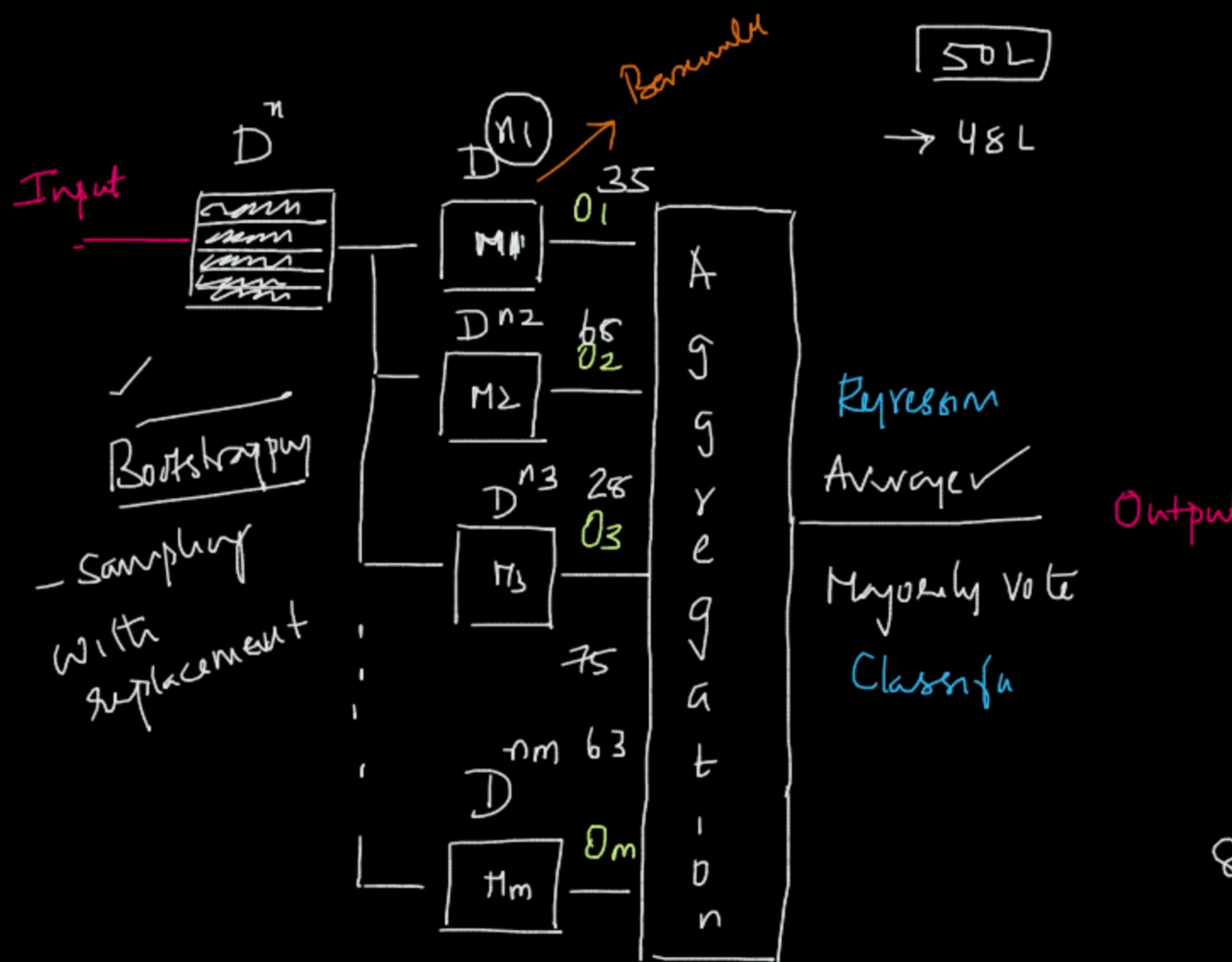


Ensemble

- Bagging ✓
- Boosting

Bagging - Bootstrapped Aggregation



$M_1, M_2, M_3, \dots, M_m \rightarrow$  Base Model

Bagging Reduces Variance

Base Models  $\rightarrow$  High Variance + Low Bias ↓

→ Low Bias & Low Variance Model

5 Experts  $\rightarrow$  1 perfm BTM  $\rightarrow$  Acc =  $\frac{99}{100} = 99\%$

$\rightarrow$  2 perfm Indiv  $\rightarrow$  70 ✓

$99 \rightarrow$  3 perfm Blas  $\rightarrow$  78

4 perfm Avgp - 81

5 perfm Ydm - 68

$D^{\text{Input}}$

$M_1 \rightarrow \text{ymph pred} <$

$D_1$	$M_1$
$D_2$	$M_2$
$D_3$	$M_3$
$D_4$	$M_4$
$D_5$	$M_5$

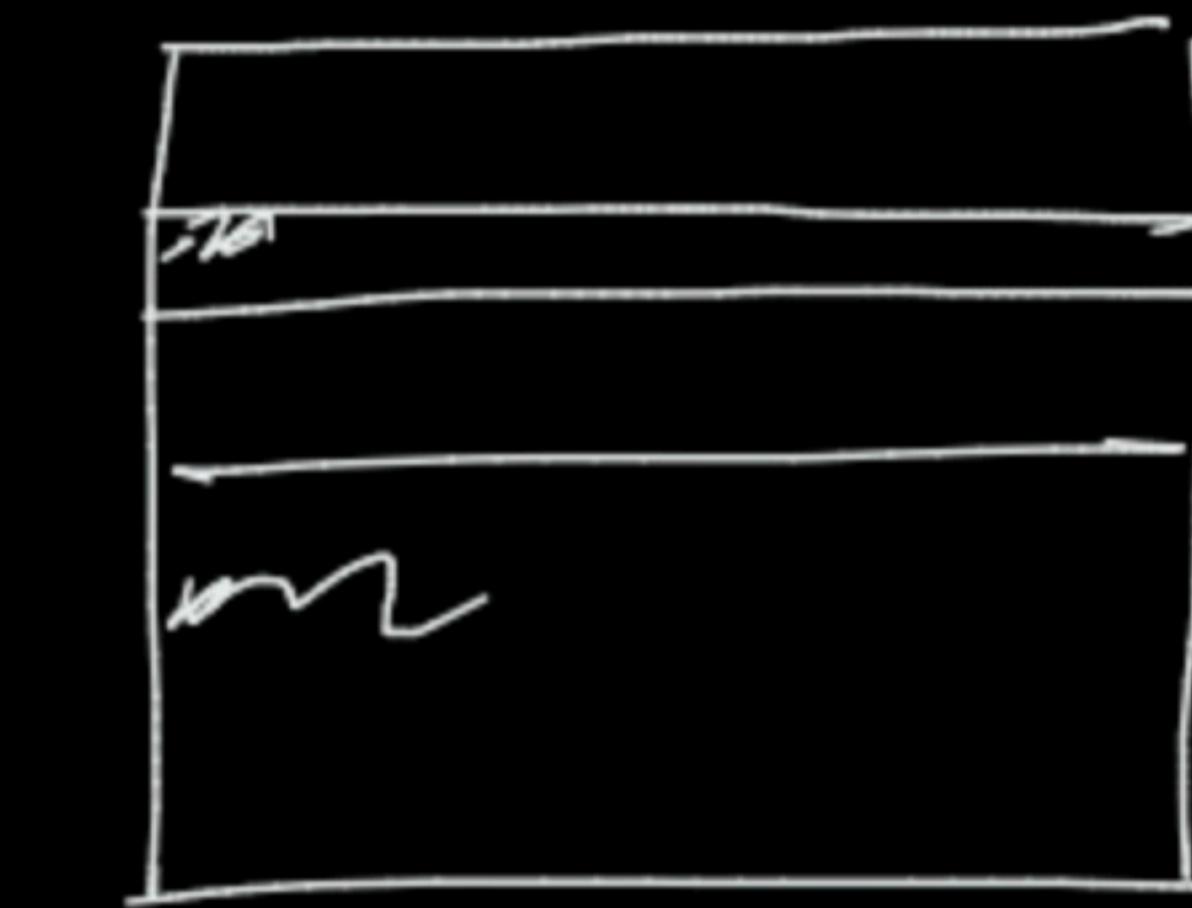
$M_5 \rightarrow M_2 \rightarrow$

99      99

3 Top

$M_1 \rightarrow M_2$

$B_{\text{bias}} = 0$



Decom Tree  $\rightarrow$  Max-Depth = 64

✓  
Low Bias +  
Low Var

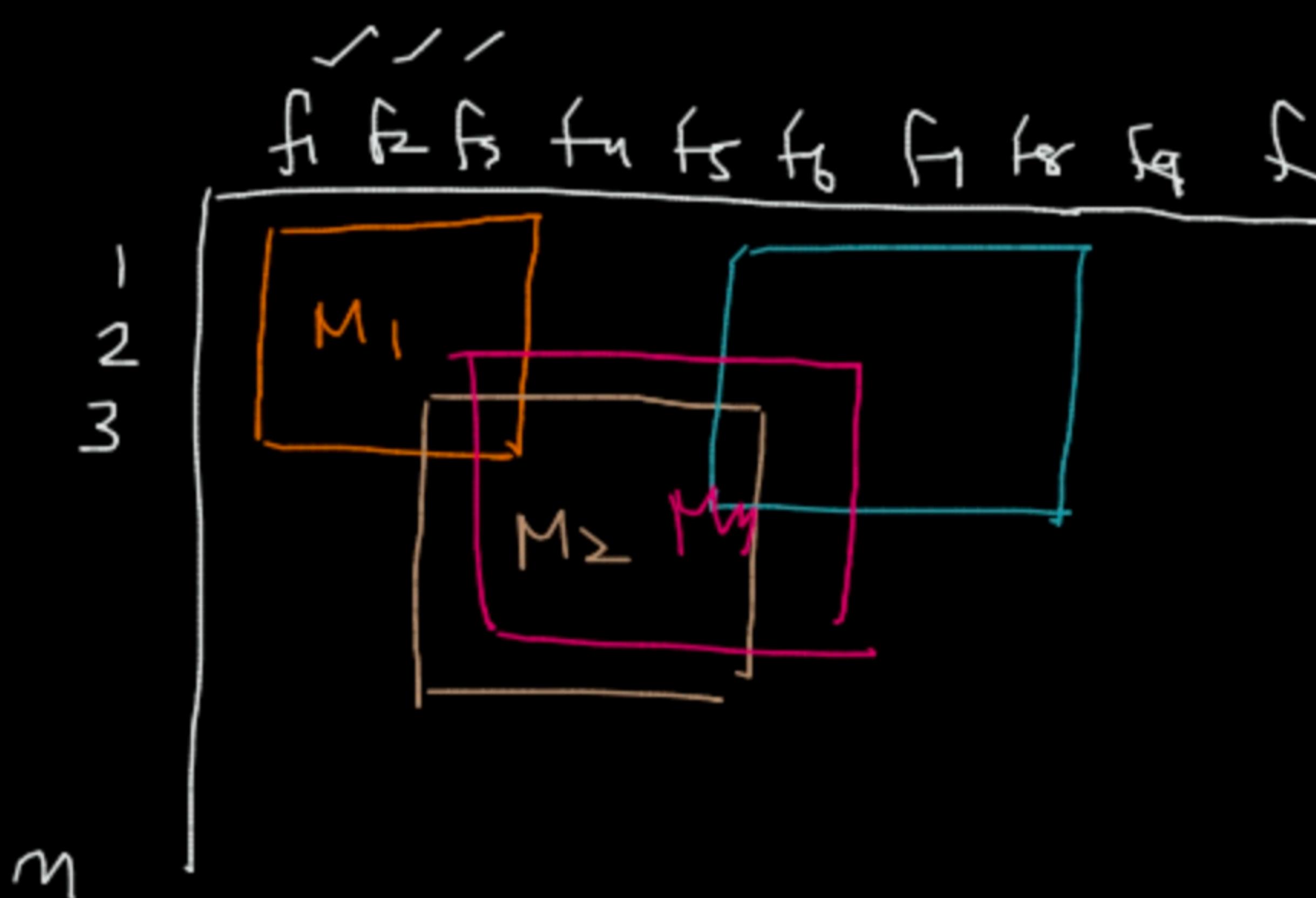
$B_{\text{bias}} = 0 \rightarrow \text{Var name} \rightarrow$

$M_1$   
 $M_2$

# Random Forest

- All base models are DTree
- Row Sampling + Column Sampling

1000 Rows  $\rightarrow$  200 Rows



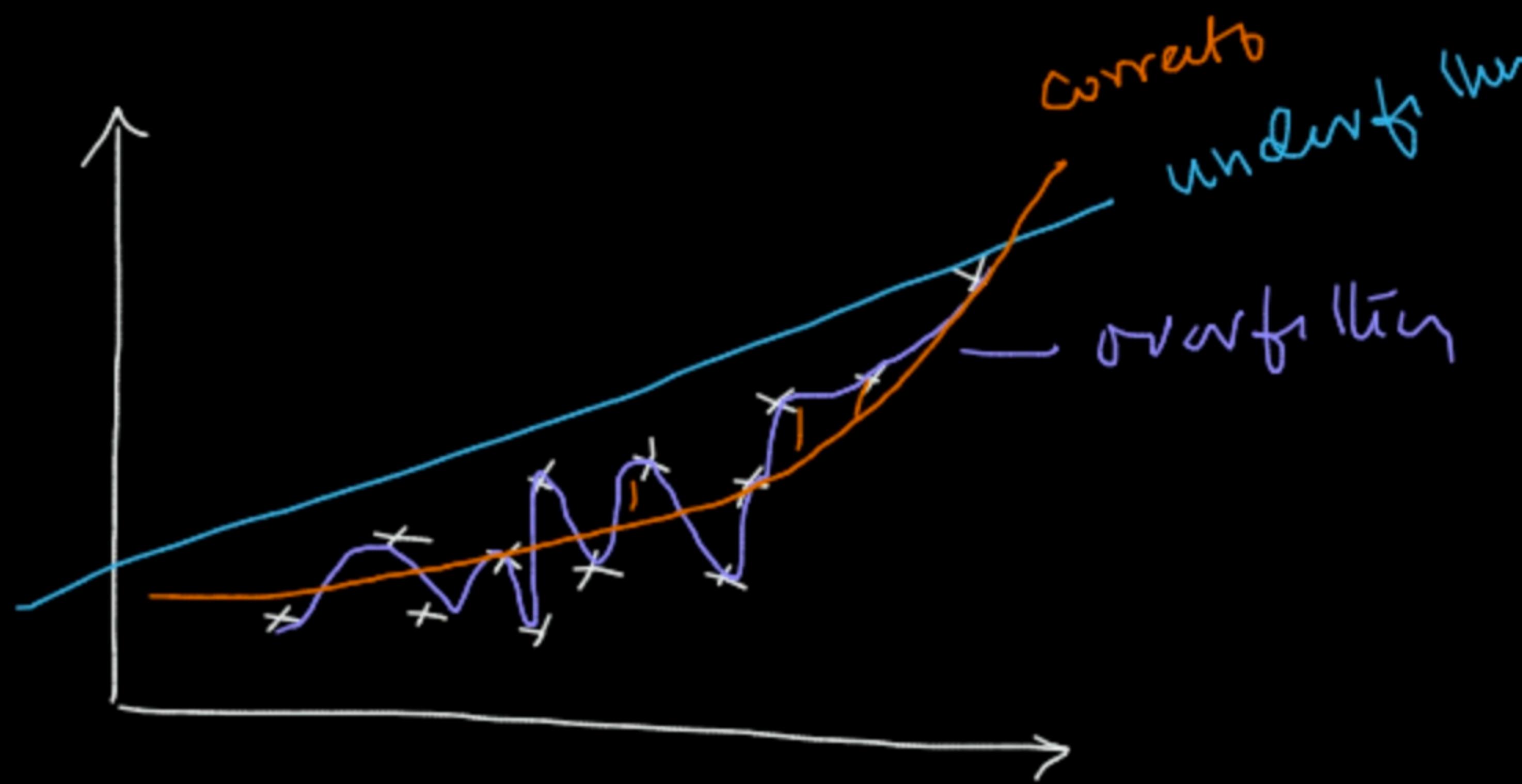
$f_1 f_2 f_3 \rightarrow M_1$

$f_4 f_5 f_6 \rightarrow M_2$

$f_7 f_8 f_9 \rightarrow M_3$

$f_1 f_2 f_3 f_4 - f_{10} y$

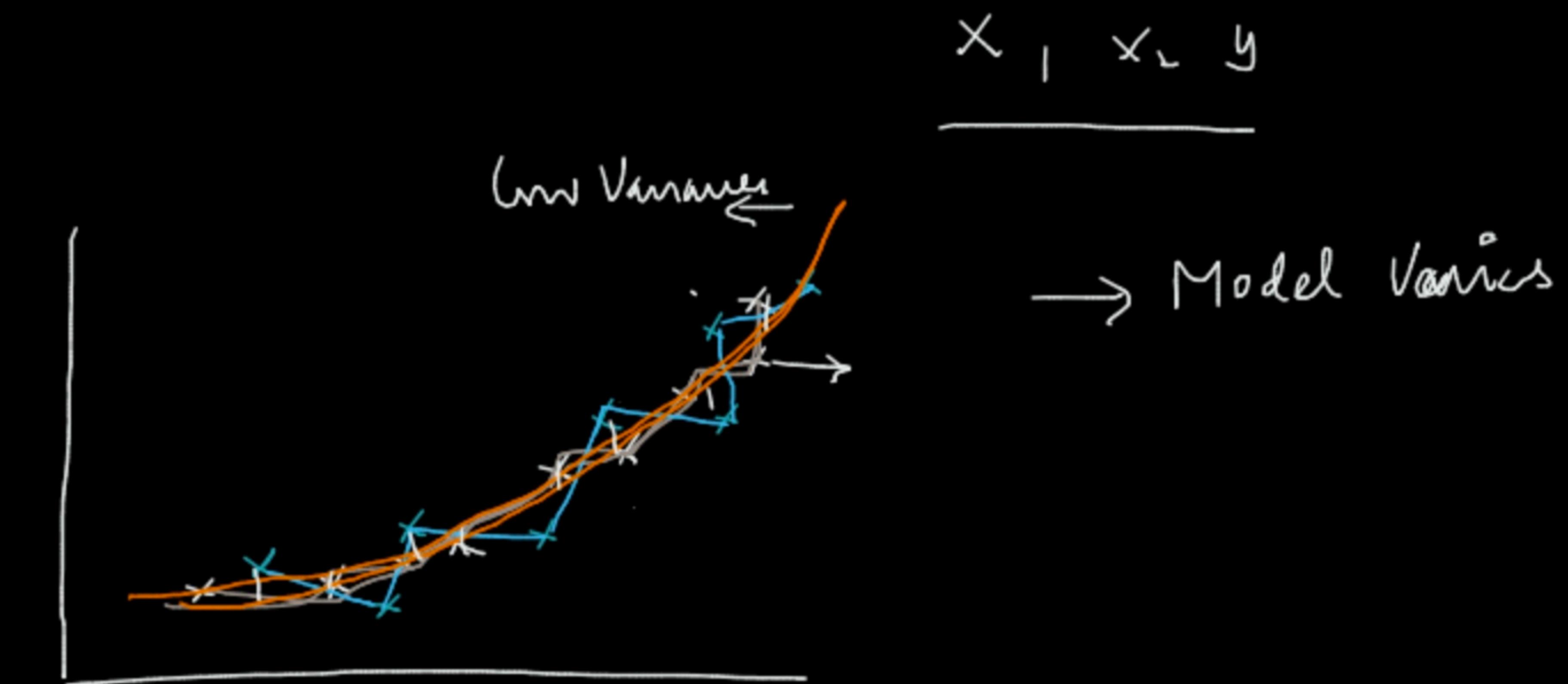
Super Class

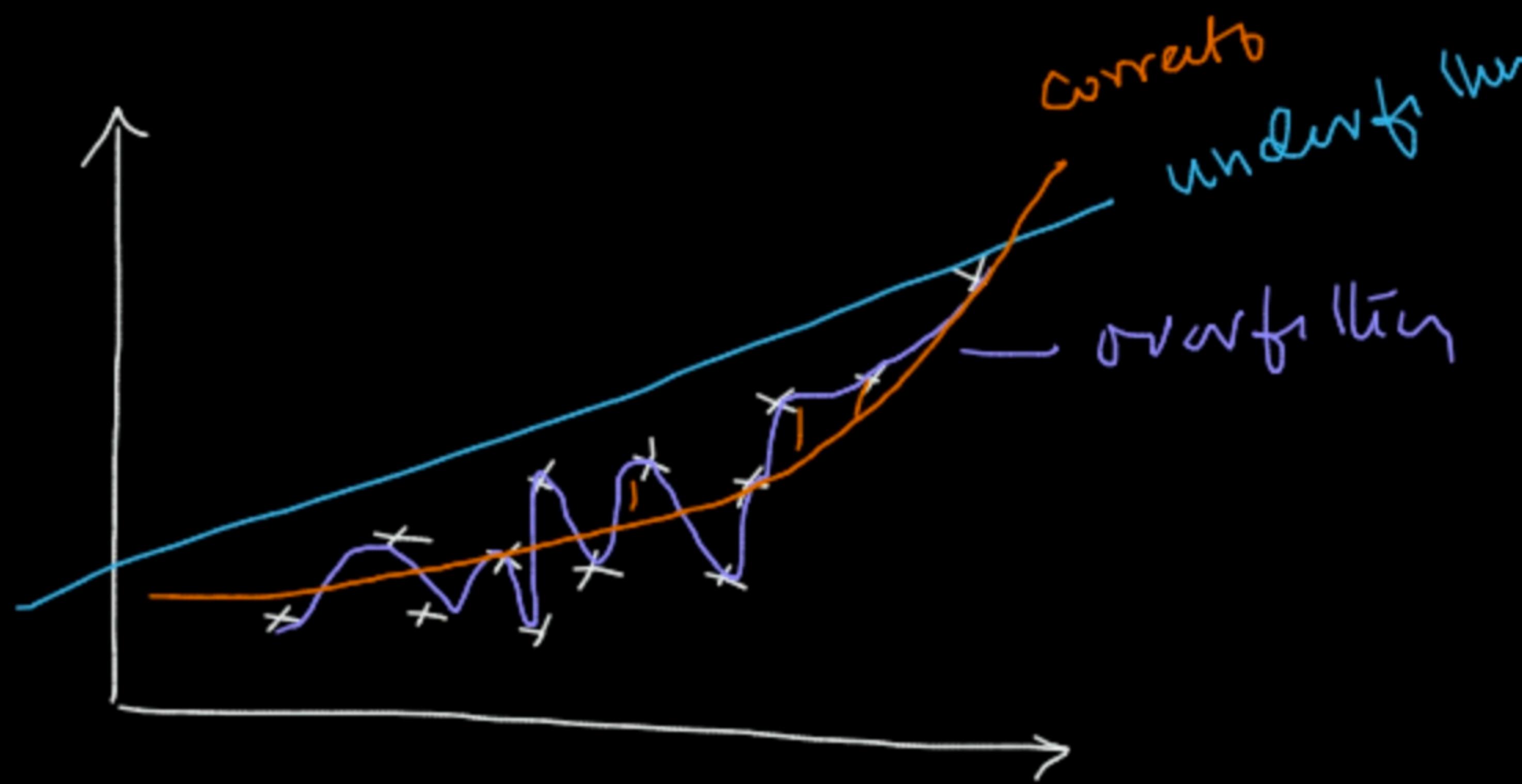


$\downarrow \text{Bias} \uparrow$     $\text{Variance} \uparrow \downarrow$



$\tilde{\text{Ensemble}} \rightarrow$





$\downarrow \text{Bias} \uparrow$     $\text{Variance} \uparrow \downarrow$



$\tilde{\text{Ensemble}} \rightarrow$

