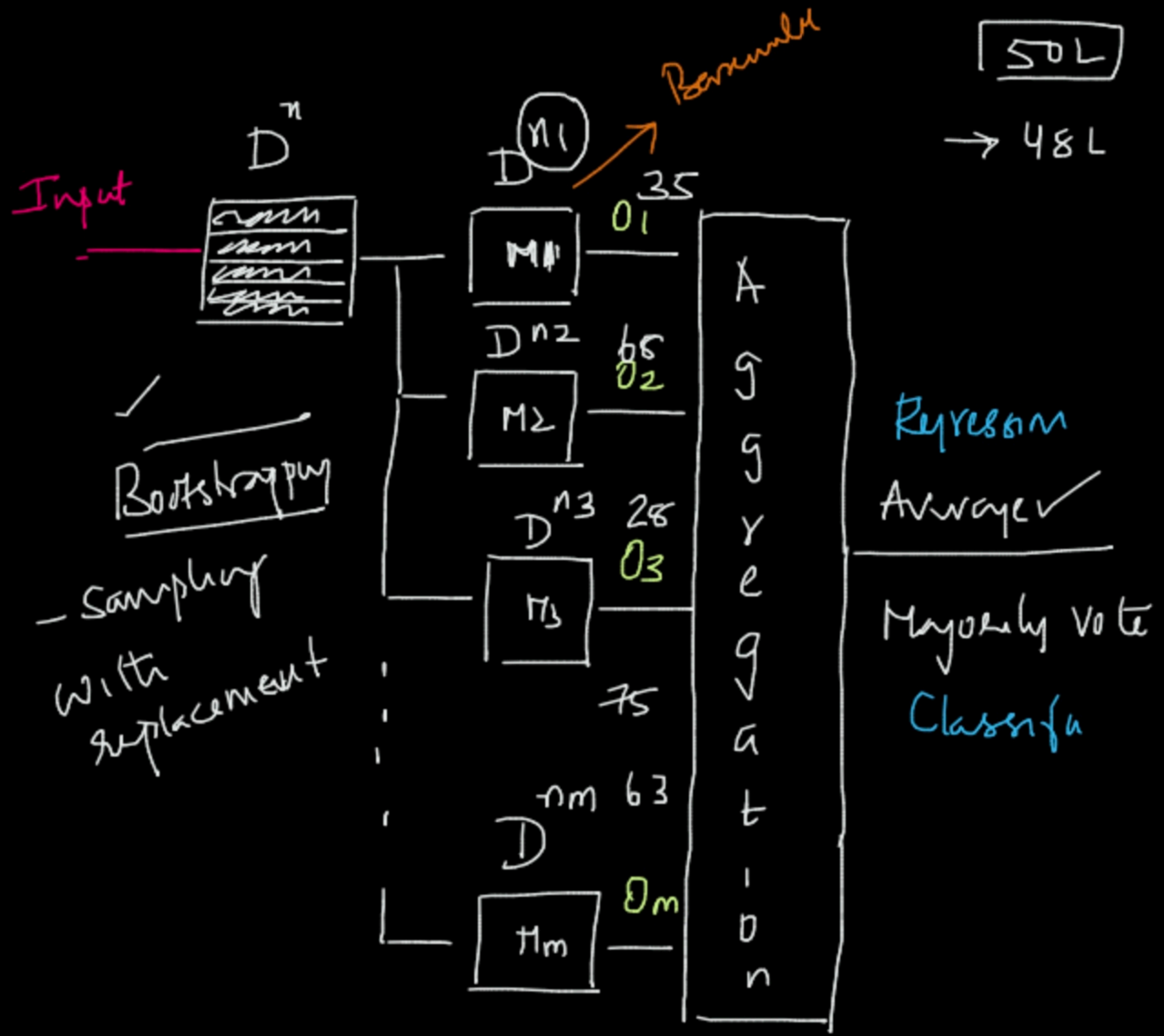


Ensemble

- Bagging ✓
- Boosting

Bagging - Bootstrapped Aggregation

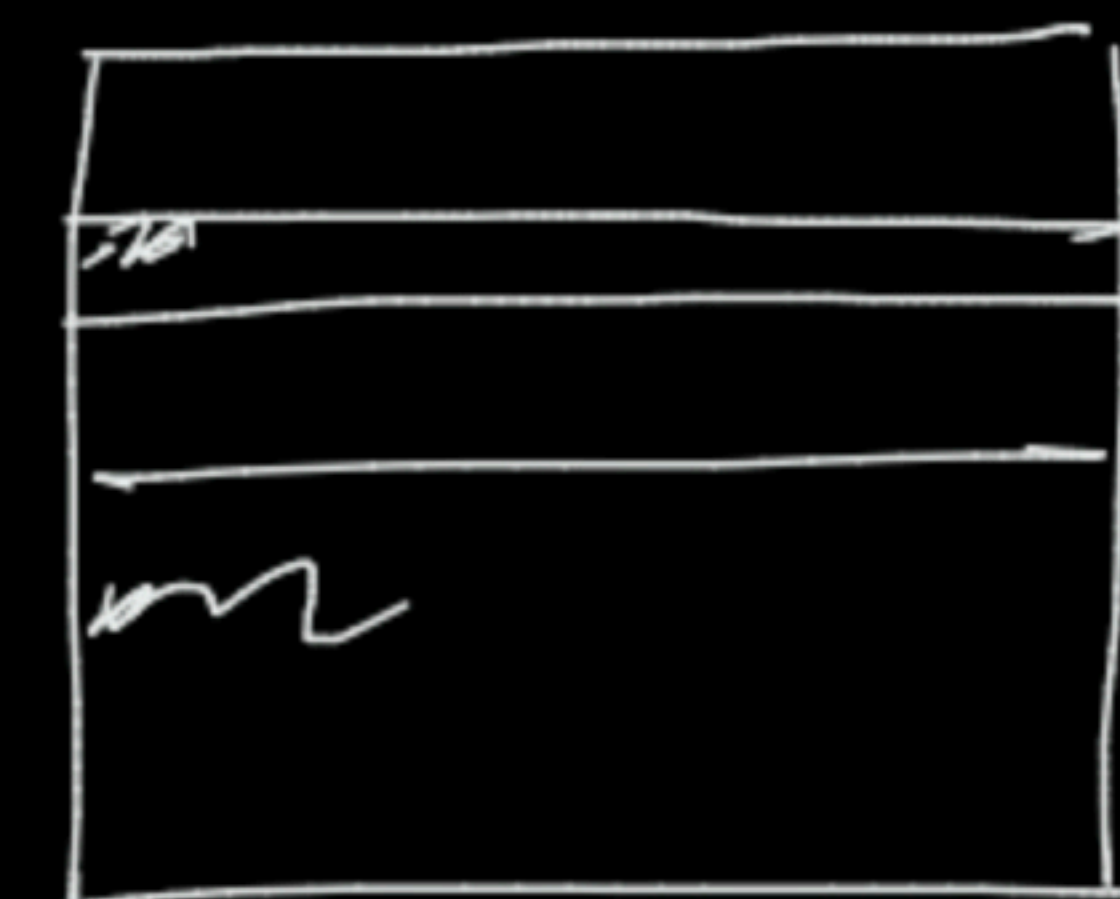
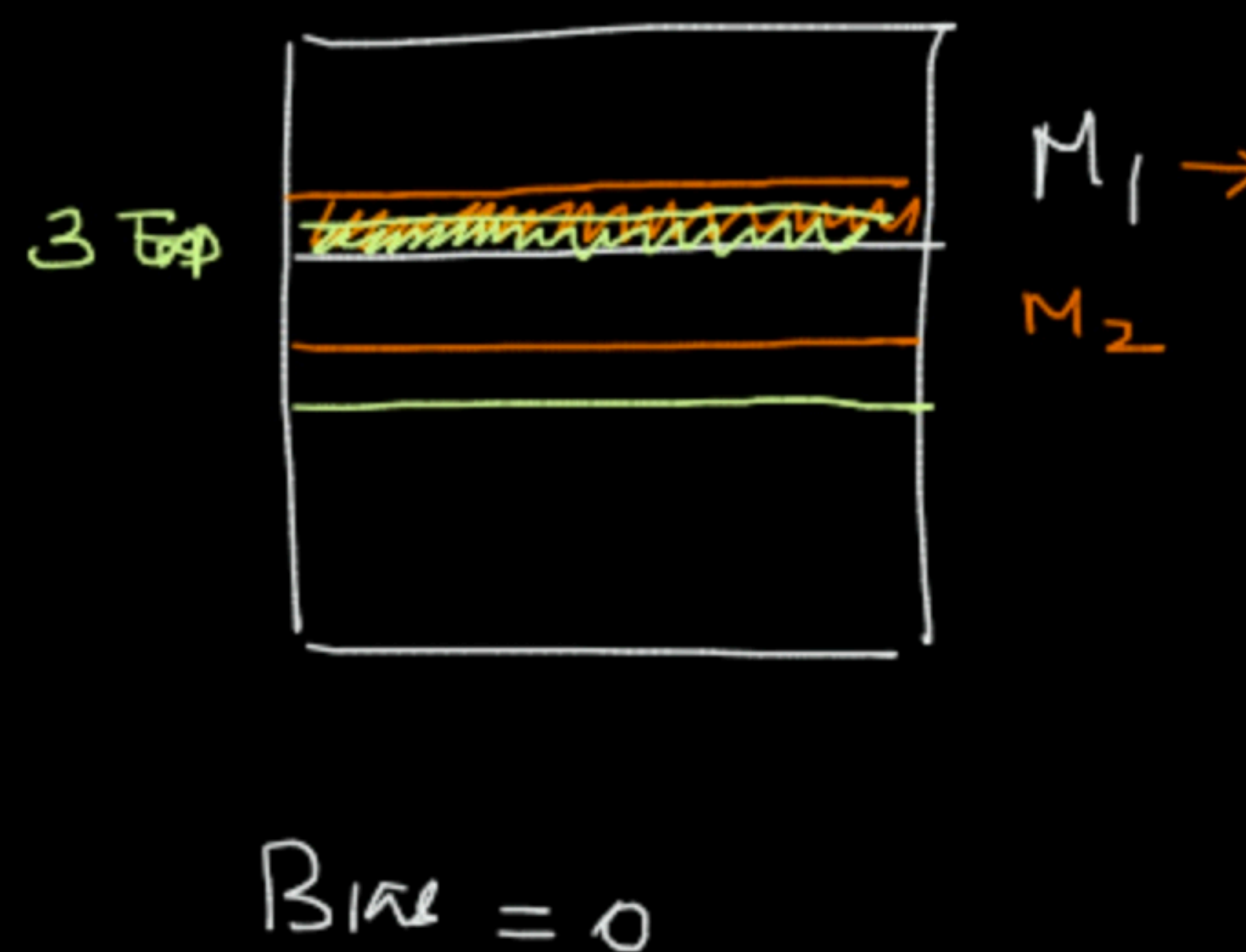
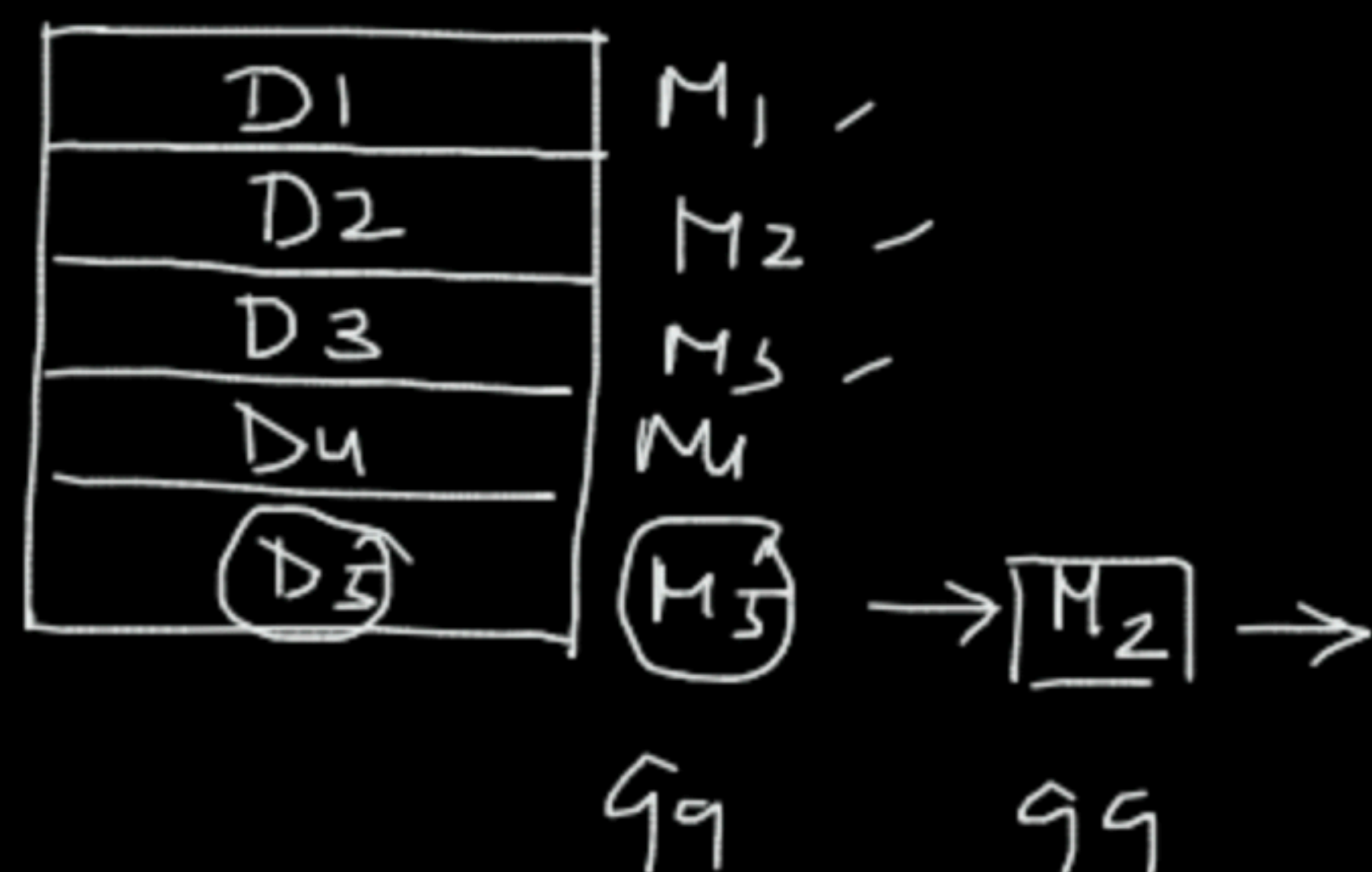
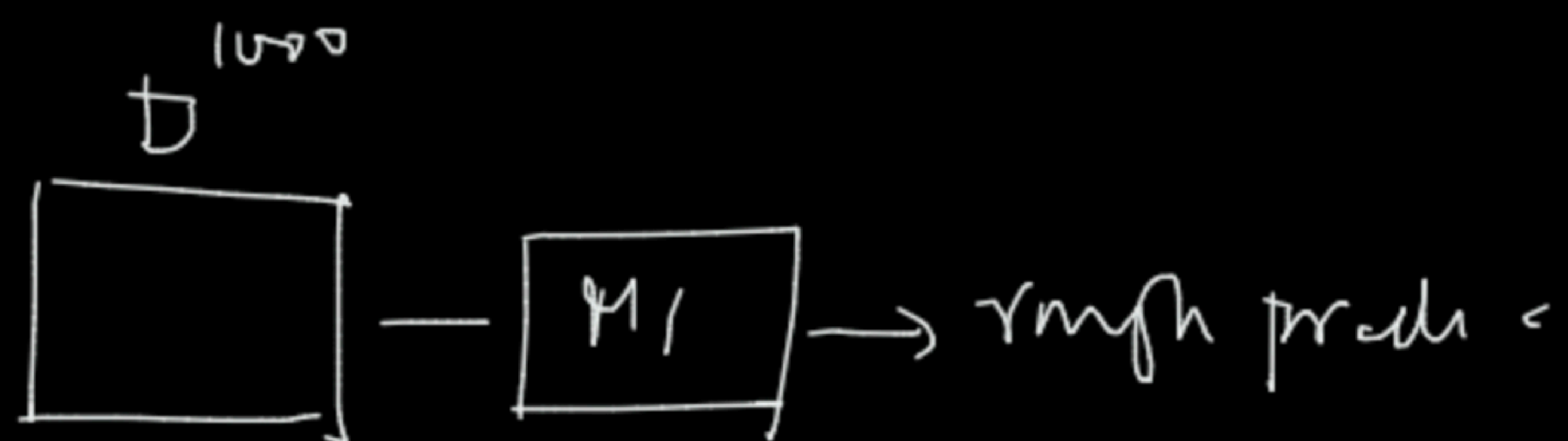


$M_1, M_2, M_3, \dots, M_m \rightarrow$ Base Model

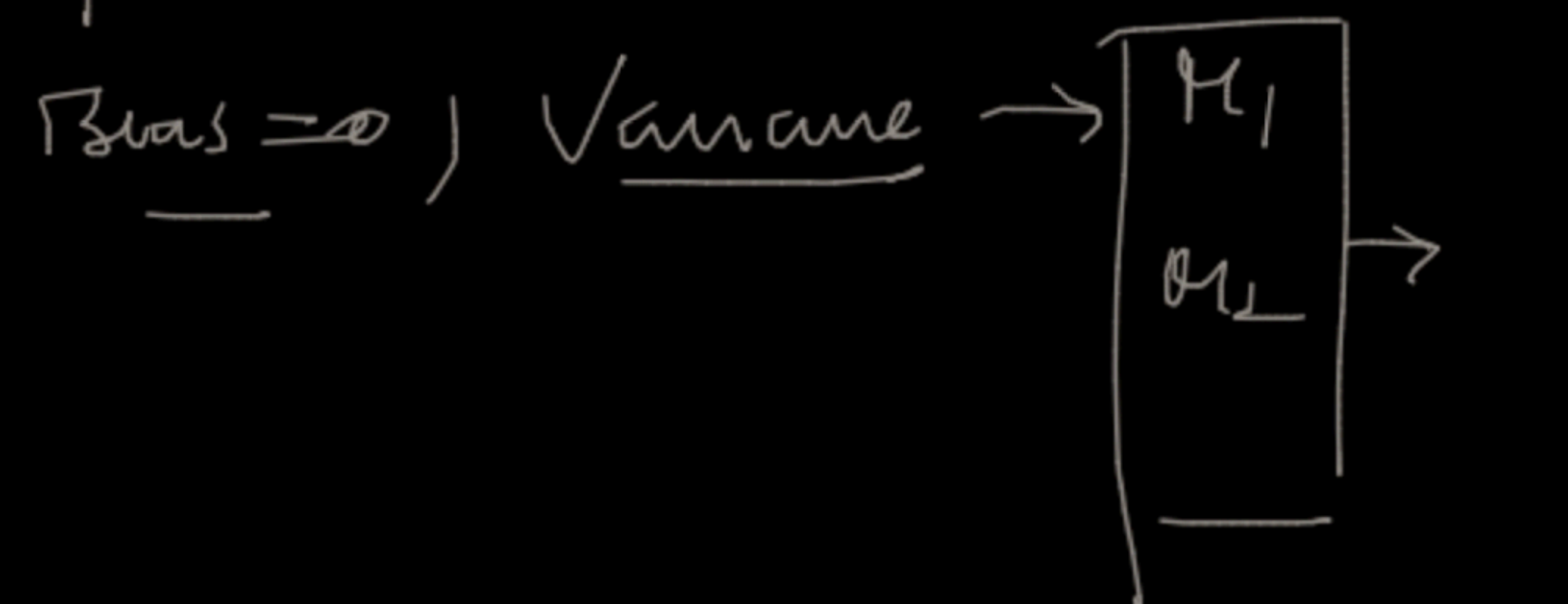
Bagging reduces Variance

Base Models \rightarrow High Variance + Low Bias \downarrow
 \rightarrow Low Bias & Low Variance Model

5 Experts \rightarrow 1 person BTM \rightarrow Acc = 99%
 \rightarrow 2 person Indiv \rightarrow 70 ✓
 \rightarrow 3 person Plur \rightarrow 78
 \rightarrow 4 person Avrp \rightarrow 81
 \rightarrow 5 person Jdm \rightarrow 68



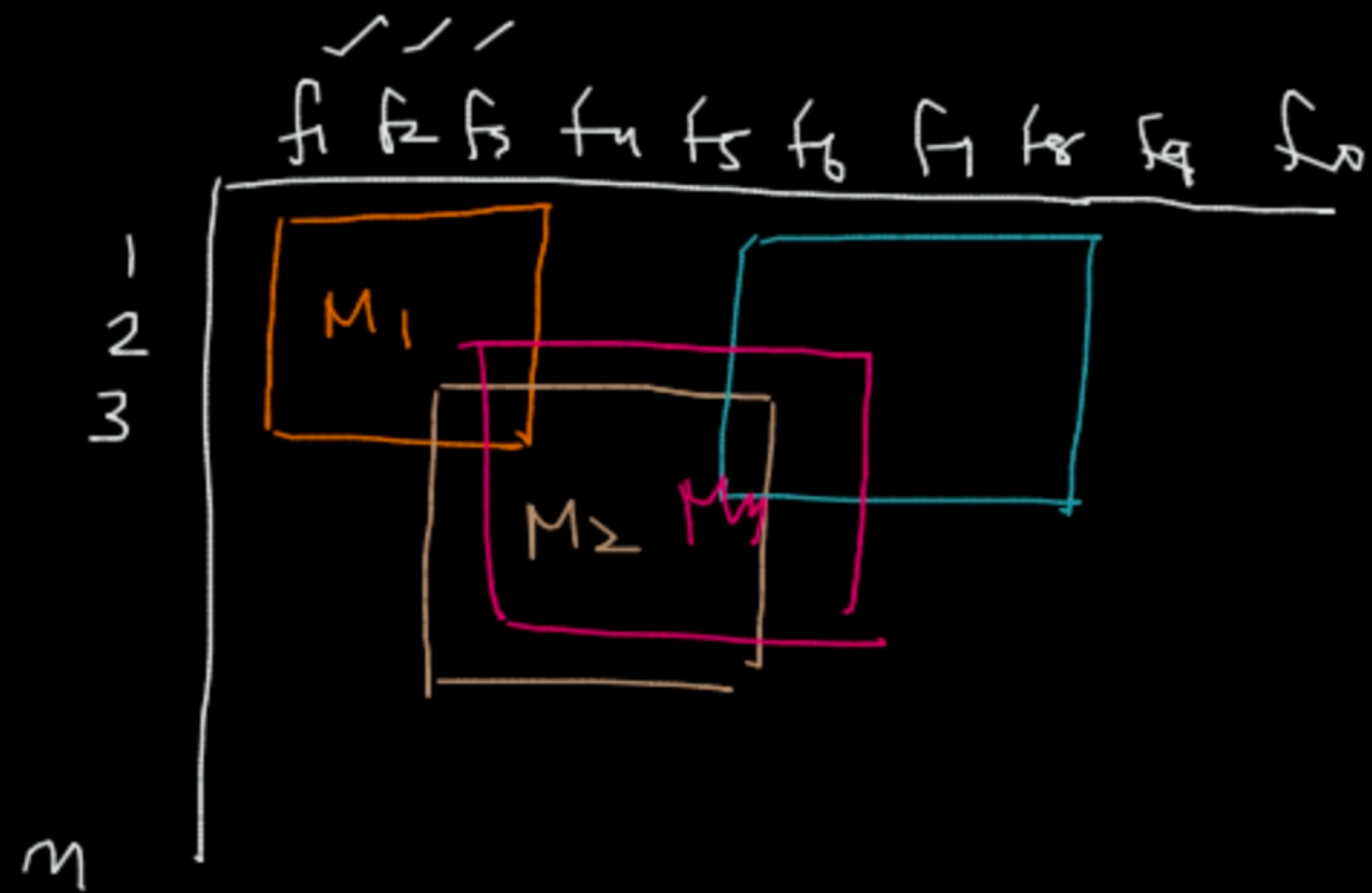
Decision Tree \rightarrow Max-depth = 64



Random Forest

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

1000 Rows \rightarrow 200 Rows



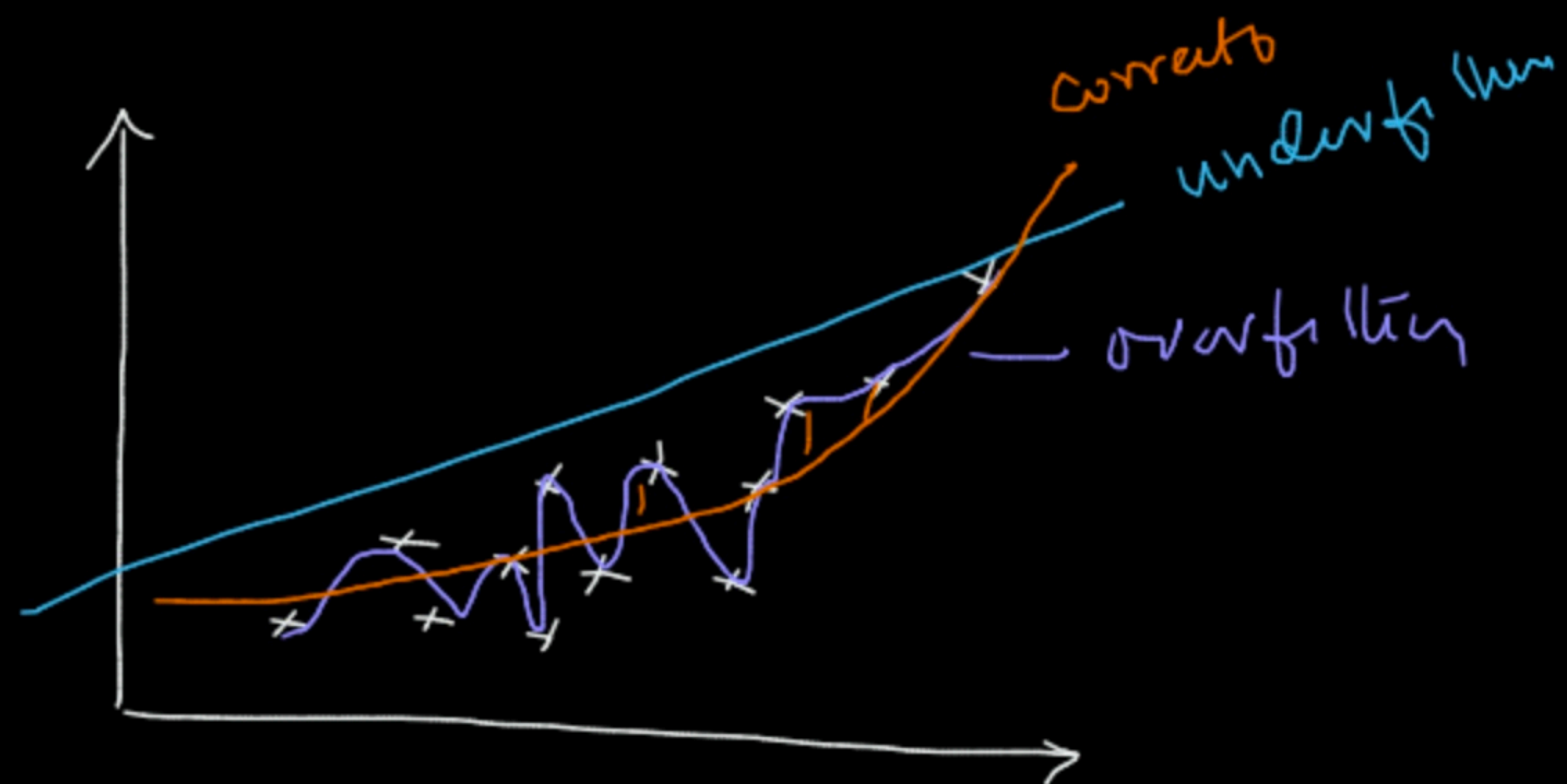
$f_1 f_2 f_3 \rightarrow M_1$

$f_2 f_4 f_6 \rightarrow M_2$

$f_1 f_2 f_9 \rightarrow M_3$

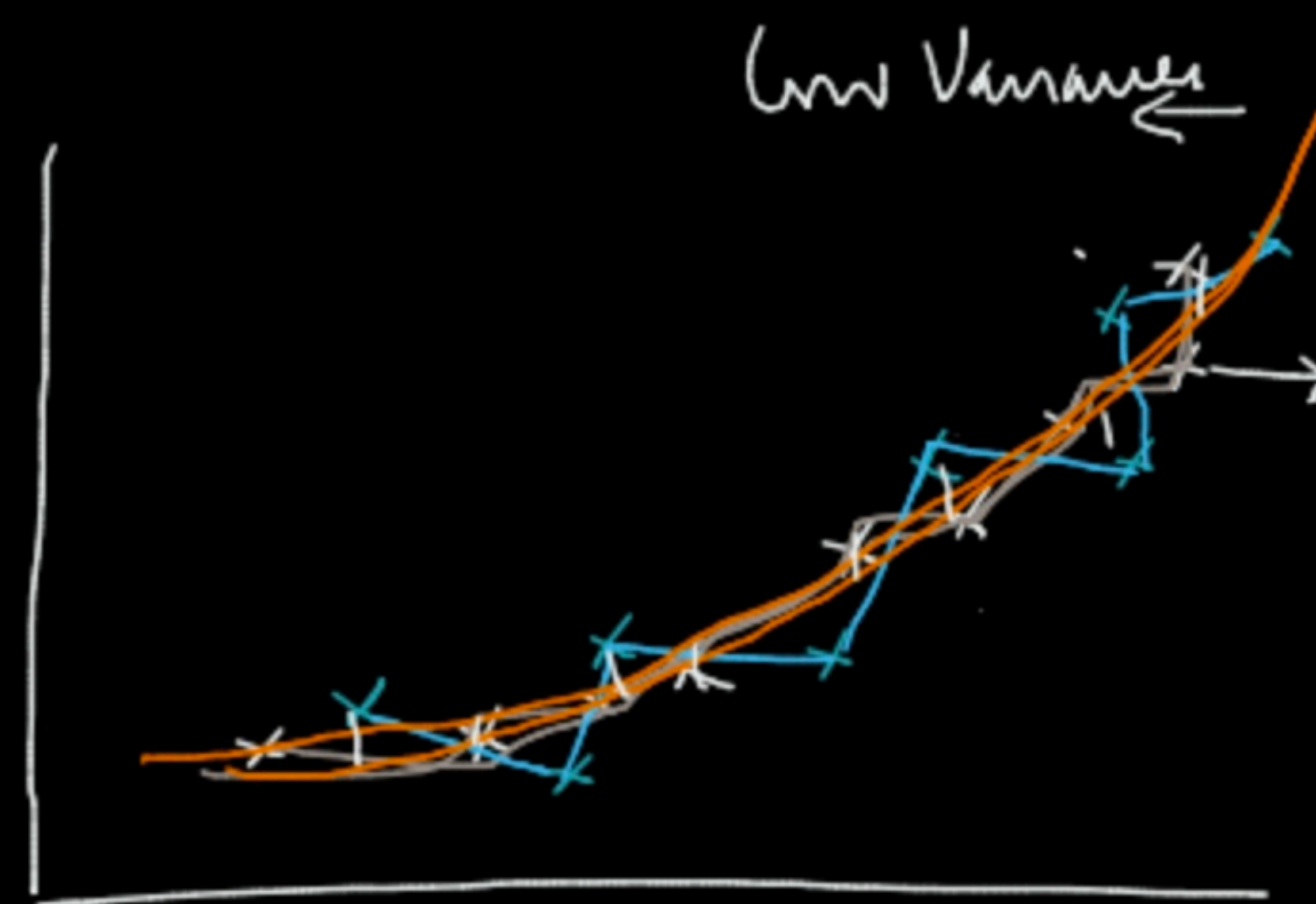
$f_1 f_2 f_3 f_4 - f_{10} y$

Split dataset



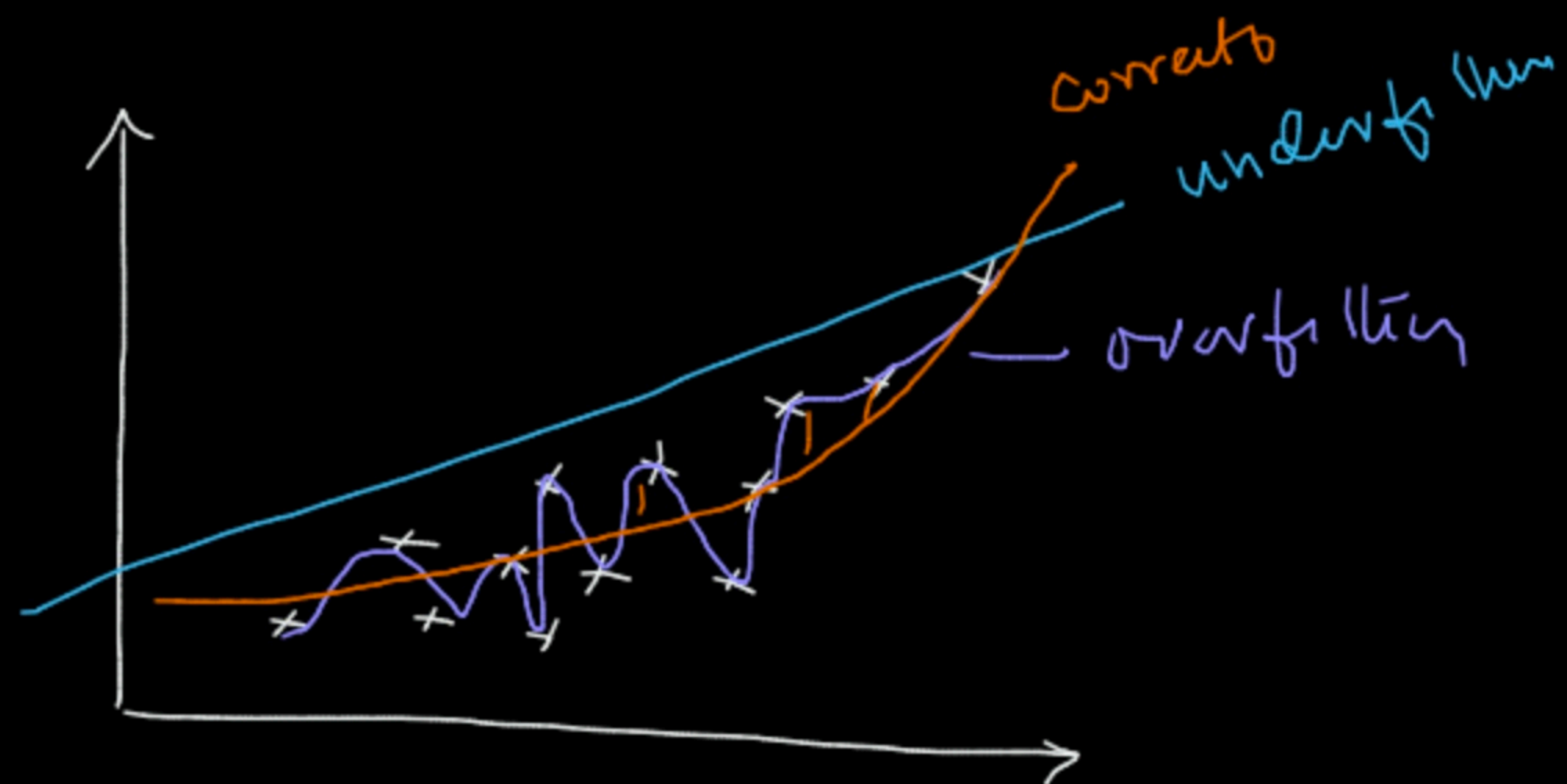
\downarrow Bias \uparrow Variance \downarrow

Ensemble \rightarrow



x_1, x_2, y

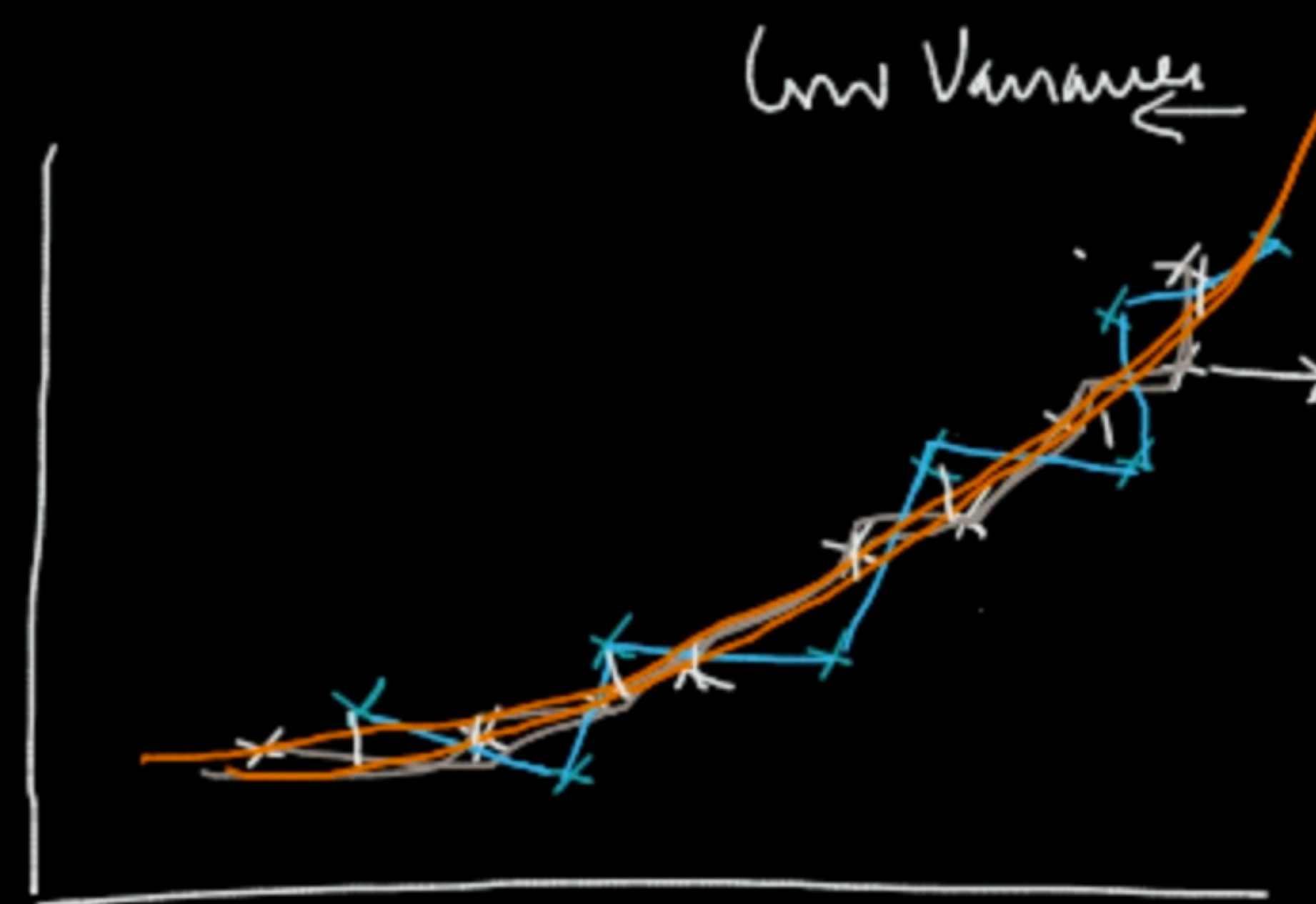
\rightarrow Model Variance



\downarrow Bias \uparrow Variance \uparrow \downarrow

\hookrightarrow

Ensemble \rightarrow



x_1, x_2, y

\rightarrow Model Variance