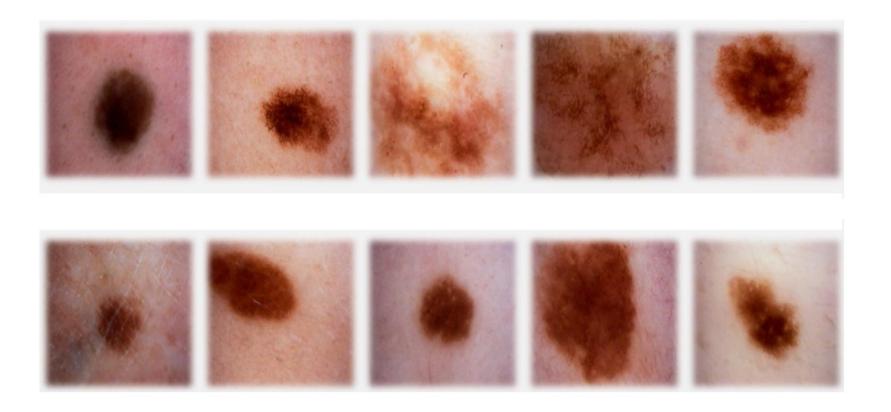
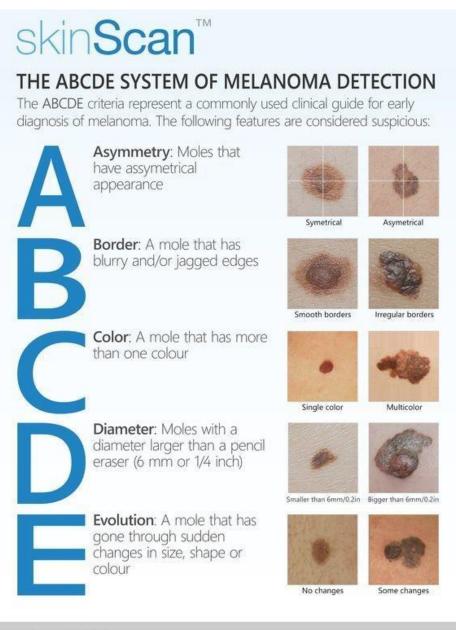
classification



sign of cancer
top row malignant
bottom row benign



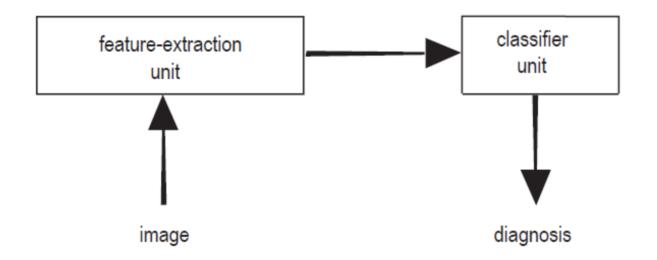
classification



TeleSkin © 2013



classification: terminology

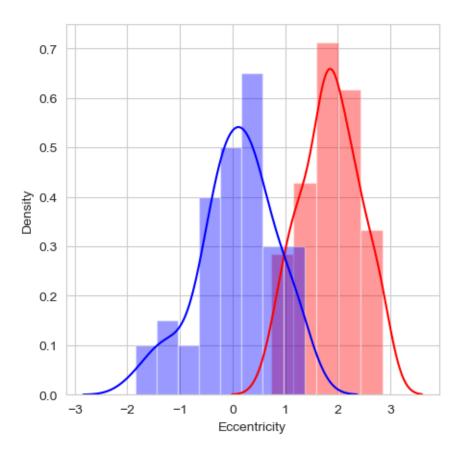


feature extraction: features (a.k.a. properties or attributes)

data set, sample (a.k.a. example, instance or data point), label (a.k.a. target)



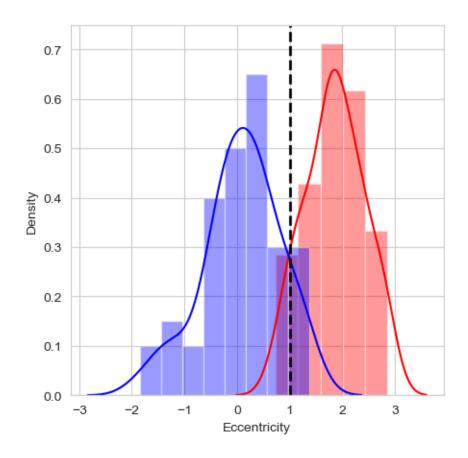
classification: a feature



feature: eccentricity of lesion (how nearly circular the lesion is)



classification: the model

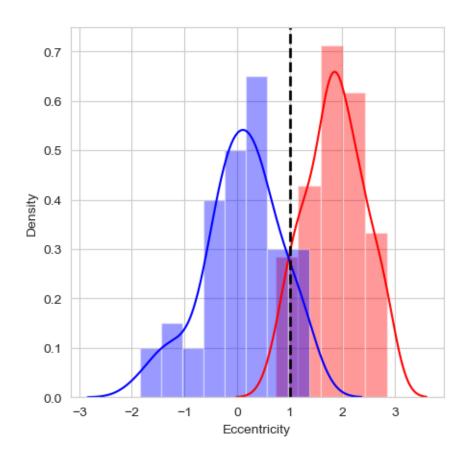


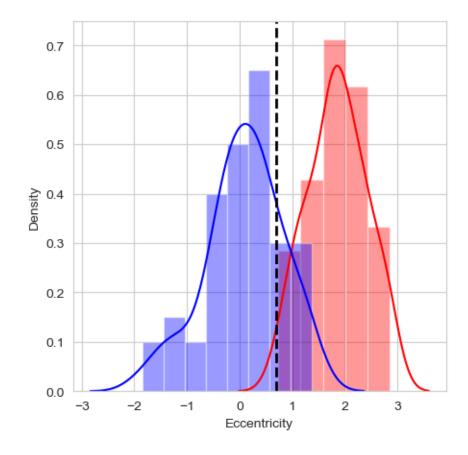
feature: eccentricity of lesion (how nearly circular the lesion is)

model: threshold *t*



classification: the model





feature: eccentricity of lesion (how nearly circular the lesion is)

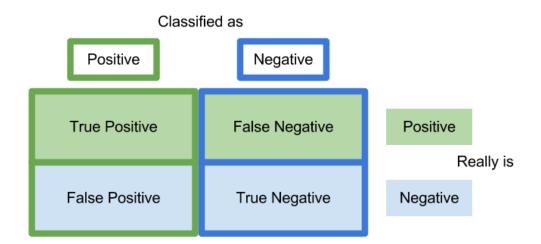
model: threshold t: consequence of the predictions

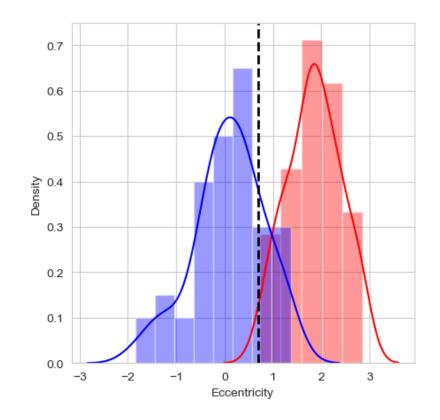


classification: prediction errors

malignant: **positive** class benign: **negative** class

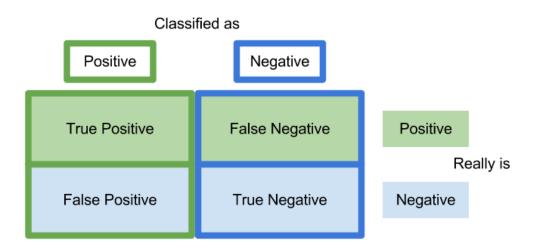
count the number of malignant images with eccentricity value $\geq t$: **true positive** predictions (TP) count the number of malignant images with eccentricity value < t: **false negative** predictions (FN) count the number of benign images with eccentricity value $\geq t$: **false positive** predictions (FP) count the number of benign images with eccentricity value < t: **true negative** predictions (TN)







classification: prediction errors

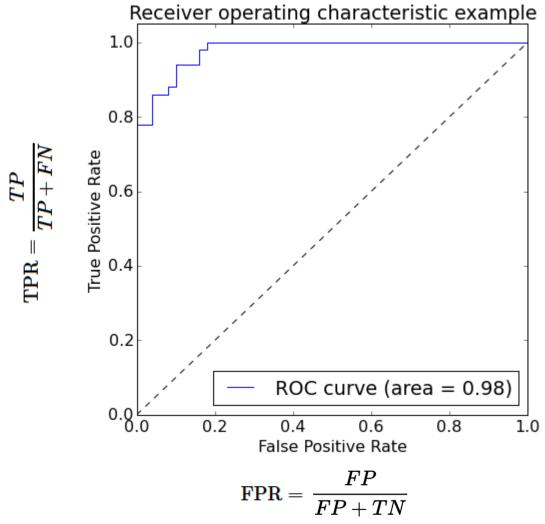


$$\text{accuracy} = \frac{TP + TN}{TP + FP + TN + FN}$$

$$ext{TPR} = rac{TP}{TP + FN}$$

$$ext{FPR} = rac{FP}{FP + TN}$$

classification: prediction errors



model that classifies all images as malignant:

TPR=1 and FPR=1

model that classifies all images a benign:

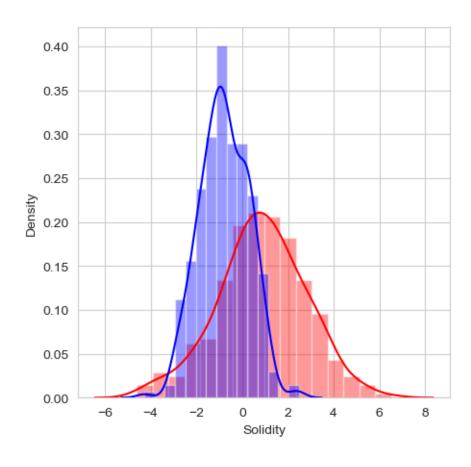
TPR=0 and FPR=0

vary threshold *t*

Area Under the Curve (AUC)



classification: multi-dimensional



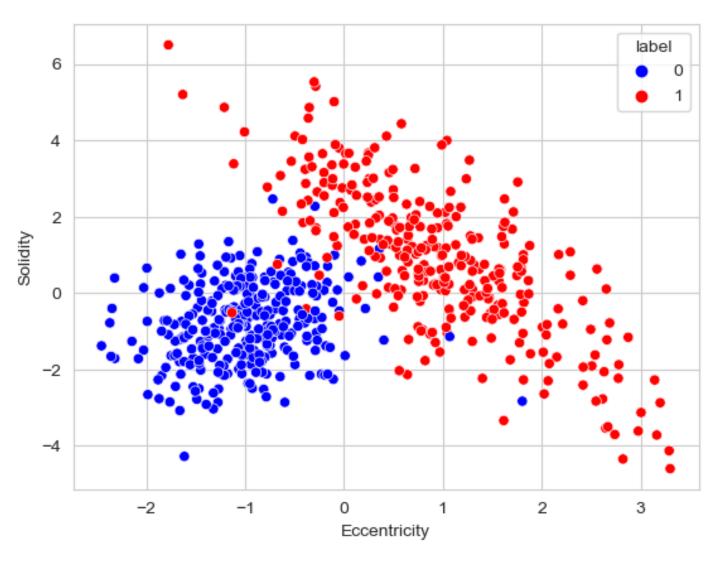
add another feature?

feature vector X

Euclidean vector space



classification: multi-dimensional

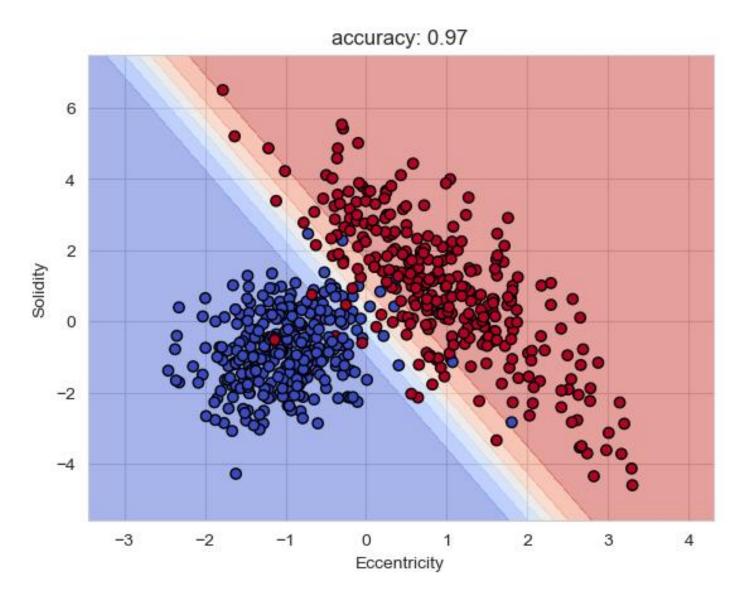


feature vector X

Euclidean vector space



classification: multi-dimensional



linear decision boundary

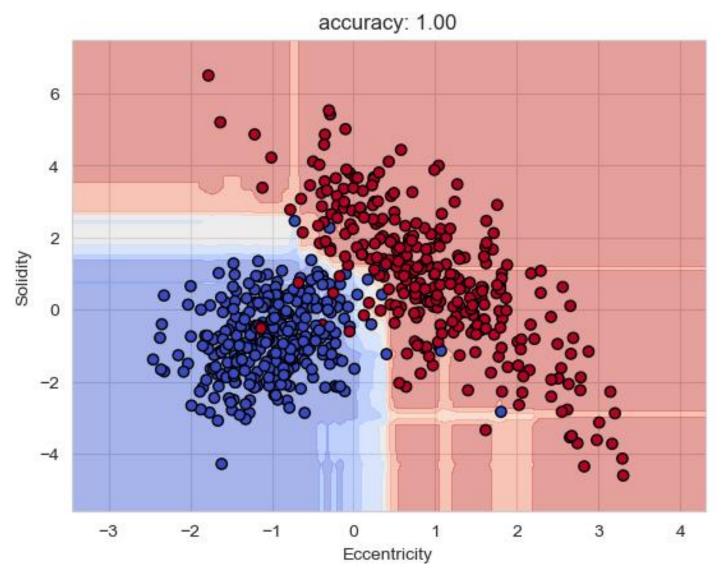
blue region malignant, red region benign

yet more features

can't look at the decision boundary

more complex

classification: model complexity



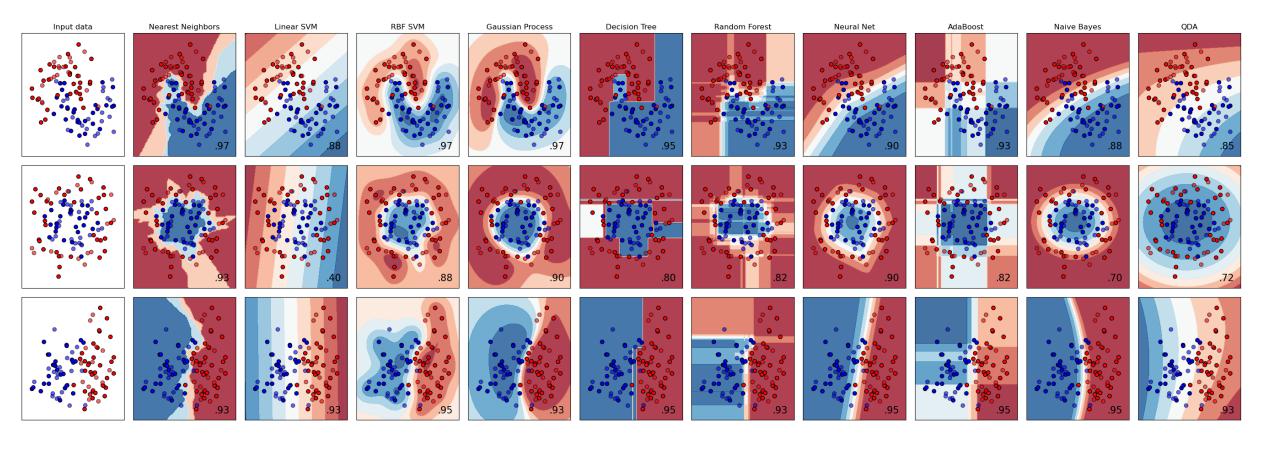
unseen external images

generalization

overfitting



scikit-learn





data normalization

make all features same scale

Eccentricity [0,100], Solidity [-5,7]

weights all features equally in their representation

standardization

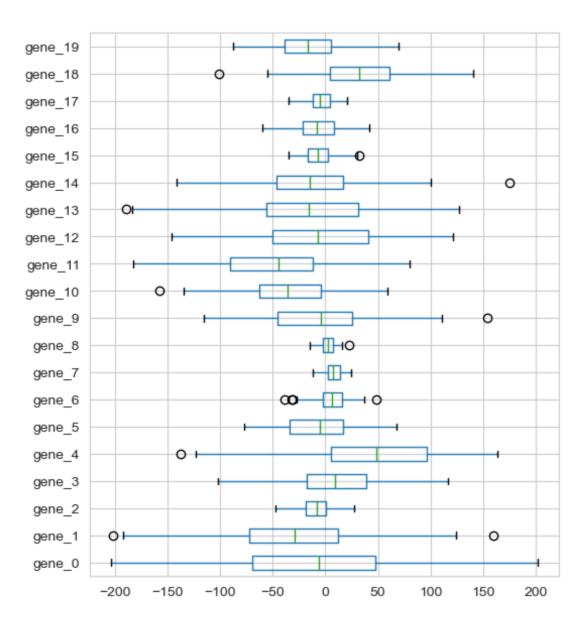
$$\mu = 0$$
 $\sigma = 1$

min-max scaling: scale the features to a fixed range

$$x_{norm} = rac{x - \mu}{\sigma}$$

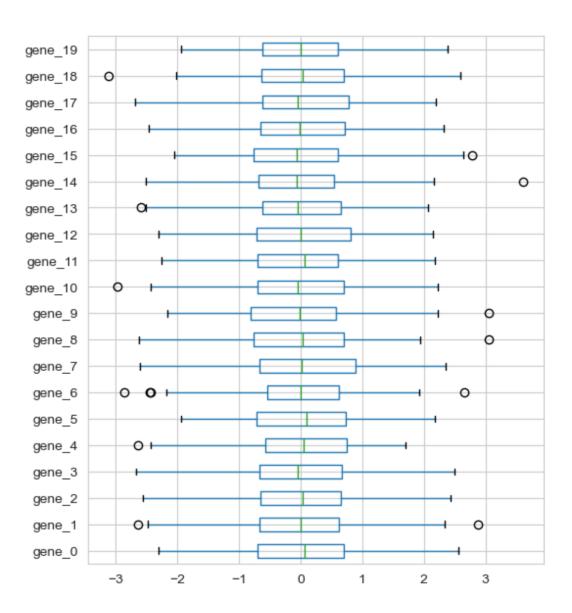
$$x_{norm} = rac{x - x_{min}}{x_{max} - x_{min}}$$

data normalization





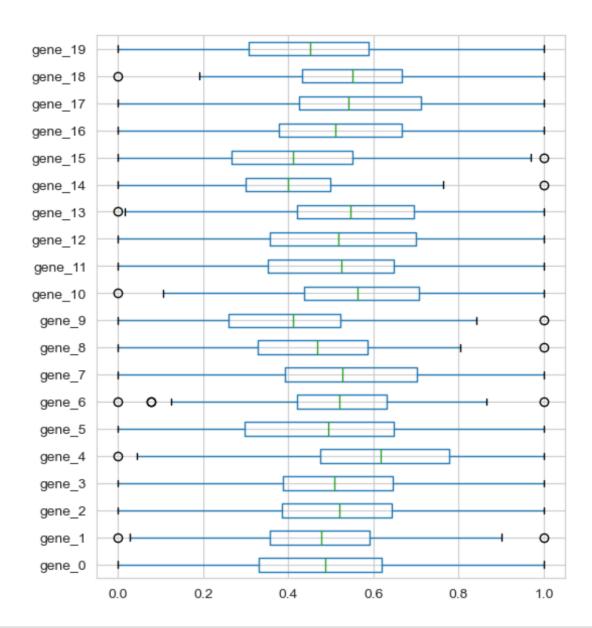
data normalization: standardization



$$x_{norm} = rac{x-\mu}{\sigma}$$



data normalization: min-max scaling



$$x_{norm} = rac{x - x_{min}}{x_{max} - x_{min}}$$

