Meat N,Y	Crust D,S,T	Veg N,Y	Quality B,G,Gr
Y	Thin	N	Great
N	Deep	N	Bad
N	Stuffed	Y	Good
Y	Stuffed	Y	Great
Y	Deep	N	Good
Y	Deep	Y	Great
N	Thin	Y	Good
Y	Deep	N	Good
N	Thin	N	Bad

## Decision Tree Homework

$$Info(S) = -\sum_{i=1}^{|C|} p_i log_2 p_i$$

$$Info_A(S) = \sum_{j=1}^{|A|} \frac{|S_j|}{|S|} Info(S_j) = \sum_{j=1}^{|A|} \frac{|S_j|}{|S|} \cdot - \sum_{i=1}^{|C|} p_i log_2 p_i$$

- Finish the first level, find the best attribute and split
- Then find the best attribute for the left most node at the second level
  - Assume sub-nodes are sorted alphabetically left to right by attribute
  - Label any leaf nodes with their majority class
  - You could do the other nodes if you want for practice

Meat N,Y	Crust D,S,T	Veg N,Y	Quality B,G,Gr
Y	Thin	N	Great
N	Deep	N	Bad
N	Stuffed	Y	Good
Y	Stuffed	Y	Great
Y	Deep	N	Good
Y	Deep	Y	Great
N	Thin	Y	Good
Y	Deep	N	Good
N	Thin	N	Bad

## **Decision Tree Homework**

$$Info(S) = -\sum_{i=1}^{|C|} p_i log_2 p_i$$

$$Info_{A}(S) = \sum_{j=1}^{|A|} \frac{|S_{j}|}{|S|} Info(S_{j}) = \sum_{j=1}^{|A|} \frac{|S_{j}|}{|S|} \cdot - \sum_{i=1}^{|C|} p_{i} log_{2} p_{i}$$

- Info<sub>Meat</sub>(S) =  $4/9 \cdot (-2/4\log_2 2/4 2/4 \cdot \log_2 2/4 0 \cdot \log_2 0/4) + 5/9 \cdot (-0/5 \cdot \log_2 0/5 2/5 \cdot \log_2 2/5 3/5 \cdot \log_2 3/5) = .98$
- Info<sub>Crust</sub>(S) =  $4/9 \cdot (-1/4\log_2 1/4 2/4 \cdot \log_2 2/4 1/4 \cdot \log_2 1/4) + 2/9 \cdot (-0/2 \cdot \log_2 0/2 1/2 \cdot \log_2 1/2 1/2 \cdot \log_2 1/2) + 3/9 \cdot (-1/3 \cdot \log_2 1/3 1/3 \cdot \log_2 1/3 1/3 \cdot \log_2 1/3) = 1.41$
- Info<sub>Veg</sub>(S) =  $5/9 \cdot (-2/5\log_2 2/5 2/5 \cdot \log_2 2/5 1/5 \cdot \log_2 1/5) + 4/9 \cdot (-0/4 \cdot \log_2 0/4 2/4 \cdot \log_2 2/4 2/4 \cdot \log_2 2/4) = 1.29$
- Attribute with least remaining info is Meat

Meat N,Y	Crust D,S,T	Veg N,Y	Quality B,G,Gr
N	Deep	N	Bad
N	Stuffed	Y	Good
N	Thin	Y	Good
N	Thin	N	Bad

## Decision Tree Homework

$$Info(S) = -\sum_{i=1}^{|C|} p_i log_2 p_i$$

$$Info_A(S) = \sum_{j=1}^{|A|} \frac{|S_j|}{|S|} Info(S_j) = \sum_{j=1}^{|A|} \frac{|S_j|}{|S|} \cdot - \sum_{i=1}^{|C|} p_i log_2 p_i$$

- Left most node will be Meat = N containing 4 instances
- Info<sub>Crust</sub>(S) =  $1/4 \cdot (-1/1\log_2 1/1 0/1 \cdot \log_2 0/1 0/1 \cdot \log_2 0/1) + 1/4 \cdot (-0/1 \cdot \log_2 0/1 1/1 \cdot \log_2 1/1 0/1 \cdot \log_2 0/1) + 2/4 \cdot (-1/2 \cdot \log_2 1/2 1/2 \cdot \log_2 1/2 0/2 \cdot \log_2 0/2) = .5$
- Info<sub>Veg</sub>(S) =  $2/4 \cdot (-2/2\log_2 2/2 0/2 \cdot \log_2 0/2 0/2 \cdot \log_2 0/2) + 2/4 \cdot (-0/2 \cdot \log_2 0/2 2/2 \cdot \log_2 2/2 0/2 \cdot \log_2 0/2) = 0$
- Attribute with least remaining info is Veg which will split into two pure nodes labeled Bad and Good