



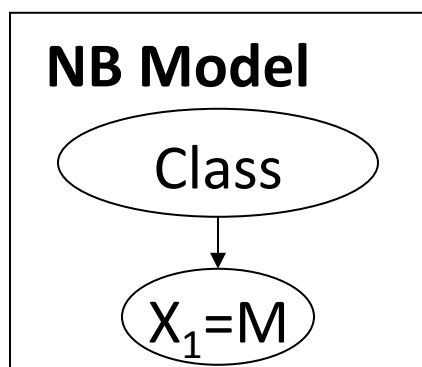
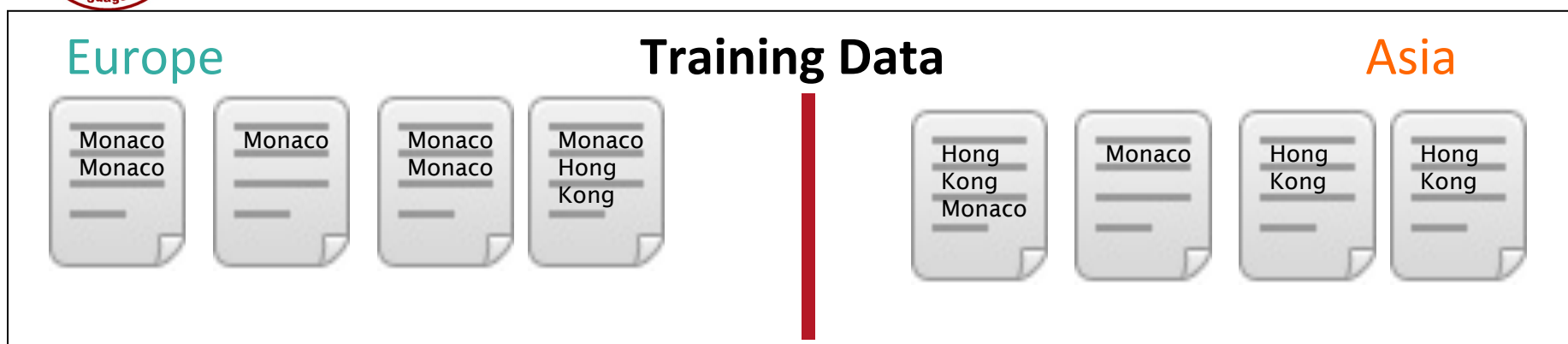
# Naive Bayes vs. Maxent models

Generative vs. Discriminative  
models: The problem of  
overcounting evidence

Christopher Manning



# Text classification: Asia or Europe



## NB FACTORS:

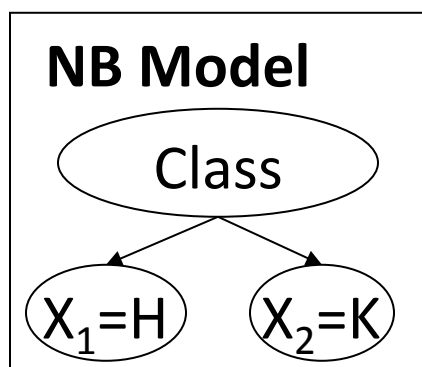
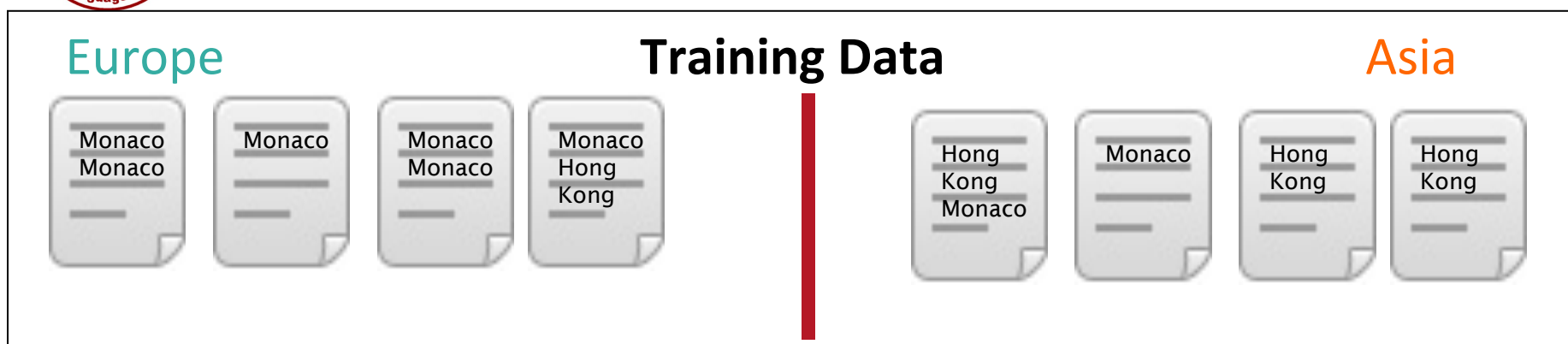
- $P(A) = P(E) =$
- $P(M|A) =$
- $P(M|E) =$

## PREDICTIONS:

- $P(A,M) =$
- $P(E,M) =$
- $P(A|M) =$
- $P(E|M) =$



# Text classification: Asia or Europe



## NB FACTORS:

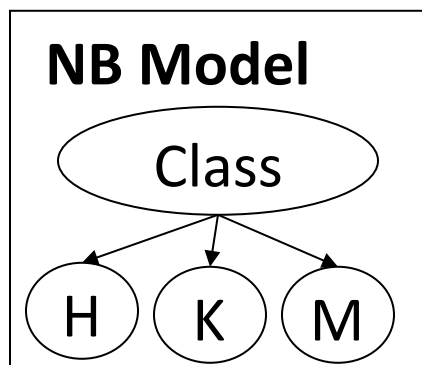
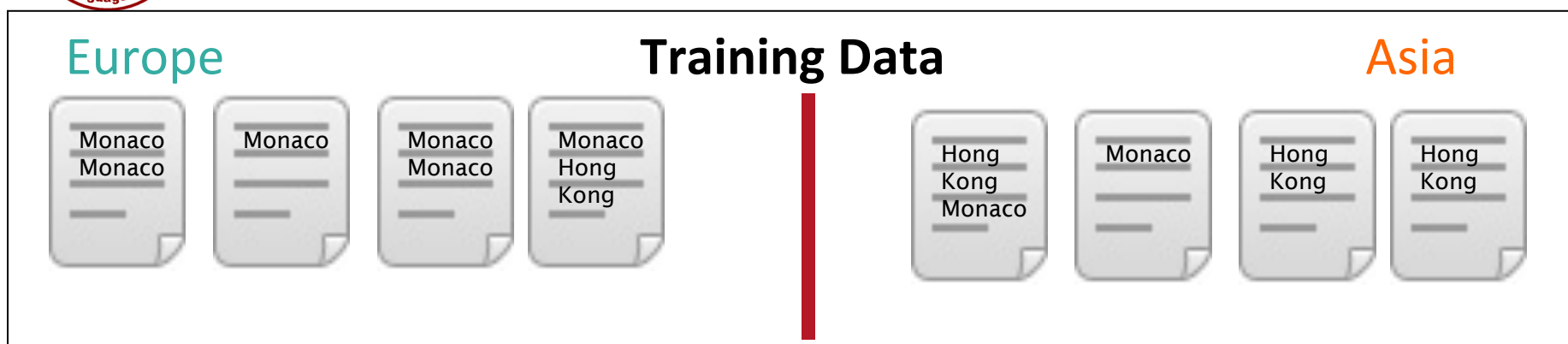
- $P(A) = P(E) =$
- $P(H|A) = P(K|A) =$
- $P(H|E) = P(K|E) =$

## PREDICTIONS:

- $P(A,H,K) =$
- $P(E,H,K) =$
- $P(A|H,K) =$
- $P(E|H,K) =$



# Text classification: Asia or Europe



## NB FACTORS:

- $P(A) = P(E) =$
- $P(M|A) =$
- $P(M|E) =$
- $P(H|A) = P(K|A) =$
- $P(H|E) = P(K|E) =$

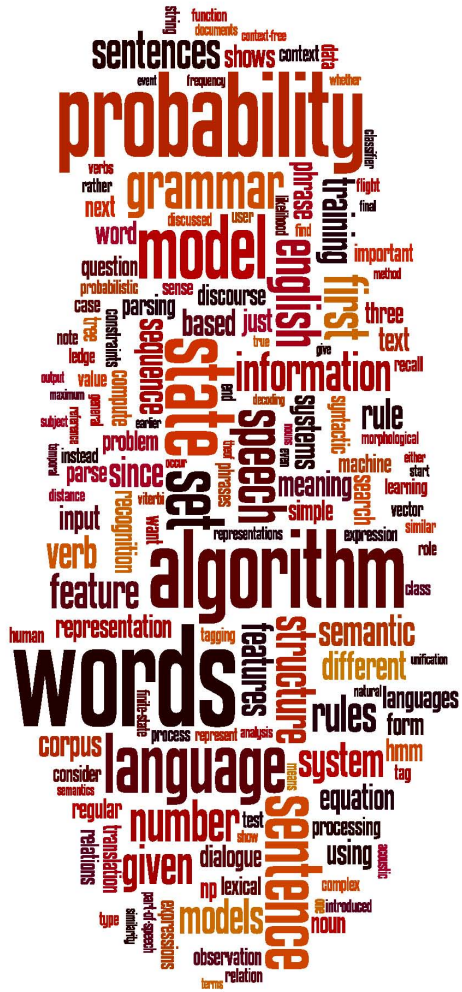
## PREDICTIONS:

- $P(A,H,K,M) =$
- $P(E,H,K,M) =$
- $P(A|H,K,M) =$
- $P(E|H,K,M) =$



# Naive Bayes vs. Maxent Models

- Naive Bayes models multi-count correlated evidence
  - Each feature is multiplied in, even when you have multiple features telling you the same thing
- Maximum Entropy models (pretty much) solve this problem
  - As we will see, this is done by weighting features so that model expectations match the observed (empirical) expectations



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