## F1-Score for Multi-label Classification Model Evaluation



{cat: True, dog: True, Unicorn: True}

True
labels
for the
instance
Any cat?

(True, True, True)

 $Y_i$  (1, 1, 1)

Any dog? Any unicorn?

(0, 1, 1)

Predicted labels for the instance

How many classes does the model correctly predict that instance i belongs to?

$$ext{F1-score}_{ ext{samples}} = rac{1}{N} \sum_{i=1}^{N} rac{2 \cdot |Y_i \cap \hat{Y}_i|}{|Y_i| + |\hat{Y}_i|}$$

How many classes does instance i belong to? How many classes does the model predict instance; belongs to?



N = number of samples

## F1-Score for Multi-label Classification Model Evaluation

True Predicted Labels Labels

$$(1, 0, 1) | (0, 1, 0) | \longrightarrow F1 = 0 \longrightarrow$$

$$(1, 0, 0)$$
  $(0, 1, 1)$  ——F1 = 0

 $-F1 = 0 \longrightarrow \begin{cases} The \text{ predicted classes do} \\ not \text{ match the instance's} \\ +F1 = 0 \longrightarrow \begin{cases} true \text{ classes at all.} \end{cases}$ 

$$(1, 1, 0)$$
  $(1, 1, 1)$  —F1 = 4/5

The model predicts all the true classes correctly, but also includes additional classes the instance does not belong to.

$$(1, 1, 0)$$
  $(0, 1, 1)$  —F1 = 2 / 4

The model predicts only some of the true classes the instance belongs to, but misses one or more true classes.



$$(1, 1, 0)$$
  $(1, 1, 0)$  ——F1 = 1——

The predicted classes exactly match the instance's true classes.

from sklearn.metrics import f1\_score

$$y = [(1, 0, 1), (1, 0, 0), (1, 1, 0), (1, 1, 0), (1, 0, 0), (1, 1, 0)]$$

$$y_{hat} = [(0, 1, 0), (0, 1, 1), (1, 1, 1), (0, 1, 1), (1, 0, 0), (1, 1, 0)]$$