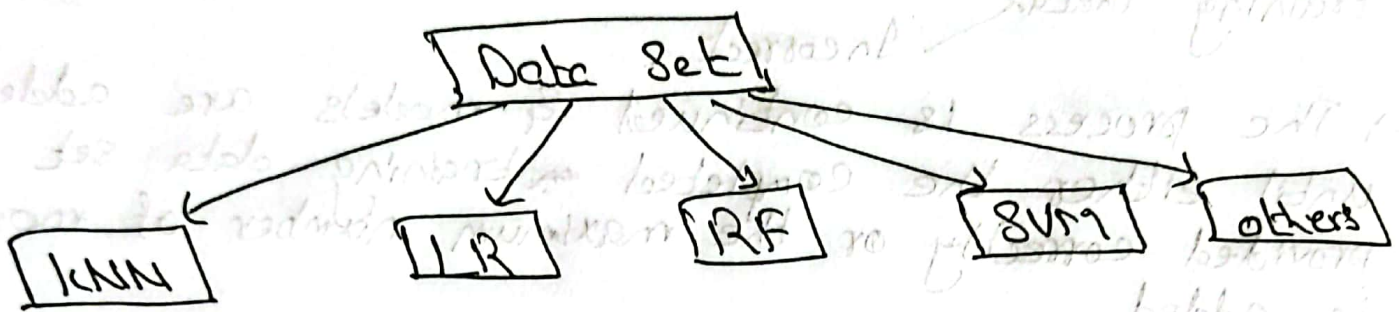


Ensemble Abgos

(Lecture 7)

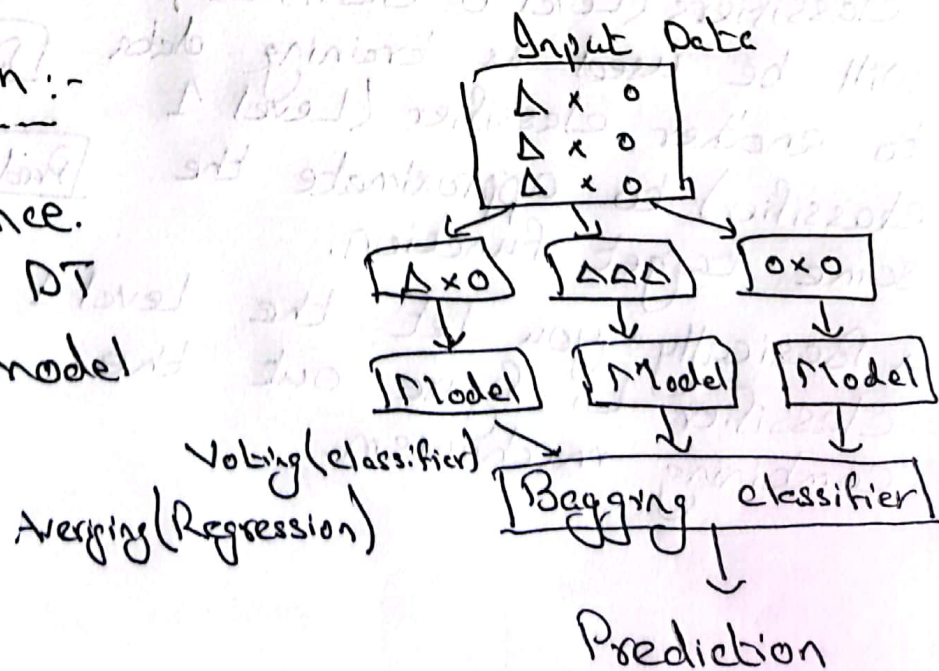
- Ensemble Learning is consensus based learning or algorithm. For example multiple Decision trees or a combination of different algos.
- This is to overcome an individual weak algo (such as DT's) algo's weakness. For example DT's have a problem of overfitting.



- Four different techniques Aggregating (bagging):
- 1) Bootstrap
 - 2) Boosting
 - 3) Stacking
 - 4) Voting

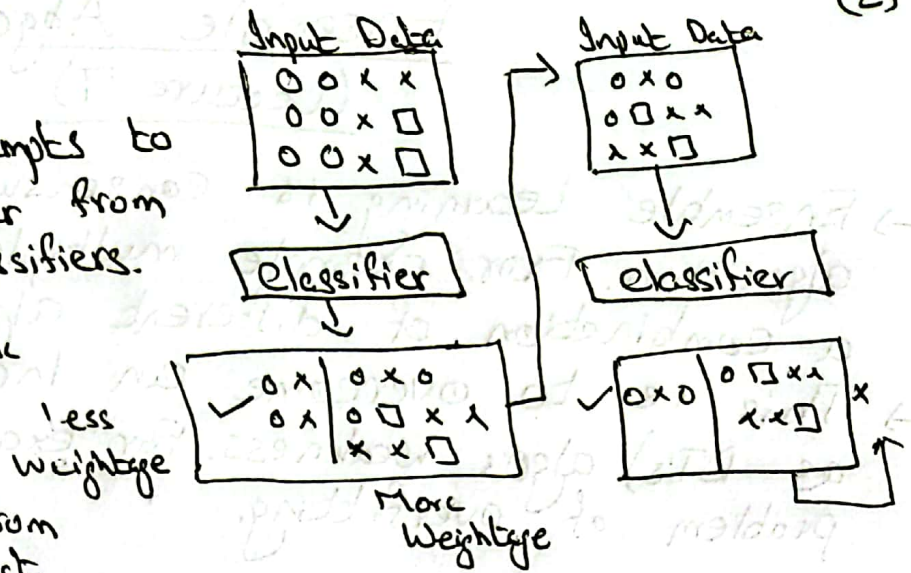
Bootstrap Aggregation :-

- It decreases variance.
- Usually applied to DT
- Special case of model averaging approach.



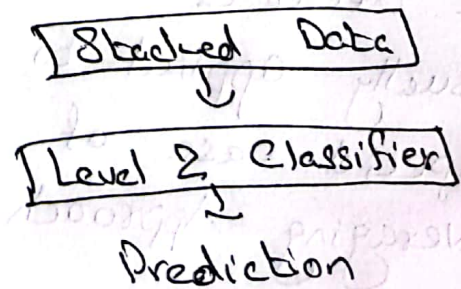
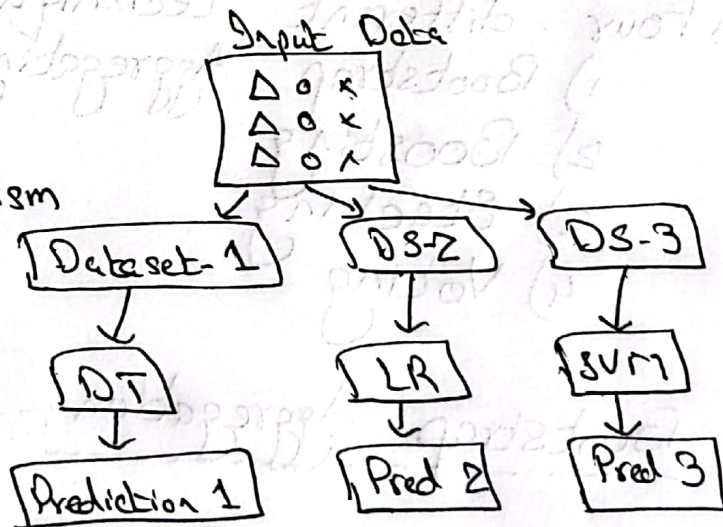
Boosting:-

- Technique that attempts to build a strong classifier from a number of weak classifiers.
- Made by using weak models in series.
- A model is build from training data
 - Correct
 - Incorrect
- The process is continued & models are added until either the completed training data set is provided correctly or the maximum number of models is added.



Stacking, Bleeding:-

- Unlike traditional ensemble learning, the combined mechanism is that the output of classifiers (Level 0 classifiers) will be used as training data to another classifier (Level 1 classifier) to approximate the same target function.
- Basically you let the classifier to figure out the combining mechanism.

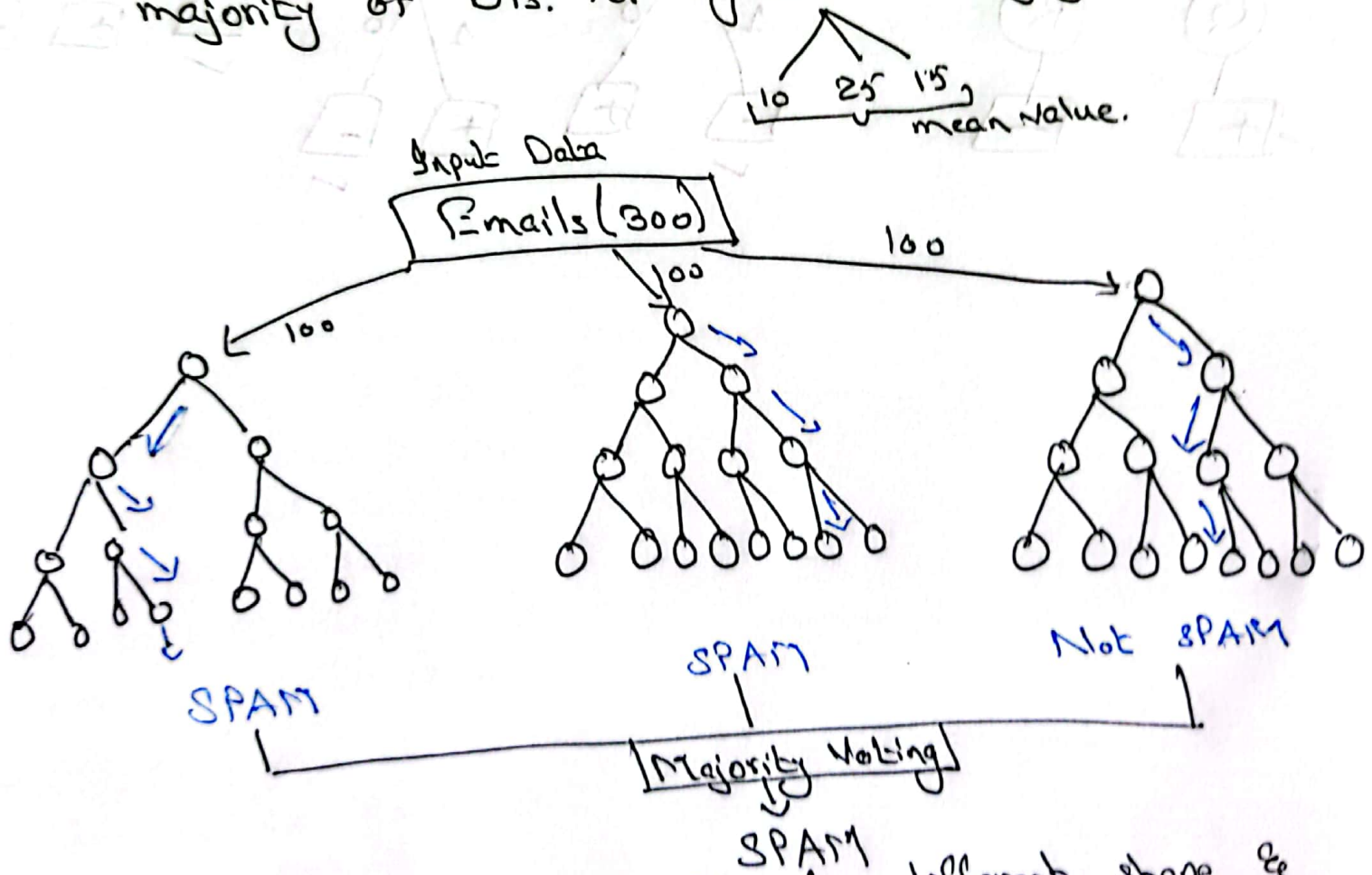


Random Forest:-

- RF is an extension of DT to counter shortcomings in DT
- RF is an ensemble learning technique method, and is used for both classification & regression. However it is more accurate for classification.

→ Steps

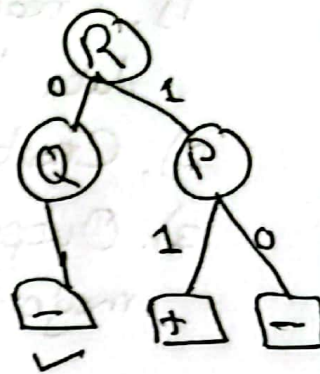
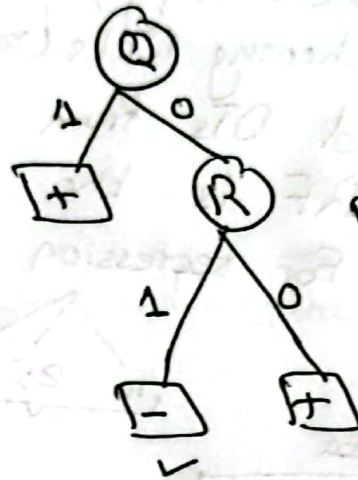
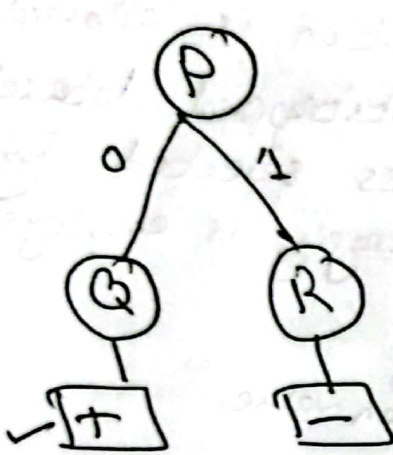
- 1). Create Bootstrap (randomly) Dataset from original data by randomly choosing data (repetition is allowed).
- 2). Create randomized DTs from bootstrapped dataset.
- 3). Output of the RF is the class selected by majority of DTs. For regression averaging is employed.



- RF consists of multiple DTs of different shape & size.
- Random data leads to random nodes of DTs.
- 'n' number of Bootstrap samples for 'n' number of DTs.

ID	P	Q	R	class
20	0	0	1	+
21	1	0	0	-
22	2	0	0	-
23	1	1	2	+

ID	P	Q	R	class
20	0	0	1	+
22	2	0	0	-
20	0	0	1	+
22	2	0	0	-



(100%)

Random data leads to random nodes of DT.
 A large number of bootstrap samples for DT.
 DT consists of multiple DTs of different size.
 DTs are combined to form a single DT.