



# Data Mining with Weka

## *Cross-validation*

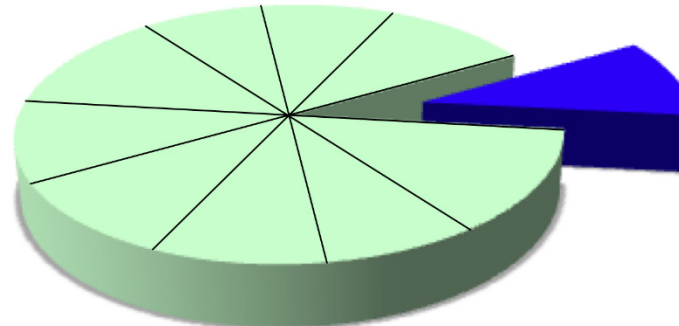
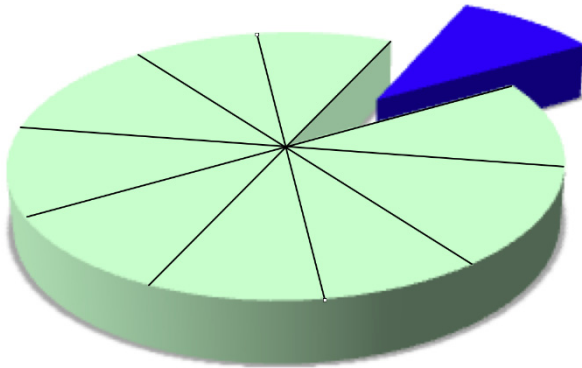
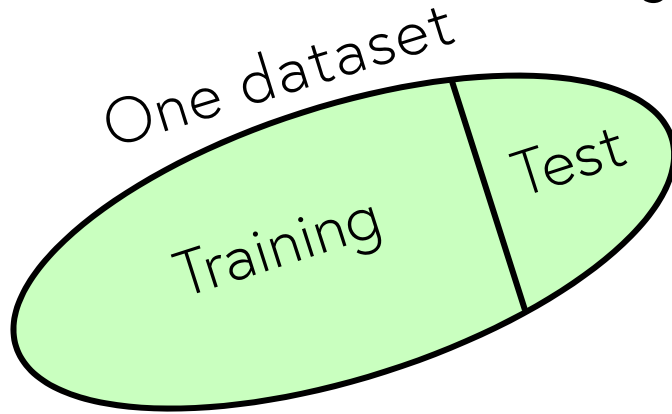
Ian H. Witten

# *Cross-validation*

- ❖ Can we improve upon repeated holdout?  
(i.e. reduce variance)
- ❖ Cross-validation
- ❖ Stratified cross-validation

# Cross-validation

- ❖ Repeated holdout  
(in "Repeated training and testing" lesson,  
hold out 10% for testing, repeat 10 times)

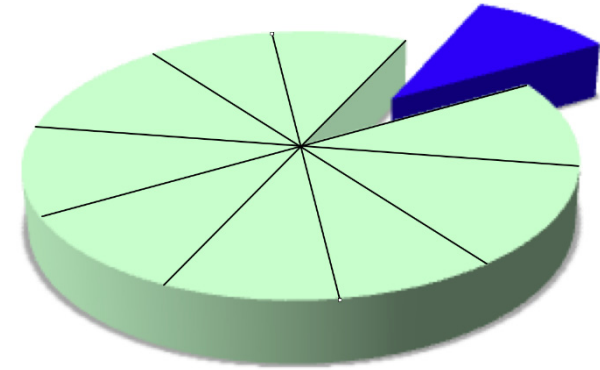


(repeat 10 times)

# Cross-validation

## 10-fold cross-validation

- ❖ Divide dataset into 10 parts (folds)
- ❖ Hold out each part in turn
- ❖ Average the results
- ❖ Each data point used once for testing, 9 times for training

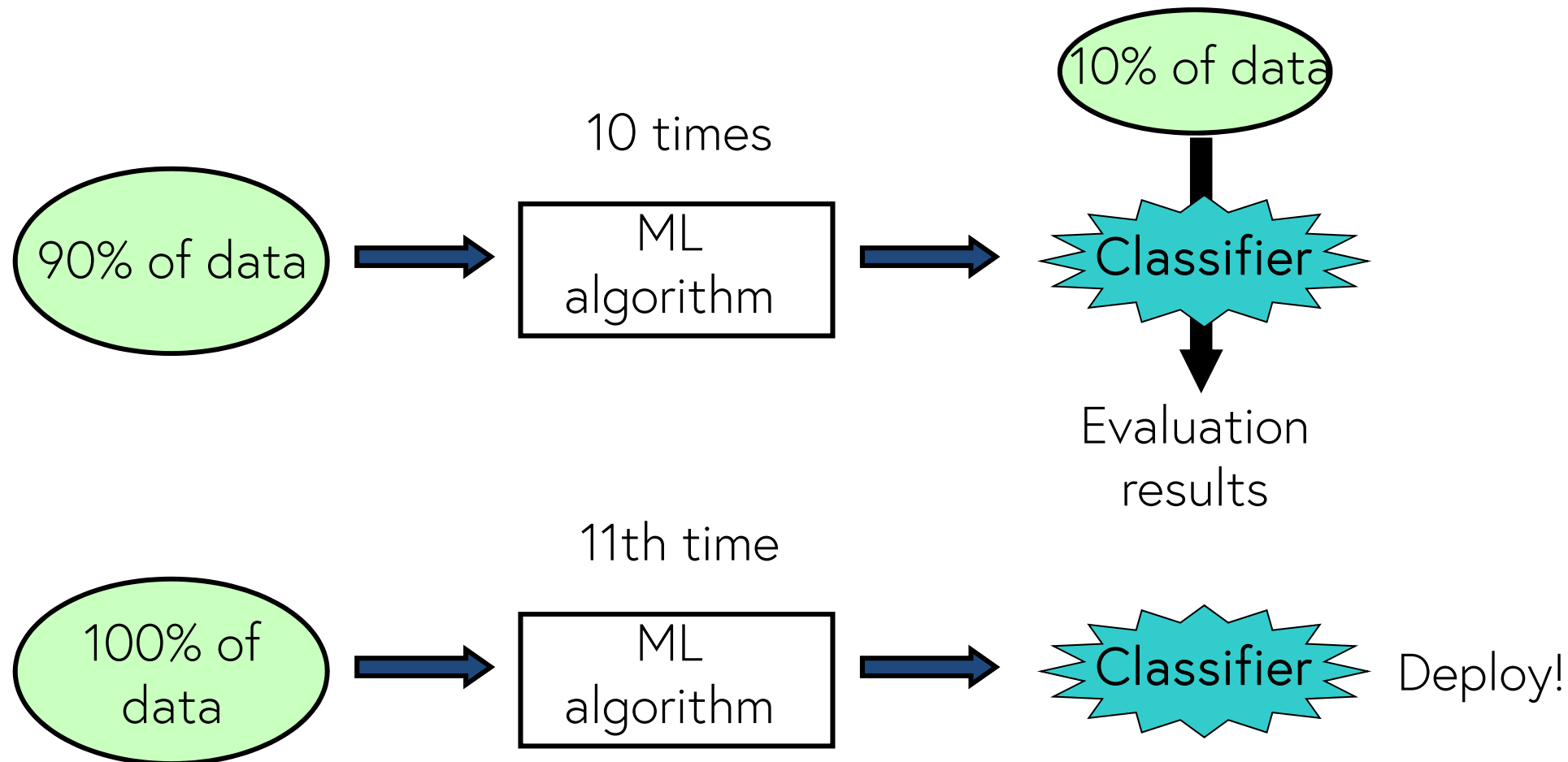


## *Stratified* cross-validation

- ❖ Ensure that each fold has the right proportion of each class value

## Cross-validation

After cross-validation, Weka outputs an extra model built on the entire dataset



# Cross-validation

- ❖ Cross-validation better than repeated holdout
- ❖ Stratified is even better
- ❖ With 10-fold cross-validation, Weka invokes the learning algorithm 11 times
- ❖ Practical rule of thumb:
  - Lots of data? – use percentage split
  - Else stratified 10-fold cross-validation