

- ① RF
- ② Stacking
- ③ Practical of Bagging, RF, Stacking

Boosting ← tomorrow

Bootstrapping ⇒ Way for Sampling

- ① Row Sampling
- ② Column Sampling
- ③ Row + Col

{ With replacement,  
Without replacement }

<u>Weight</u>	<u>Height</u>	<u>Gender</u>	<u>Obtained</u>
65	120	F	NO
70	125	F	0
75	185	M	NO
80	160	F	NO
91	190	M	0

① With replacement

Sample 1 ⇒ 1, 3  
Sample 2 ⇒ 3, 4  
Sample 3 ⇒ 1, 2

might be repeated

Repeated

Data is getting repeated.

② Without replacement

Sample 1 ⇒ 3, 4  
Sample 2 ⇒ 1  
Sample 3 ⇒ 2, 5

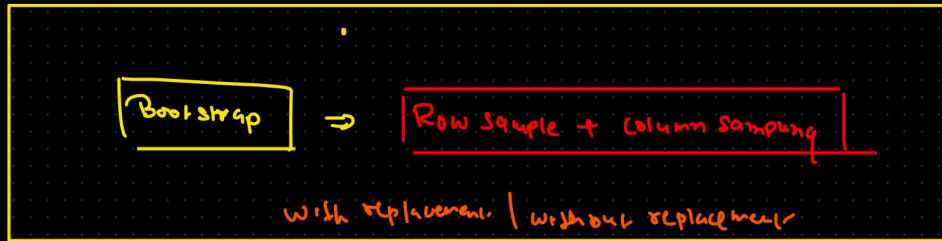
Row Sampling ⇒ { We are taking a Sample from the Row  
but in every sample we are going to take  
the entire col. }

Sample 1, 2, 3 ⇒ Column (W, H, G, O)  
Sample 2, 1, 3, 5 ⇒ Column (W, H, G, O)  
Sample 3, 2, 1, 4 ⇒ Column (W, H, G, O)

Column Sampling  $\Rightarrow$  { All the rows  
and subset of the column }

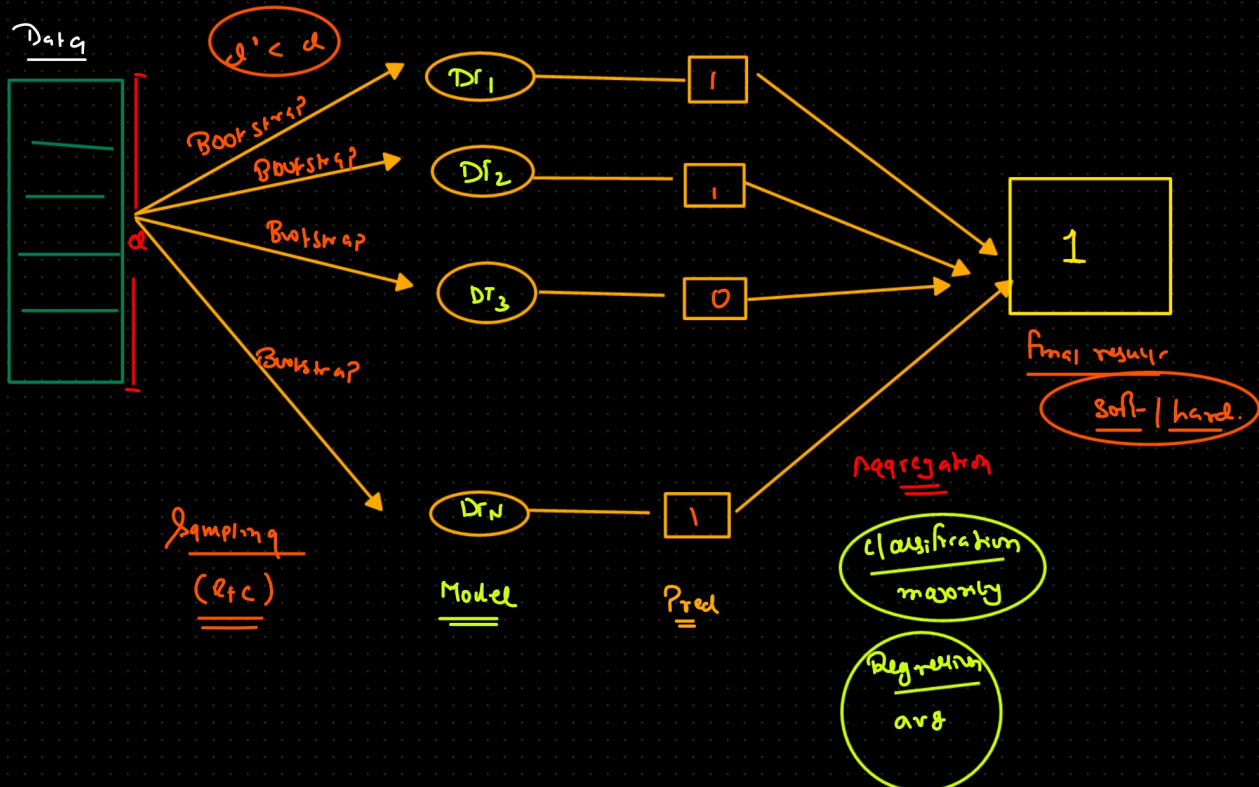
Sample 1  $\Rightarrow$  5 (subset of column)

Sample 2  $\Rightarrow$  5 (subset of the col)



Random forest  $\Rightarrow$  Special case of the bagging  
where by default we are using OR

$$\underline{RF} = \underline{Bootstrap} + \underline{Agg}$$



## Random forest



Bootstrap = ✓ Sample of the data  
✓  $(R+C)$

✓ With replacement or without repla.

## Bagging

- ① It is Parallel
- ② Bootstrap + aggregation
- ③ It is a homogenous technique  
└ Same model only