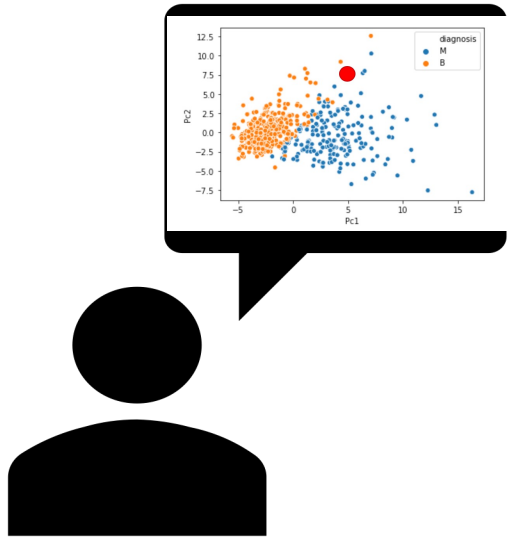


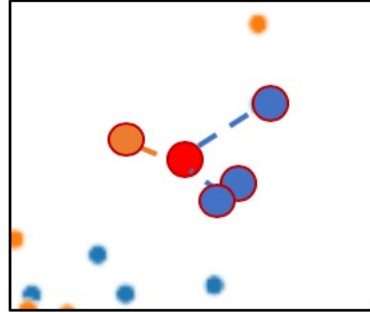
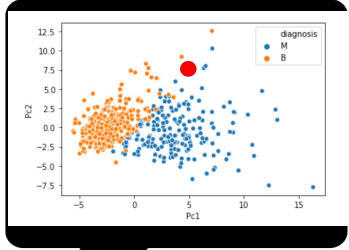
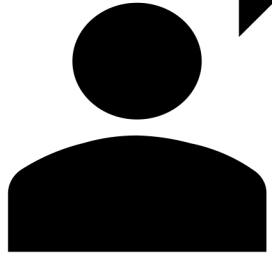
Appendix in Cross Validation

A refined and fun analogy to understand cross validation

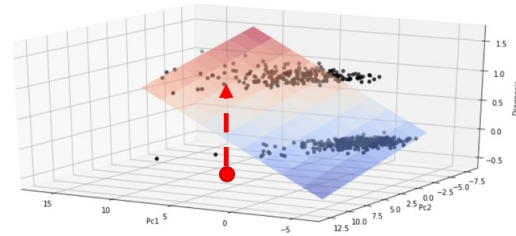
Why do we need cross validation?



Why do we need cross validation?

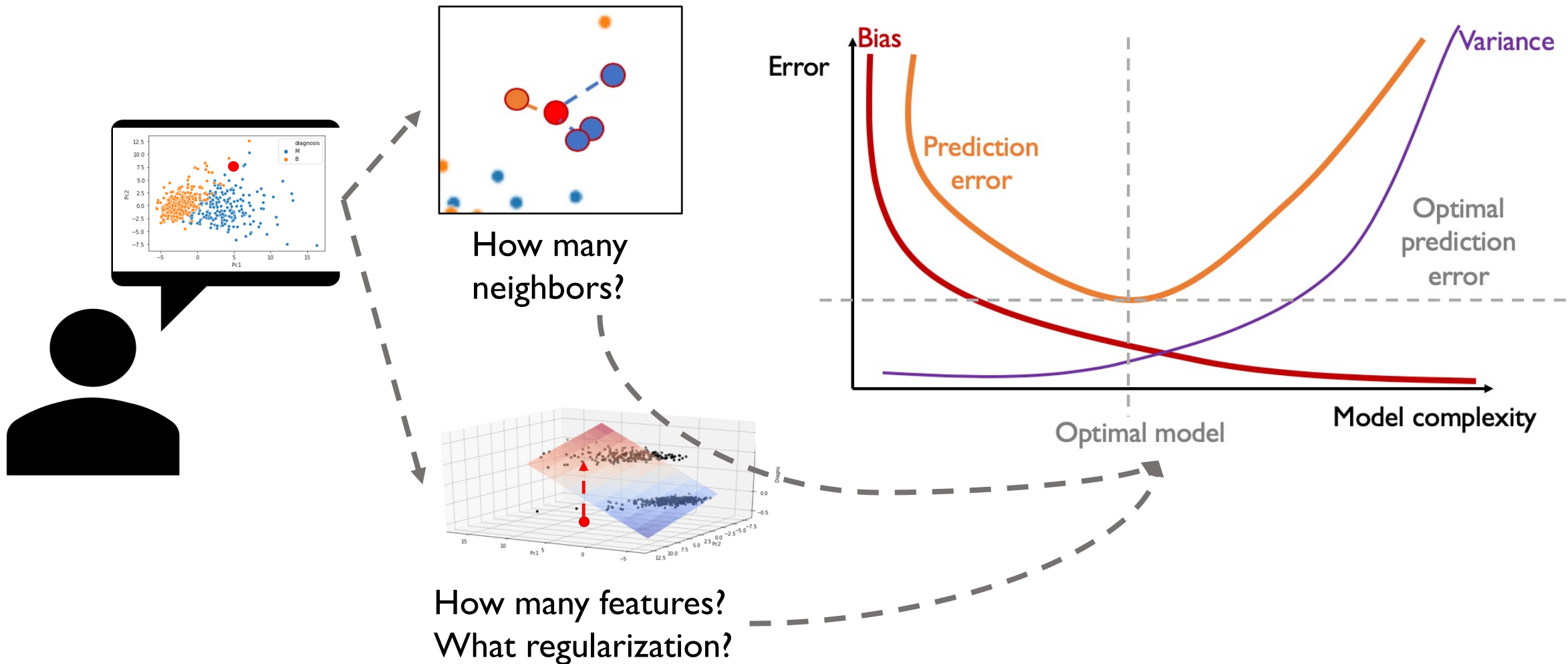


How many
neighbors?

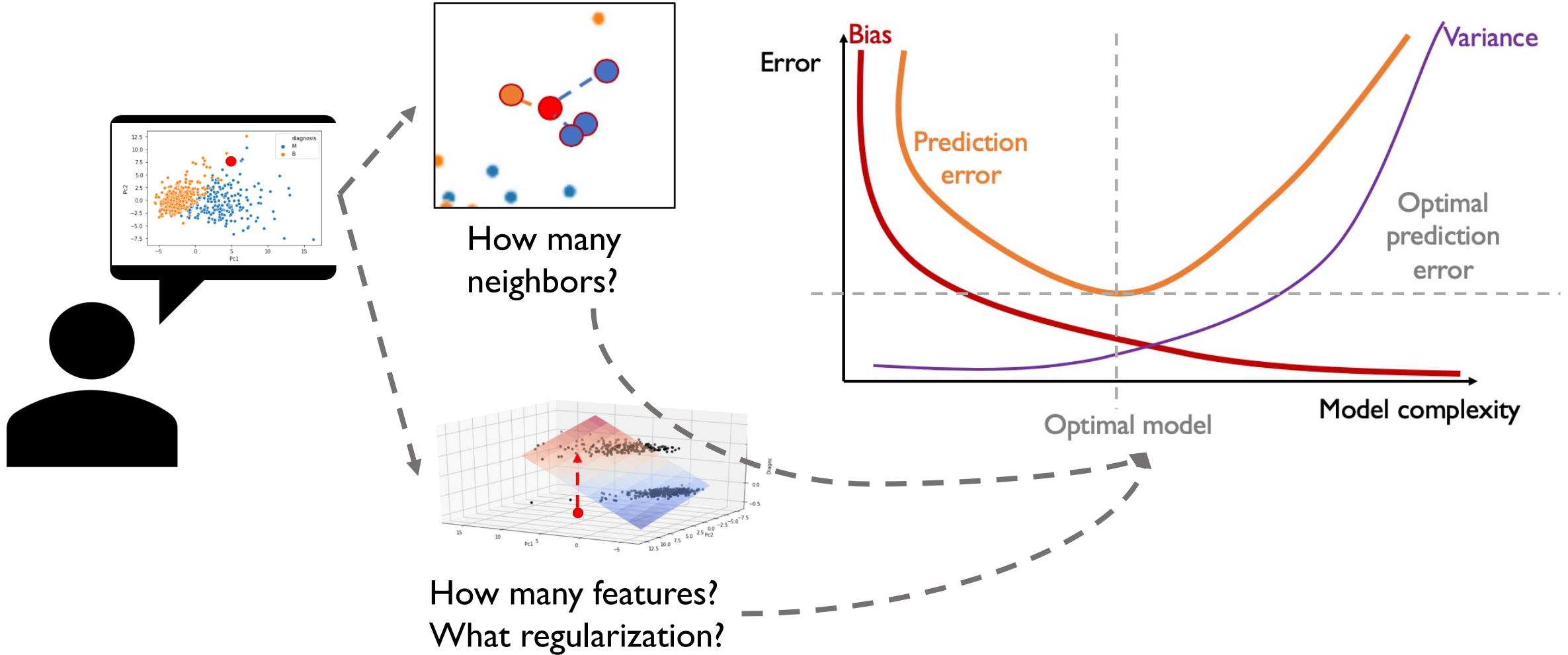


How many features?
What regularization?

Why do we need cross validation?



Why do we need cross validation?

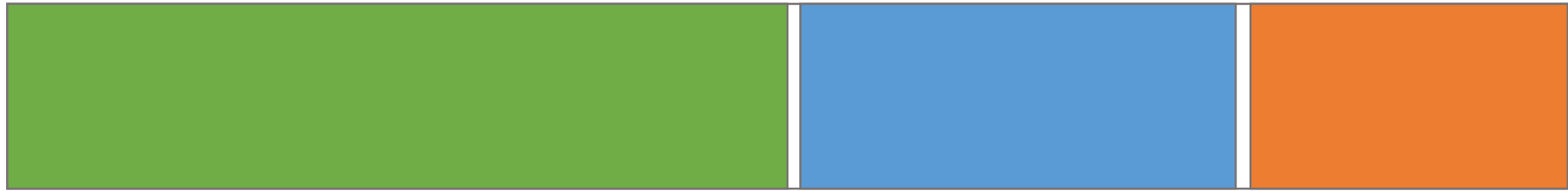


Cross Validation = Create Prediction error curve

How to estimate prediction error?

We need to generalize to **unseen** data

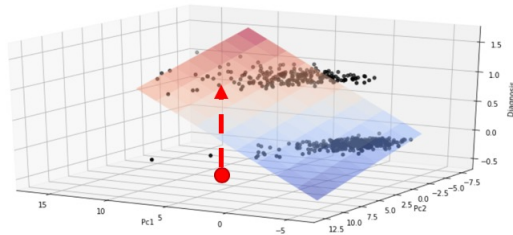
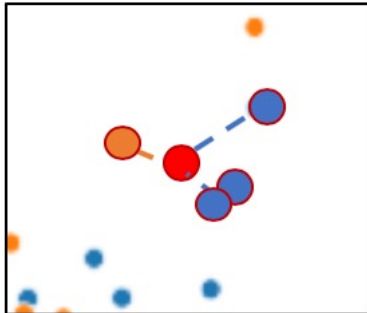
Your data



Train



Fit the models



Validation



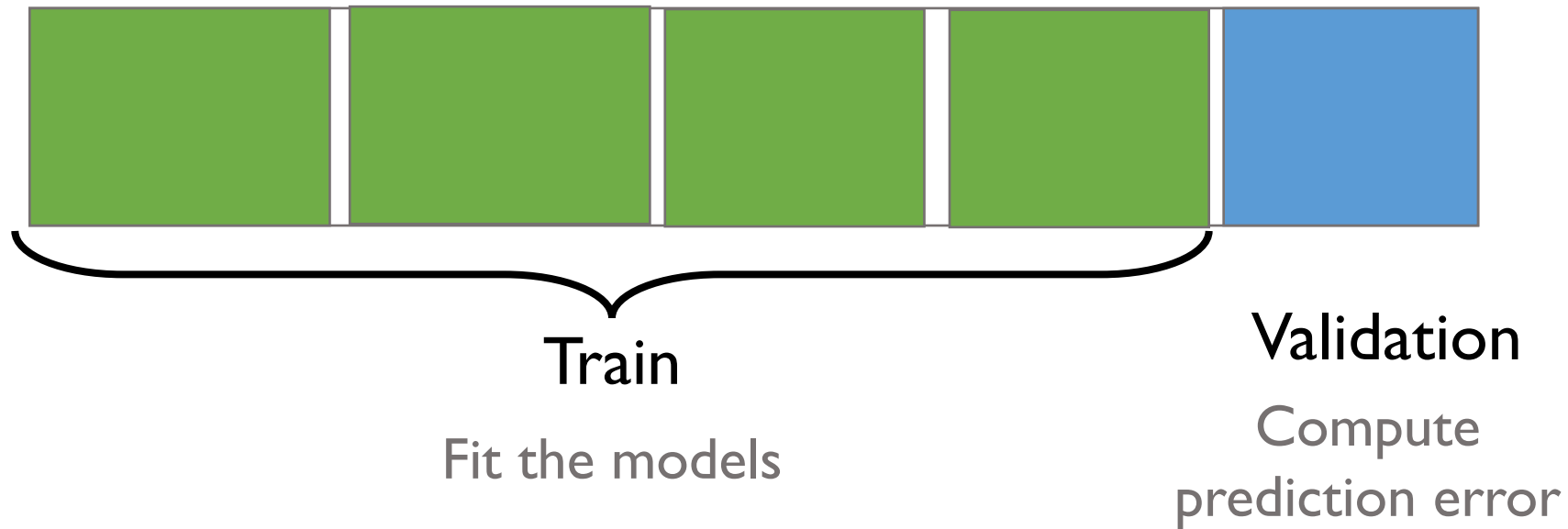
Create prediction
error curve
during **model
selection**

Test



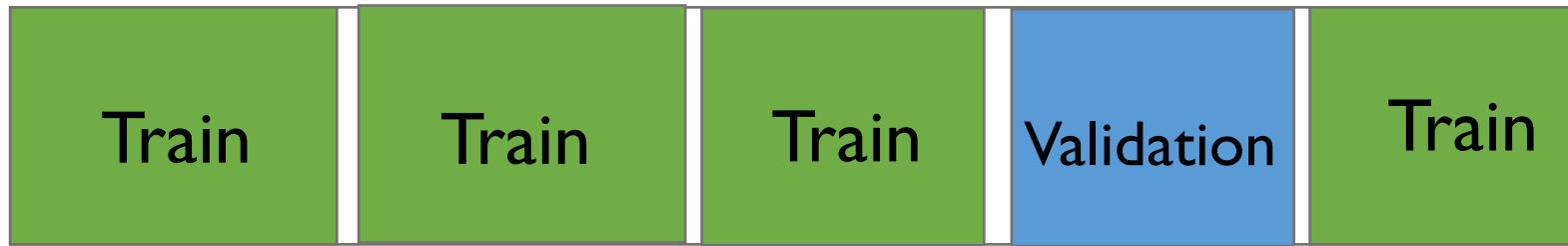
Create **final
assessment** of
prediction error
curve for **chosen
model**

K-fold Cross validation



$$Err_5 = \sum_{i \in S_5} \left(y^{(i)} - \hat{f}_5(x^{(i)}) \right)^2$$

K-fold Cross validation



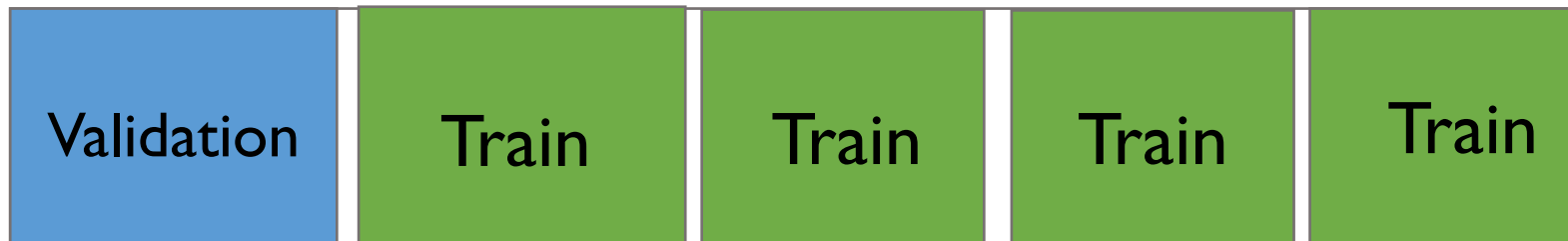
$$Err_4 = \sum_{i \in S_4} \left(y^{(i)} - \hat{f}_4(x^{(i)}) \right)^2$$



$$Err_3 = \sum_{i \in S_3} \left(y^{(i)} - \hat{f}_3(x^{(i)}) \right)^2$$



$$Err_2 = \sum_{i \in S_2} \left(y^{(i)} - \hat{f}_2(x^{(i)}) \right)^2$$



$$Err_1 = \sum_{i \in S_1} \left(y^{(i)} - \hat{f}_1(x^{(i)}) \right)^2$$

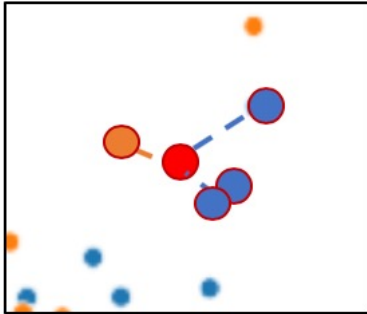
K-fold Cross validation

$$Err = \frac{1}{5} (Err_1 + Err_2 + Err_3 + Err_4 + Err_5)$$

K-fold Cross validation

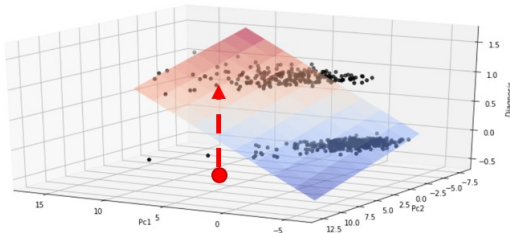
$$Err = \frac{1}{5} (Err_1 + Err_2 + Err_3 + Err_4 + Err_5)$$

Model



Average prediction error

$$Err_{KNN}$$



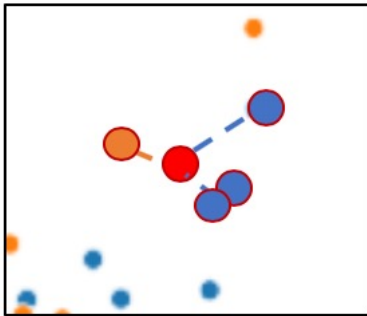
$$Err_{LR}$$

K-fold Cross validation

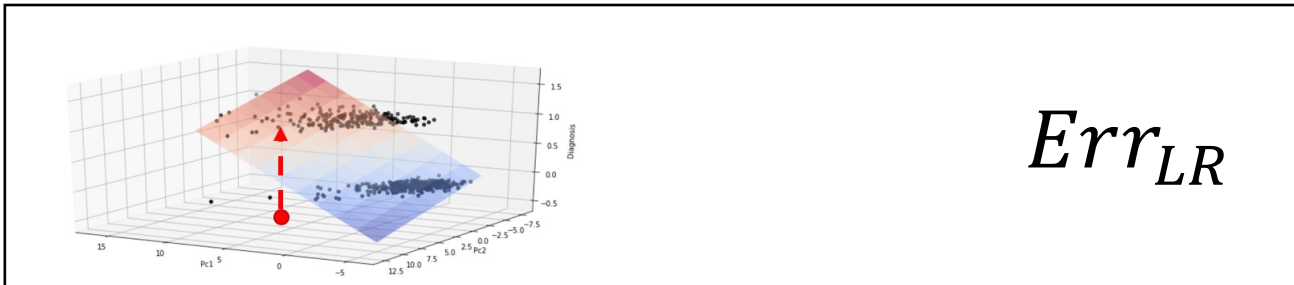
$$Err = \frac{1}{5} (Err_1 + Err_2 + Err_3 + Err_4 + Err_5)$$

Model

Average prediction error



Err_{KNN}



Err_{LR}

How to estimate prediction error?

We need to generalize to **unseen** data

Your data

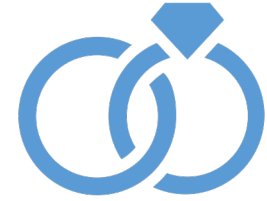


Refined Analogy for Train, Validation and Test



Refined Analogy for Train, Validation and Test

Say *yes* to the DRESS



Training

Validation

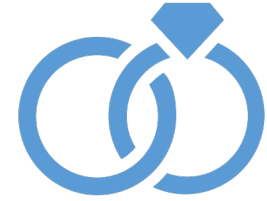
Test



Bride

Refined Analogy for Train, Validation and Test

Say *yes* to the DRESS



Training

Validation

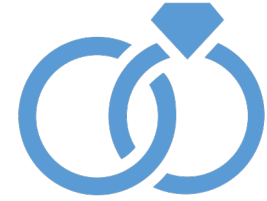
Test



Bride

Refined Analogy for Train, Validation and Test

Say *yes* to the DRESS



Training

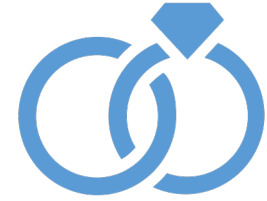
Validation

Test



Refined Analogy for Train, Validation and Test

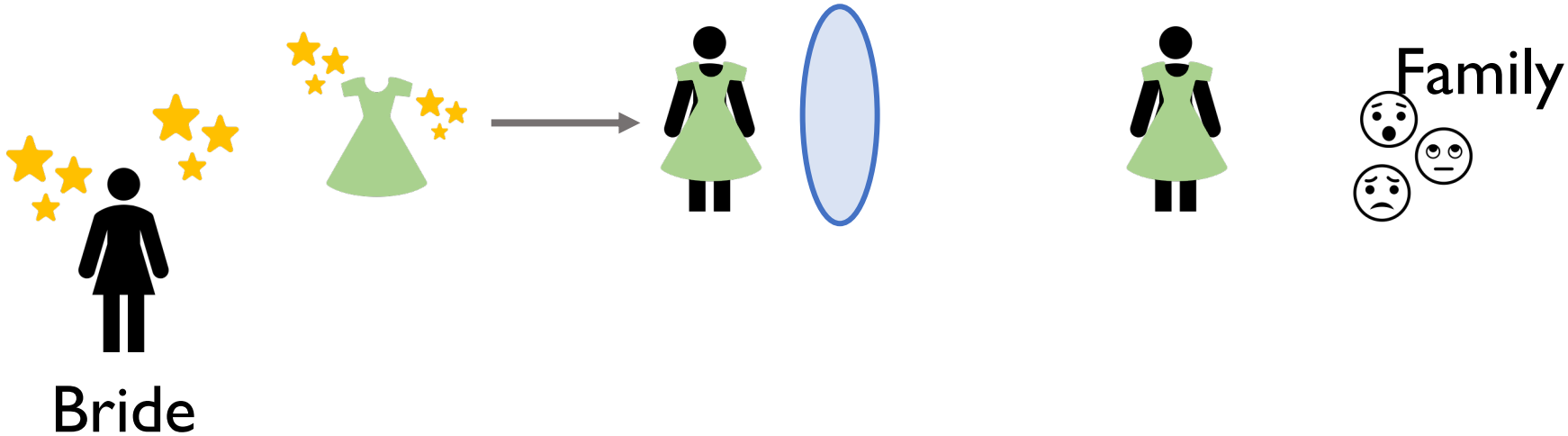
Say *yes* to the DRESS



Training

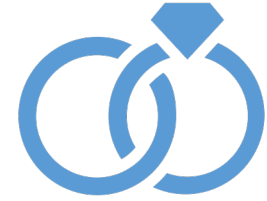
Validation

Test



Refined Analogy for Train, Validation and Test

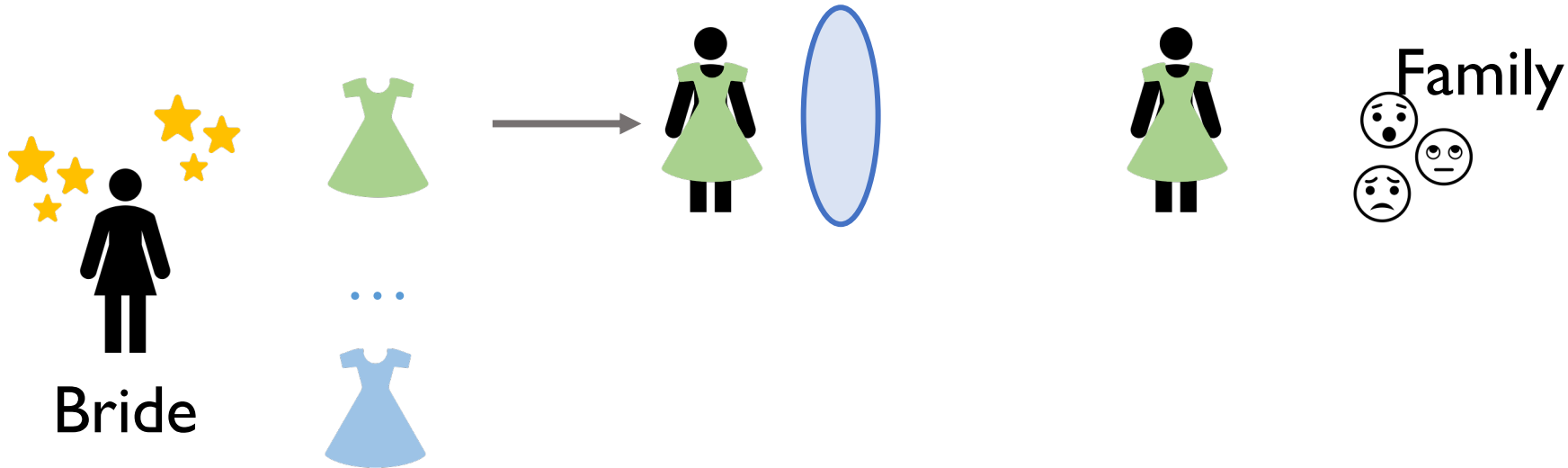
Say *yes* to the DRESS



Training

Validation

Test



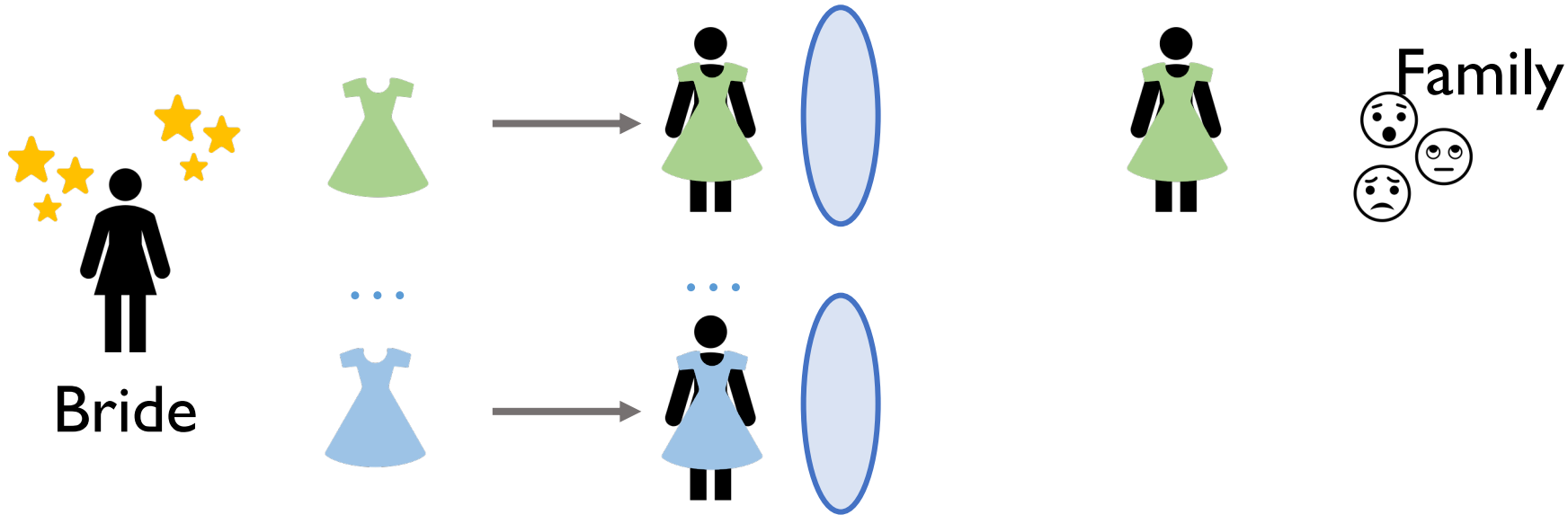
Refined Analogy for Train, Validation and Test

Say *yes* to the DRESS 

Training

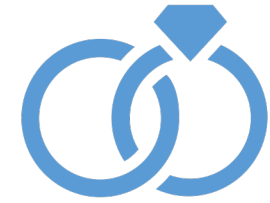
Validation

Test



Refined Analogy for Train, Validation and Test

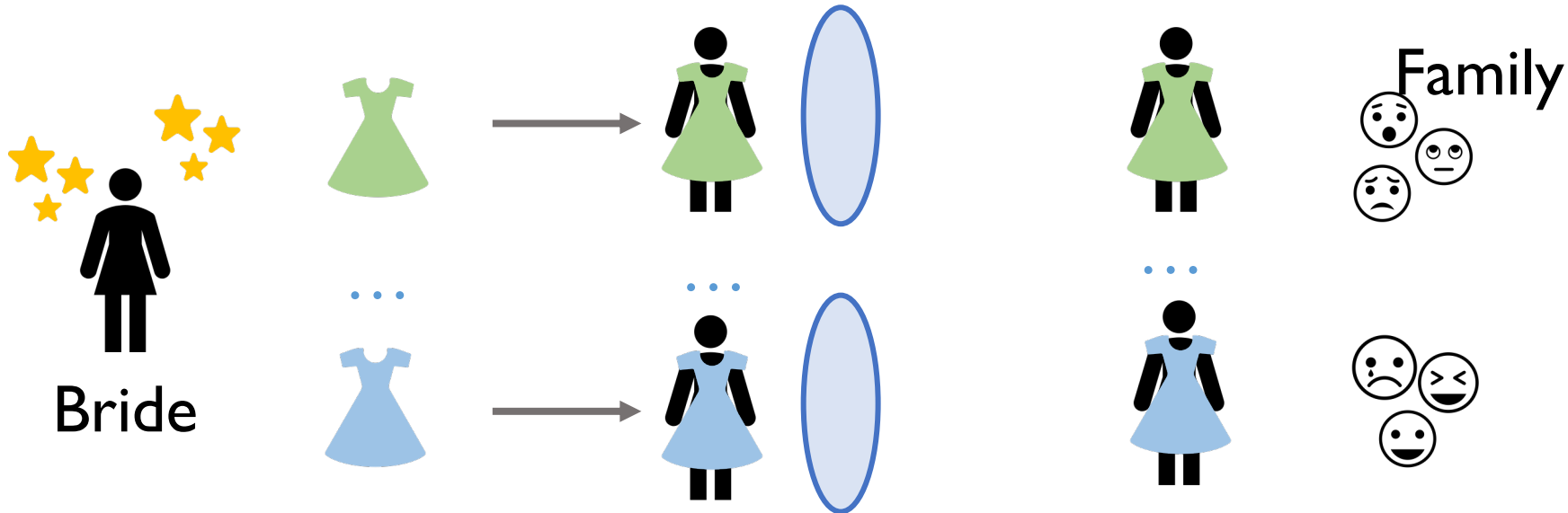
Say *yes* to the DRESS



Training

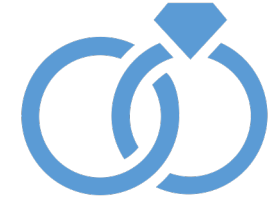
Validation

Test



Refined Analogy for Train, Validation and Test

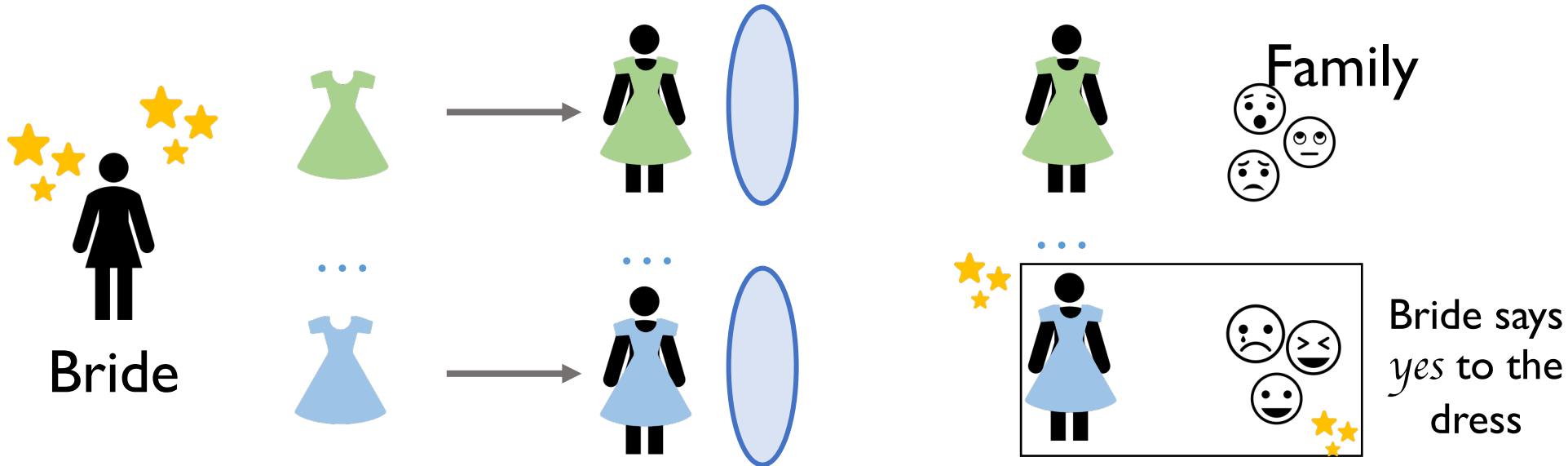
Say *yes* to the DRESS



Training

Validation

Test



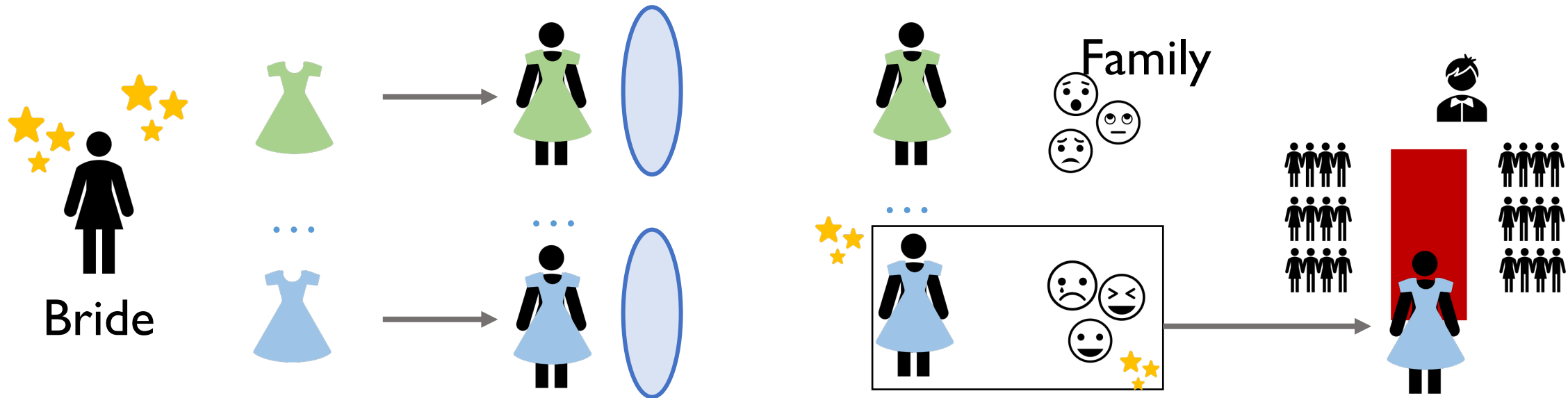
Refined Analogy for Train, Validation and Test

Say *yes* to the DRESS 

Training

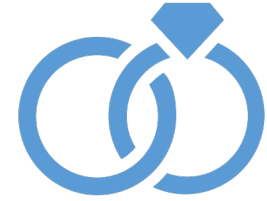
Validation

Test



Refined analogy for Cross-Validation

Say *yes* to the DRESS



Training

Validation

Test

Refined analogy for Cross-Validation

Say *yes* to the DRESS

Bridesmaids
edition

Training

Validation

Test



Refined analogy for Cross-Validation

Say *yes* to the DRESS

Bridesmaids
edition

Training

Validation

Test



Refined analogy for Cross-Validation

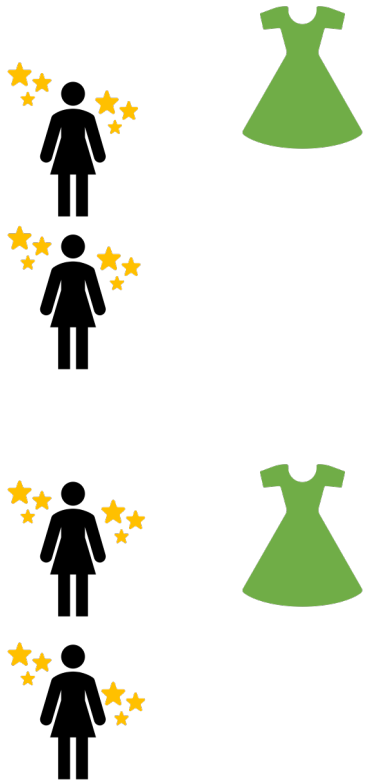
Say *yes* to the DRESS

Bridesmaids
edition

Training

Validation

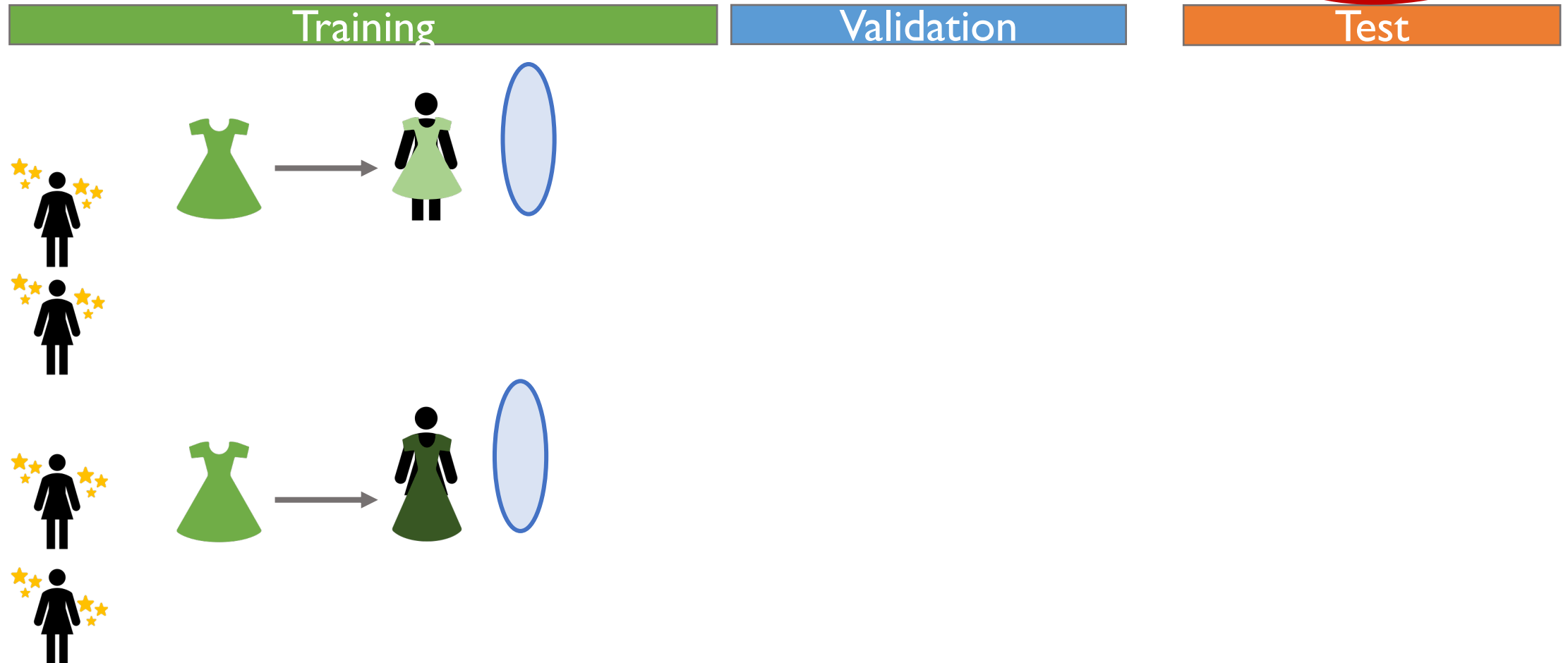
Test



Refined analogy for Cross-Validation

Say *yes* to the DRESS

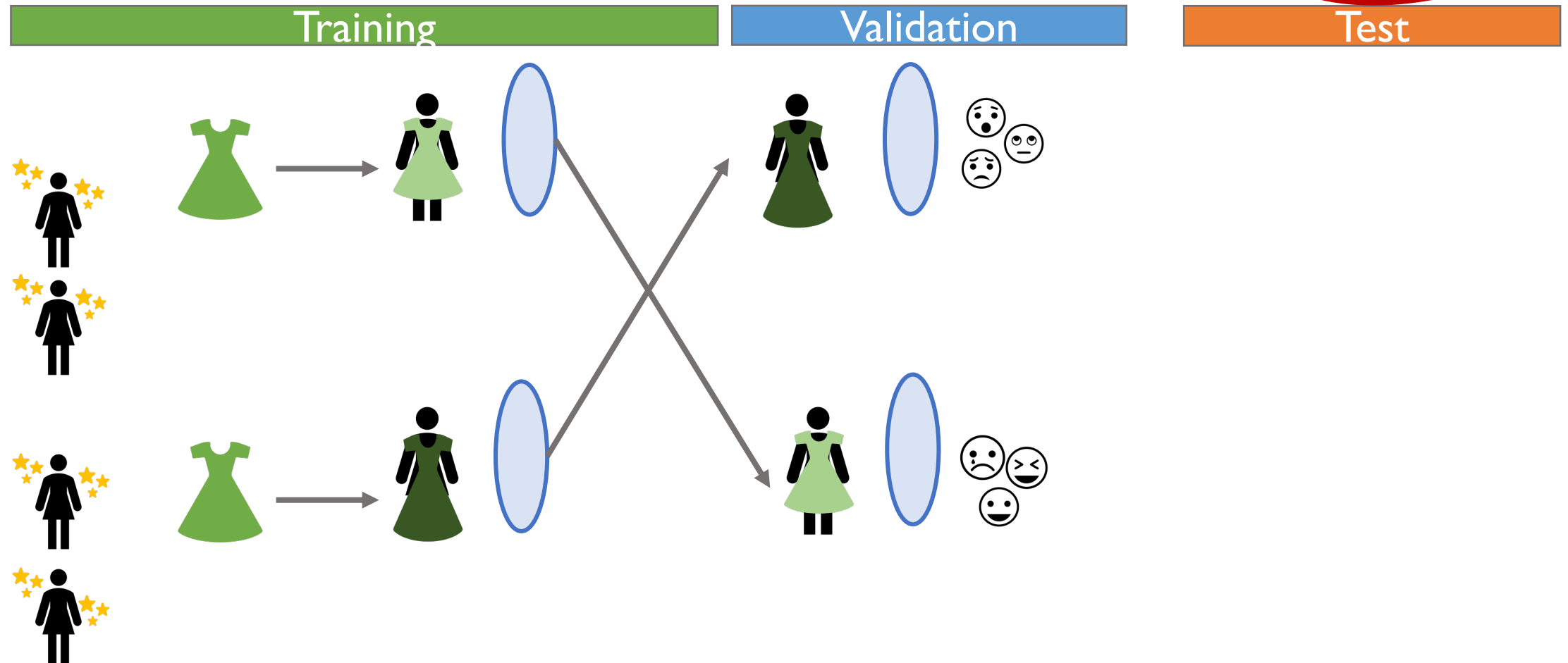
Bridesmaids
edition



Refined analogy for Cross-Validation

Say *yes* to the DRESS

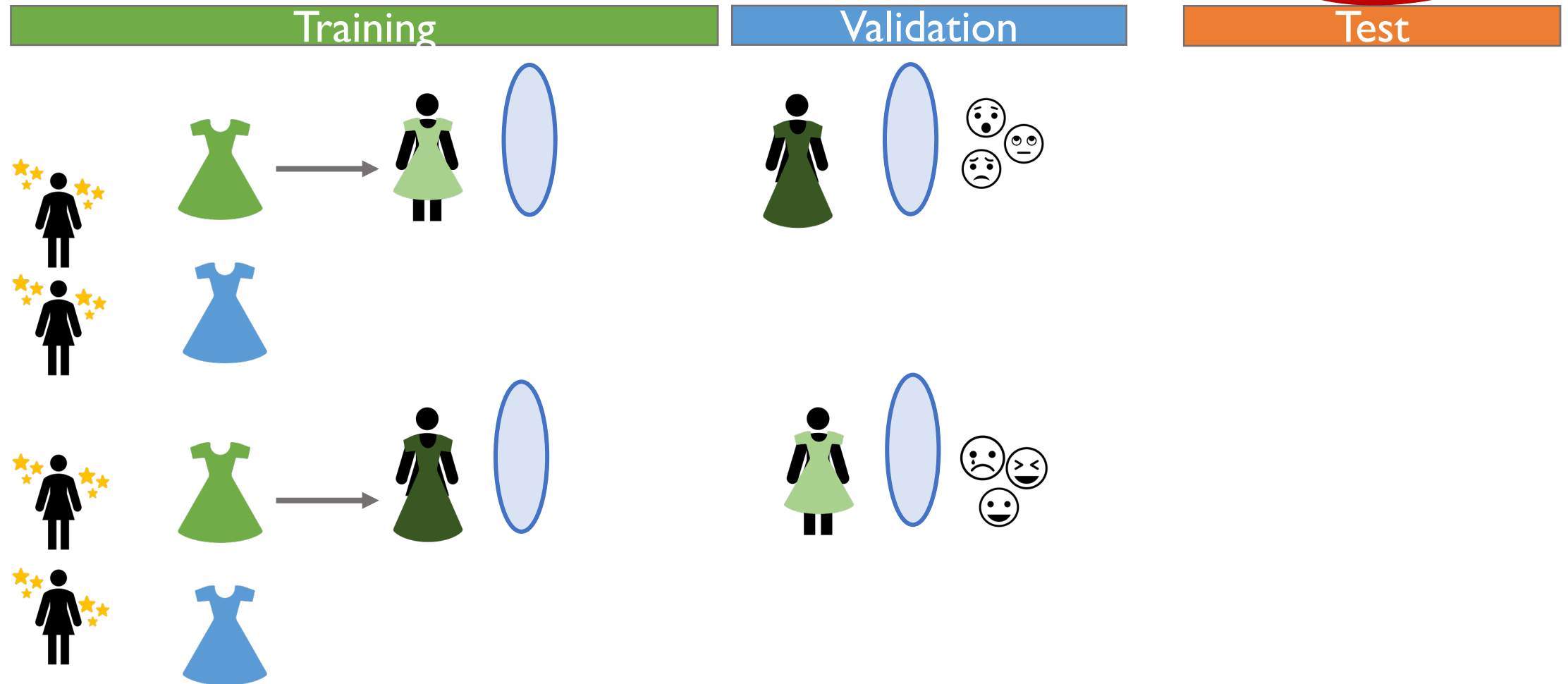
Bridesmaids
edition



Refined analogy for Cross-Validation

Say *yes* to the DRESS

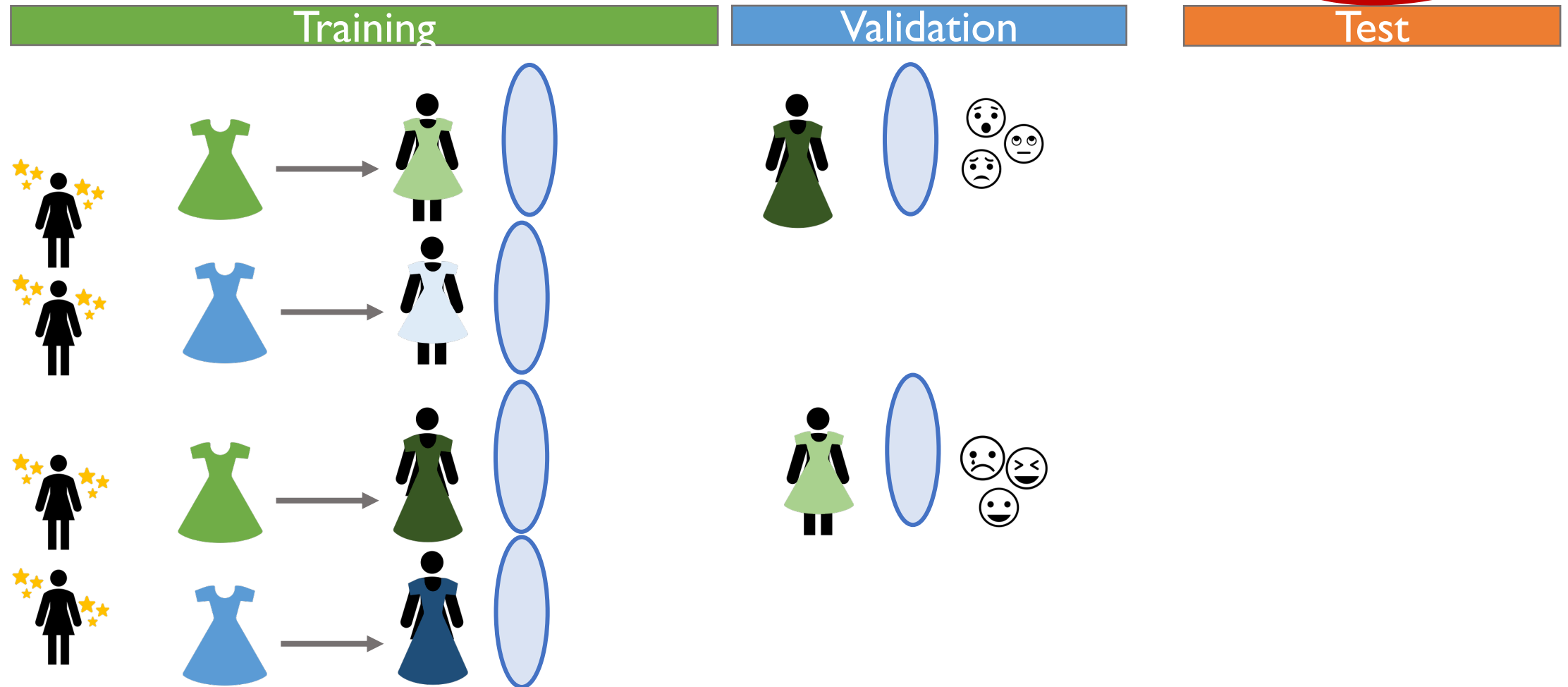
Bridesmaids
edition



Refined analogy for Cross-Validation

Say *yes* to the DRESS

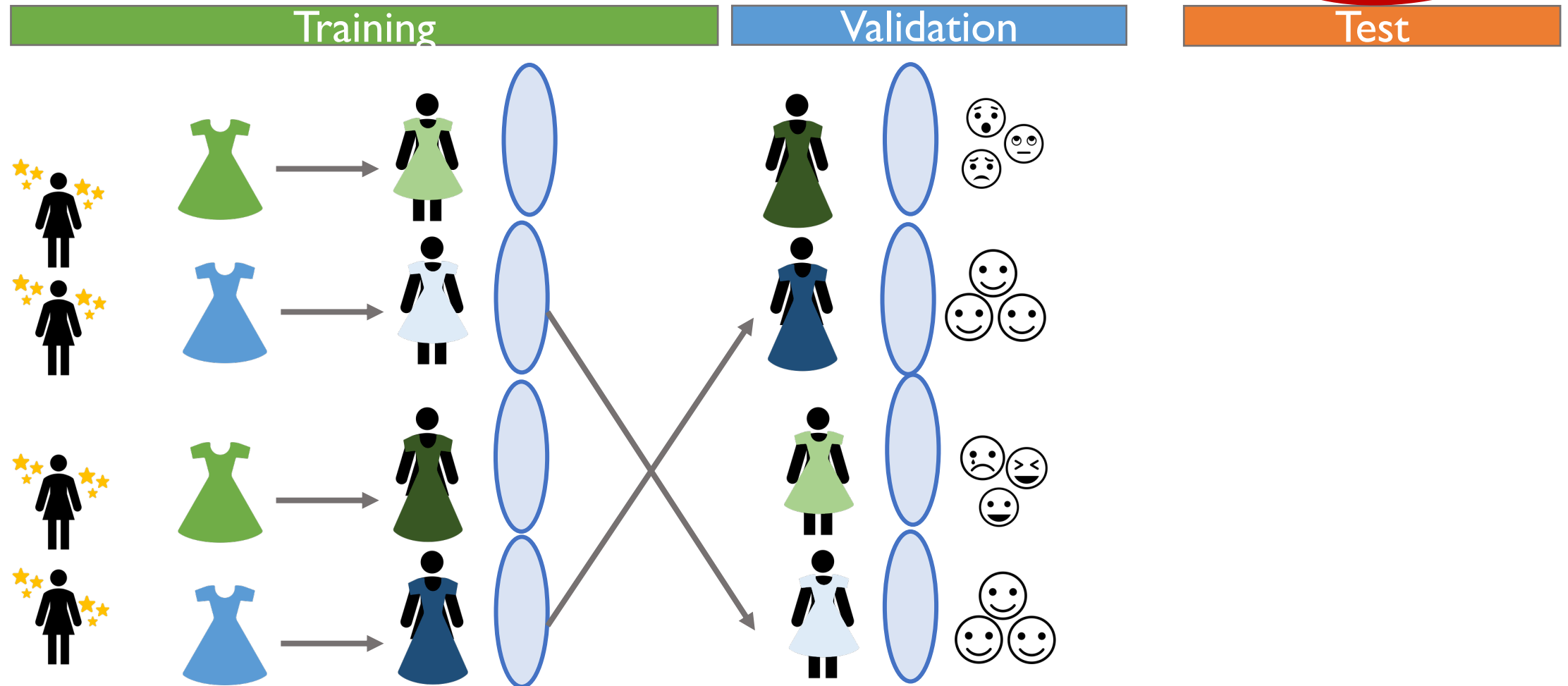
Bridesmaids
edition



Refined analogy for Cross-Validation

Say *yes* to the DRESS

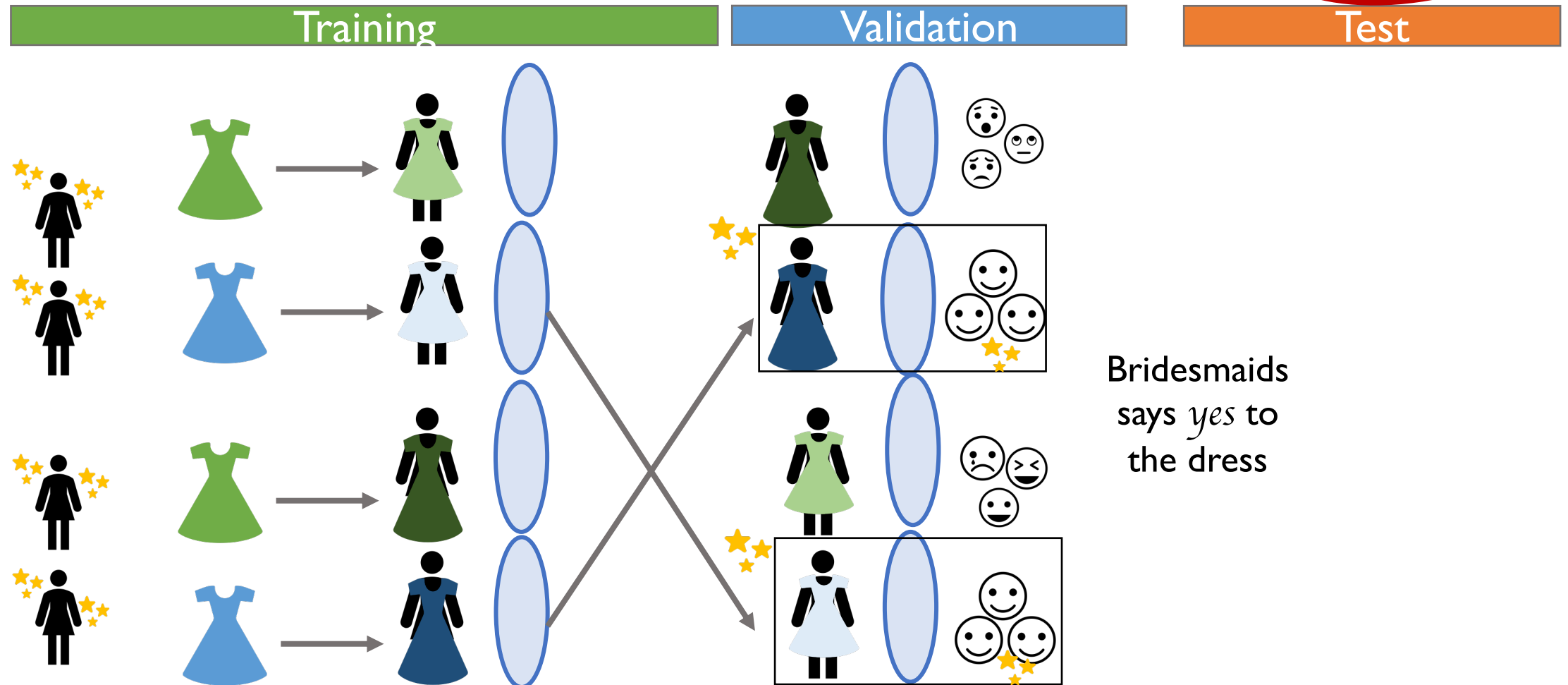
Bridesmaids
edition



Refined analogy for Cross-Validation

Say *yes* to the DRESS

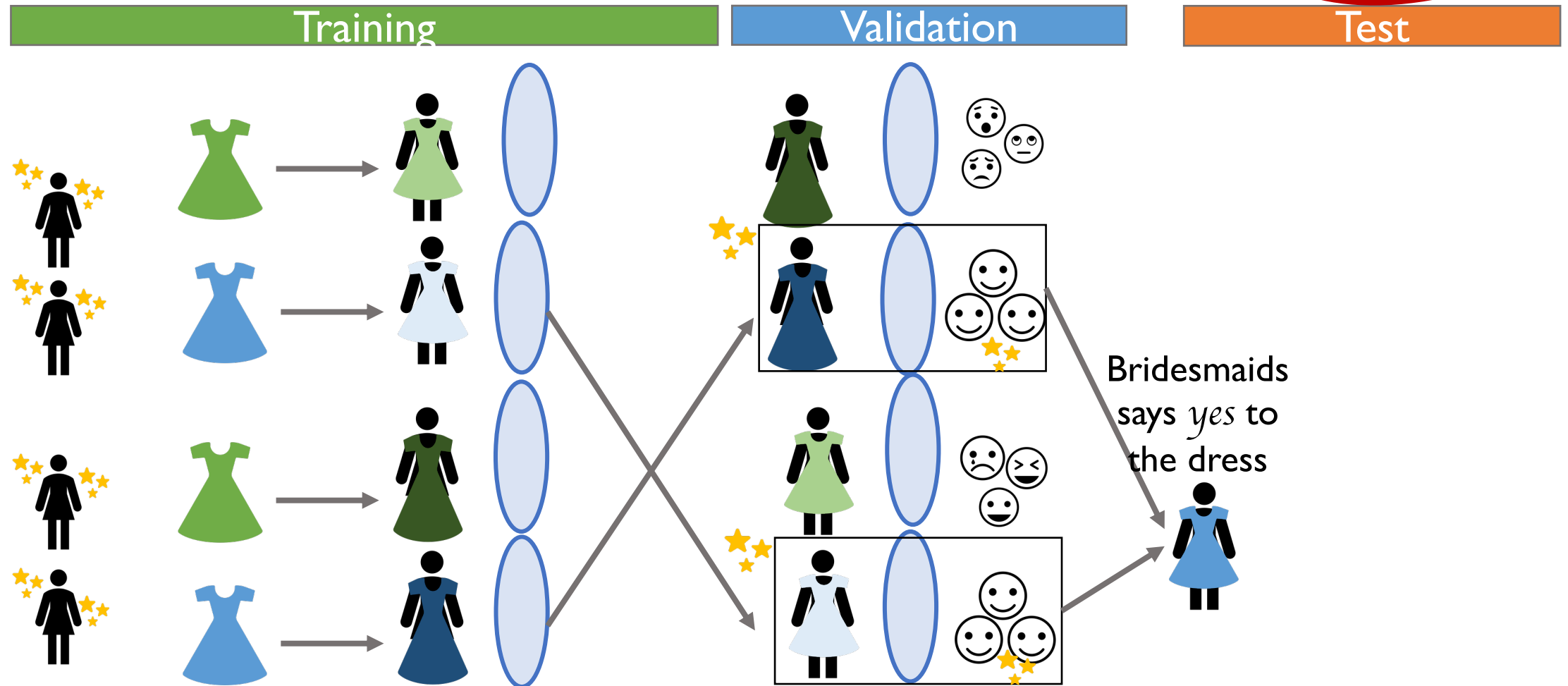
Bridesmaids
edition



Refined analogy for Cross-Validation

Say *yes* to the DRESS

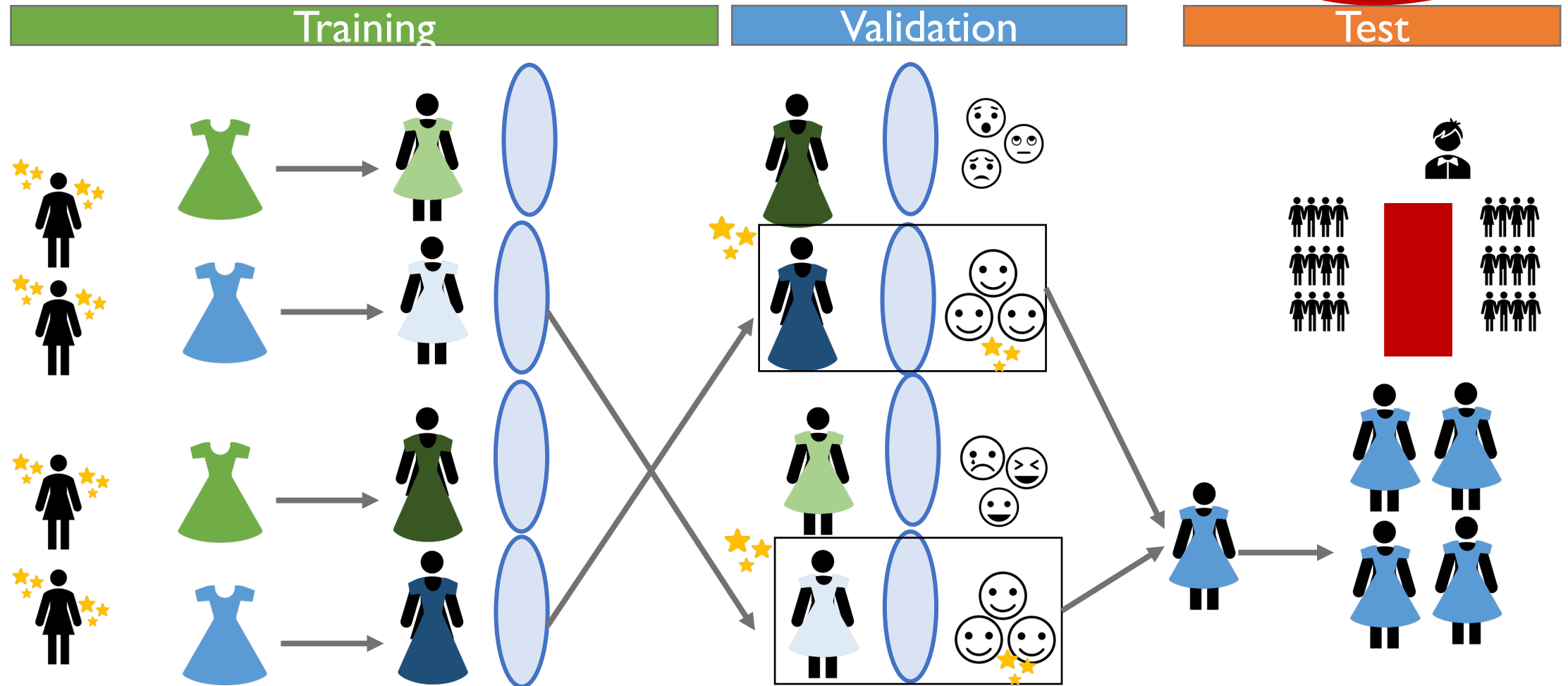
Bridesmaids
edition



Refined analogy for Cross-Validation

Say *yes* to the DRESS

Bridesmaids
edition



Say *yes* to the DRESS

Bridesmaids
edition

Appendix in Cross Validation

A refined and fun analogy to understand cross validation