## 36-350: Data Mining

Handout 15
October 15, 2003

More uses of trees
What split should be at the top of the tree?

| Predictor1 | Predictor2 | Response |
| :---: | :---: | :---: |
| 0.3 | 1.3 | 49 |
| 1.4 | 1.6 | 62 |
| 0.1 | 0.2 | 46 |
| 1.2 | 0.4 | 57 |

Interactions in the Housing data:


This tree has $R^{2}=0.84$, compared to 0.76 for linear regression. It correctly captures the many interactions in this data, for example the way that Low.Status changes the importance of Crime and Distance.

Does this data need an interaction term?


Trees are useful for constructing groups of cases whose response is similar and are easy to summarize (defined by a handful of attributes). This is better than partitioning according to the response (the groups need not be compact) or using k-means (the groups need not have different prices).


The tree groups are more distinct in price. Large and Midsize have been merged, and a new group called Midsize. 4 has been found.

Cars in Midsize.4:

|  | Type | Horsepower | Weight | Price |
| :--- | ---: | ---: | ---: | ---: |
| Ford Mustang | Sporty | 105 | 2850 | 15.9 |
| Dodge Spirit | Compact | 100 | 2970 | 13.3 |
| Volvo 240 | Compact | 114 | 2985 | 22.7 |
| Buick Century | Midsize | 110 | 2880 | 15.7 |
| Chevrolet Lumina | Midsize | 110 | 3195 | 15.9 |
| Dodge Dynasty | Midsize | 100 | 3080 | 15.6 |
| Hyundai Sonata | Midsize | 128 | 2885 | 13.9 |
| Oldsmobile Cutlass_Ciera | Midsize | 110 | 2890 | 16.3 |
| Volkswagen Eurovan | Van | 109 | 3960 | 19.7 |



| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | $\stackrel{\otimes}{0.0}$ |  | $\begin{aligned} & \frac{\mathrm{J}}{0} \\ & \frac{0}{0} \\ & 3 \end{aligned}$ |  | $\frac{5}{5}$ | $\begin{aligned} & \text { 등 } \\ & \stackrel{0}{0} \end{aligned}$ |  |  |  |



Midsize. 4 is an odd collection of cars-they are heavy but have low horsepower, with a price that reflects both. It is surprising to see the Ford Mustang here. It turns out that in 1993, Ford offered the "Mustang LX", a sporty-looking but low-powered car which capitalized on the Mustang image. It was discontinued the following year.

## References

[1] "Fleet Uses CART Data Mining Technology to Understand Customer Characteristics and Habits." http://www.salford-systems.com/appstories.html\#fleet

