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# Generative Modeling: On Mixtures

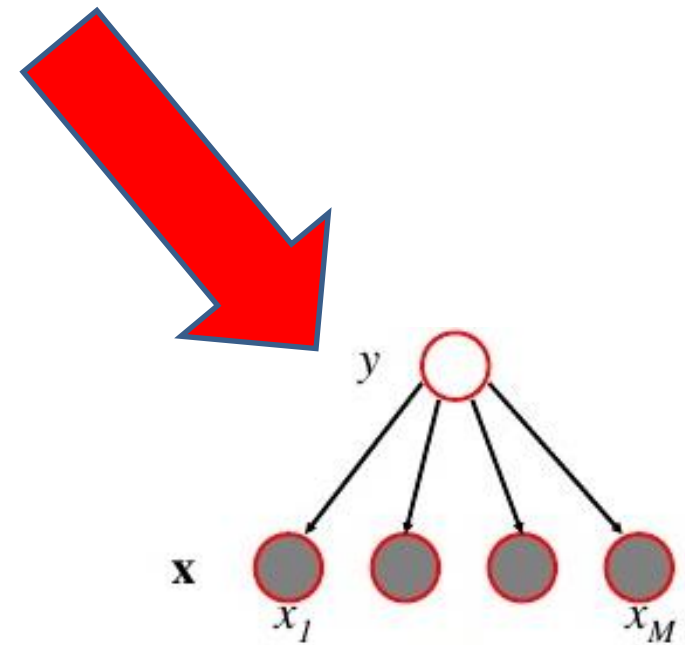
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Introduction to Machine Learning  
CSCI-635  
10/30/2023

# **First, Some Naïve Bayes Wrap-up!**

Class-Labeled Training Tuples from the *AllElectronics* Customer Database

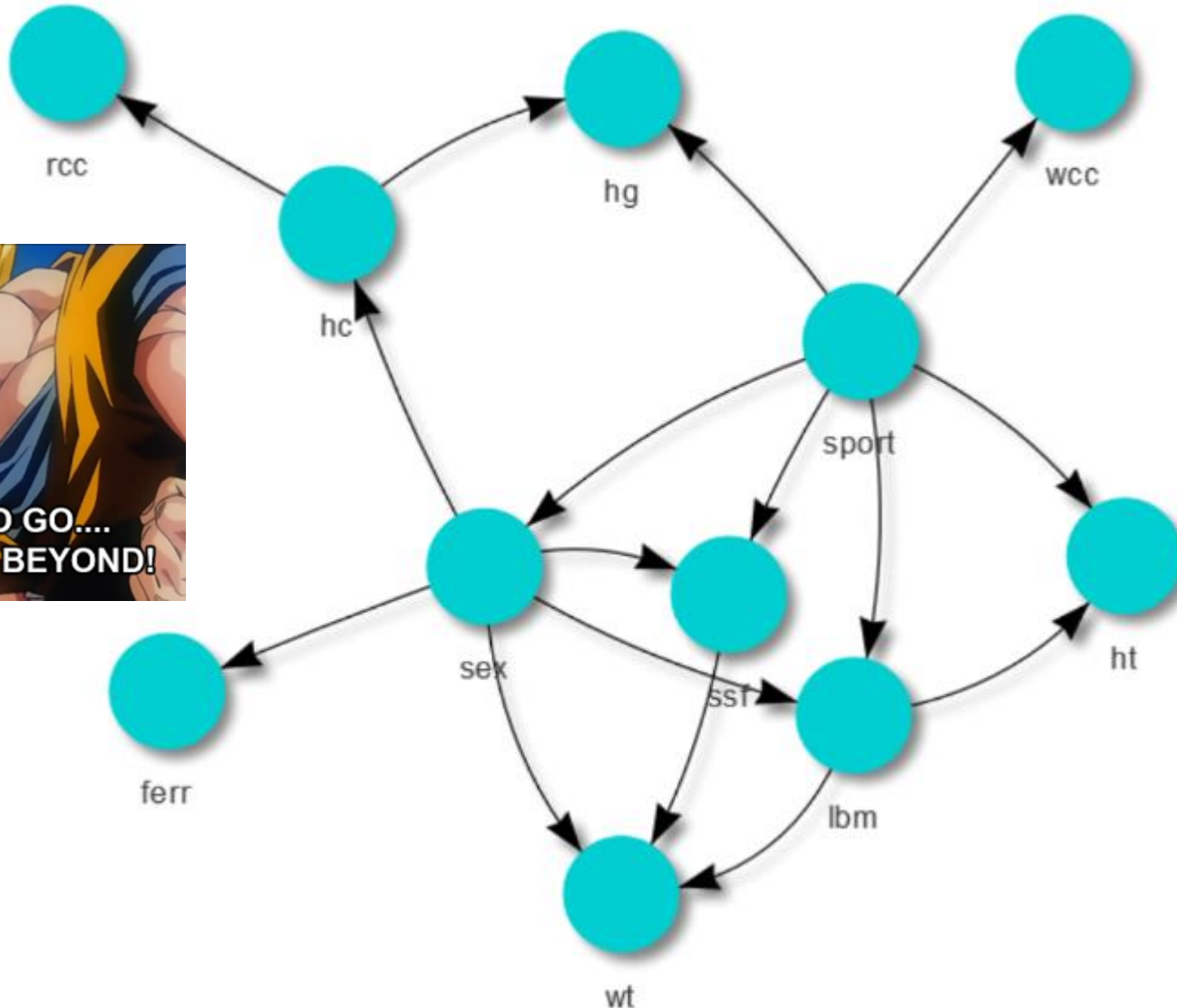
<i>RID</i>	<i>age</i>	<i>income</i>	<i>student</i>	<i>credit_rating</i>	<i>Class: buys_computer</i>
1	youth	high	no	fair	no
2	youth	high	no	excellent	no
3	middle_aged	high	no	fair	yes
4	senior	medium	no	fair	yes
5	senior	low	yes	fair	yes
6	senior	low	yes	excellent	no
7	middle_aged	low	yes	excellent	yes
8	youth	medium	no	fair	no
9	youth	low	yes	fair	yes
10	senior	medium	yes	fair	yes
11	youth	medium	yes	excellent	yes
12	middle_aged	medium	no	excellent	yes
13	middle_aged	high	yes	fair	yes
14	senior	medium	no	excellent	no



**White board time!** Hand calculations of the Naïve Bayes model with Laplacian smoothing!

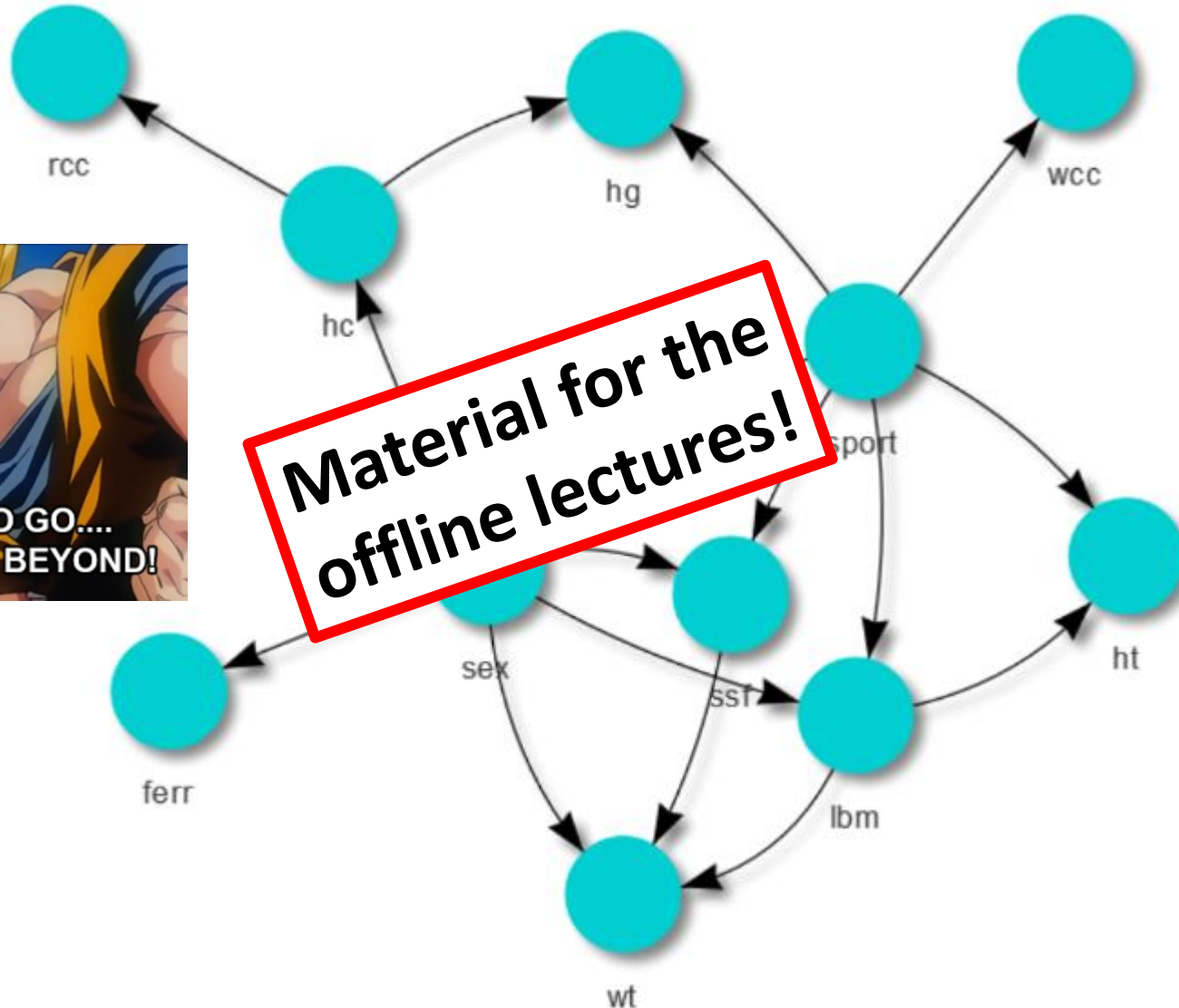
# What would be beyond Naïve Bayes?

**Answer:** Bayesian Networks



# What would be beyond Naïve Bayes?

**Answer:** Bayesian Networks



**Material for the  
offline lectures!**

# What is a Generative Model?

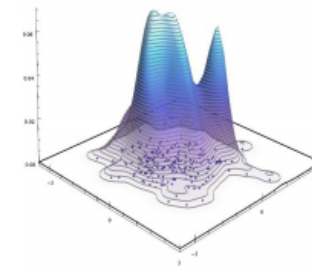
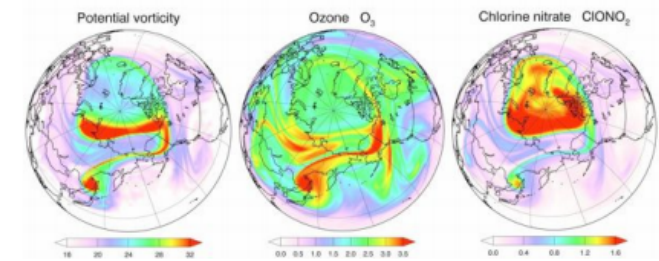
**A model that allows us to learn a simulator of data**

**Models that allow for (conditional) density estimation**

**Approaches for unsupervised learning of data**

Characteristics are:

- **Probabilistic** models of data that allow for uncertainty to be captured.
- **Data distribution  $p(\mathbf{x})$**  is targeted.
- **High-dimensional** outputs.



**NO LABELS**

# Beyond Classification

**Move beyond associating  
inputs to outputs**

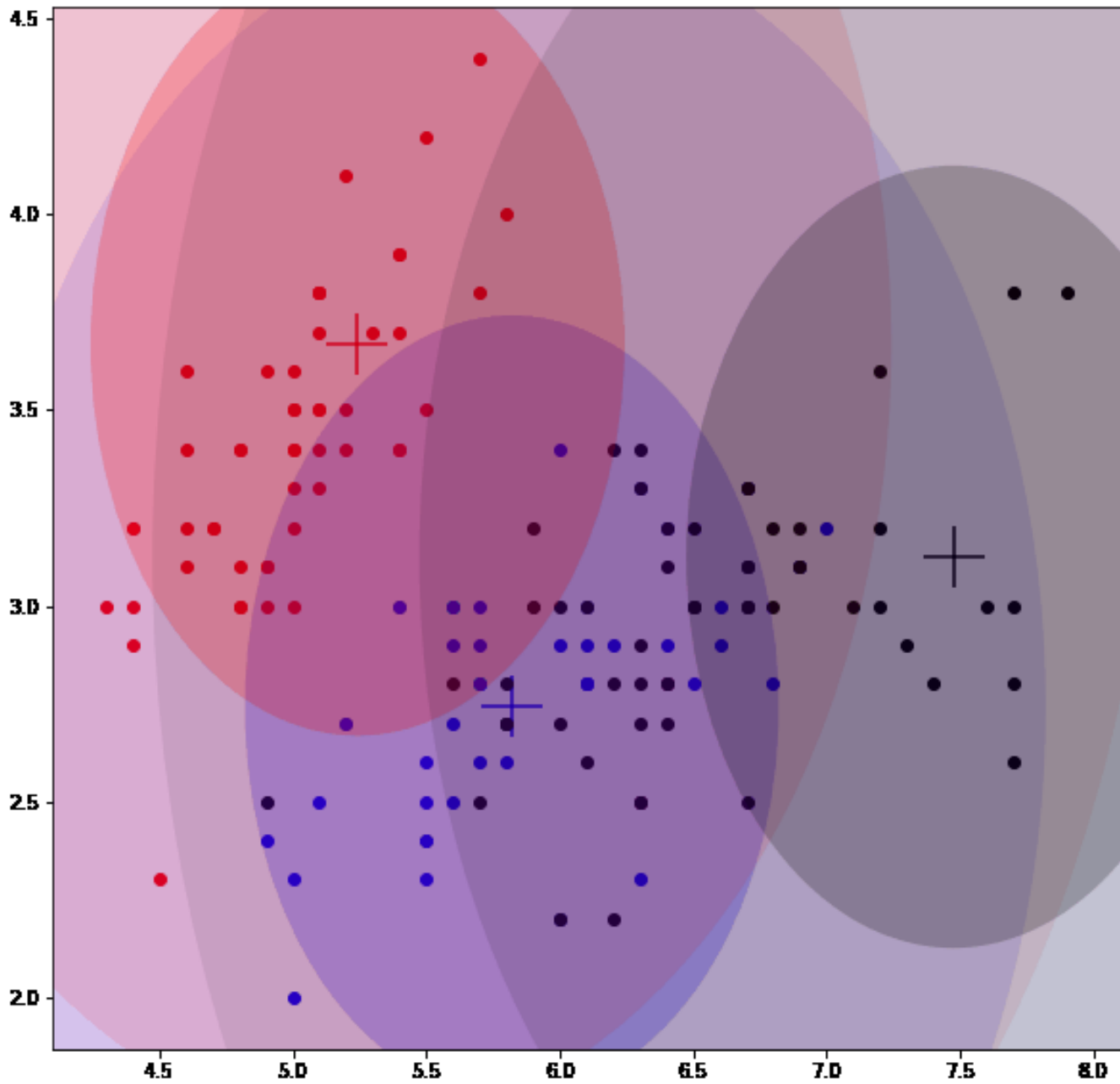
**Understand and imagine  
how the world evolves**

**Recognise objects in the  
world and their factors of  
variation**

**Detect surprising events in  
the world**

**Establish concepts as useful  
for reasoning and  
decision making**

**Anticipate and generate  
rich plans for the future**



**Unsupervised Generative Modeling!**



***White board time!*** Deriving/crafting  
a mixture of Gaussians model

# QUESTIONS?

