$  gives -ve value

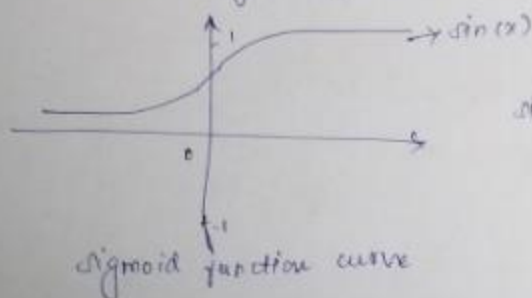
It shows that even though A, C have watched 2 movies in common but they have difference in opinion.  
And A & B watched one movie in common & rated

similarly

Thus normalized cosine rating helps in finding the similarity measure.

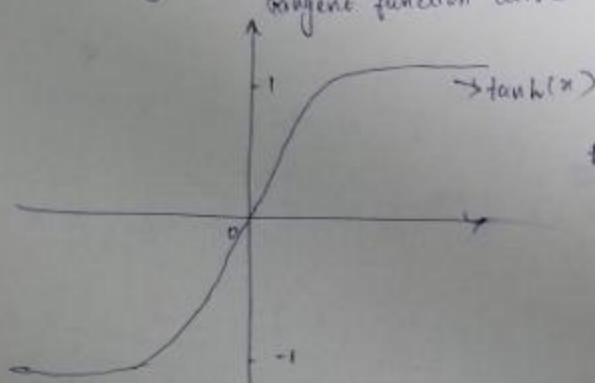
(3)

5. characteristic curve (a) sigmoid function



$$\text{sigmoid}(x) = \frac{1}{1 + e^{-x}}$$

(b) hyperbolic tangent function



$$\tanh(x) = \frac{e^x - e^{-x}}{e^x + e^{-x}}$$

also select

6. Pros of content-based recommender sys

→ No need for data of other users so there will be no cold-start or sparsity problem.

→ Able to recommend new or unpopular items (No first rater problem).

→ Able to recommend to users with a unique taste.

→ Able to provide explanations by listing the features of an item & why it is recommended.

(4)



Conc

→ Not able to find appropriate feature (for images, videos).

→ Overspecitization

Unable to recommend an item outside the user's profile because users have many preferences.

unable to exploit the quality judgement of other users.

→ Do not know how to build profile for new users & what to recommend for them.

7. vector equation for given ANN.

$$z^{(1)} = x$$

$$\tau^{(2)} = \beta^{(1)T} z^{(1)}$$

$$z^{(2)} = \text{sig} \cdot \tau^{(2)} \text{ \& add } z_0^{(2)}$$

$$\tau^{(3)} = \beta^{(2)T} z^{(2)}$$

$$z^{(3)} = \text{sig} \cdot \tau^{(3)} \text{ \& add } z_0^{(3)}$$

$$\tau^{(4)} = \beta^{(3)T} z^{(3)}$$

$$z^{(4)} = \hat{y} = \text{sig} \cdot \tau^{(4)}$$

8. steps for k-fold cross validation for model selection

(1) randomly split the dataset into  $k$  disjoint subsets  $D_1, D_2, \dots, D_k$ .

(2) For  $V_i$ , model  $M_i$  is

for  $j = 1$  to  $k$

(1) train the model  $M_i$  using data  $(D - D_j)$  & get the predictor  $P_{ij}$

(2) Test  $P_{ij}$  & get the error,  $E_{ij}$

End for  $j$

⑤

$E_i$  = average error of  $E_{ij}$  which is the generalized error for model  $M_i$ .

(3) Find the best model  $M_i$  with the lowest generalized error  $E_i$

(4) Retrain model  $M_i$  = best using full dataset  $D$ .

9. steps used for prediction using SVM

(1) convert data into the format of SVM package

(2) Conduct simple scaling on the data.

(3) Consider the RBF ~~key~~ kernel  $K(x, y) = \exp(-\gamma \|x - y\|^2)$

(4) Use the cross-fold validation to find parameters  $C$  &  $\gamma$ .

(5) Use the best parameters  $C$  &  $\gamma$  to train the dataset.

(6) Test.

10. Non-deterministic algorithms

(1) Artificial Bee Colony

(2) Bat Algorithm

(3) Firefly Algorithm

(4) Monkey Algorithm

(5) Social Spider Algorithm

(6) Cuckoo Search Algorithm