Election

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Step 1. Data merging and cleaning.

##
Perl XLSX support libraries successfully installed.

Step 5. Final Report

1. Introduction

The goal of this project was to analyze past election results data and attempt to draw meaningful conclusions and correlations from exploring the aforementioned data.

Our data came from six distinct sources with four sources accounting for each of the vote results for a given election year (2004, 2008, 2012, 2016), 2010 census data for all counties, and latitude and longitude values for every county as well. After extracting the data from all the sources, they were merged into a larger dataframe using R. This activity presented several challenges such as the absence of data for some years. For example, the 2004 election year lacked data for the state of Virginia, among others. Further, the merging of the data occured on (state, countyname) pairs which presented challenges that involved standardizing disparate uses names between different counties.

Exploratory data analysis was performed on the data in order to find interesting relationships across years and based on the counties 2010 census attributes. The plots and exact relationships uncovered are elaborted at length below. In particular, an informative map of the recent election results is included.

In an attempt to use the gathered data in a predictive sense, our team created two predictors using two separate methods: recursive partitioning and k-nearest neighbors. The recursive partitioning predictor was used for the 2016 election results and the k-nn predictor was trained on the 2012 results and tested on the 2016 election results. A more elaborate comparison of where the particulars did well and how they compared to each other follows.

Note: Since we used "installXLSXsupport()" to read xlsx file. Your computer need to have java and perl to fully see our data frame

2. Data Description

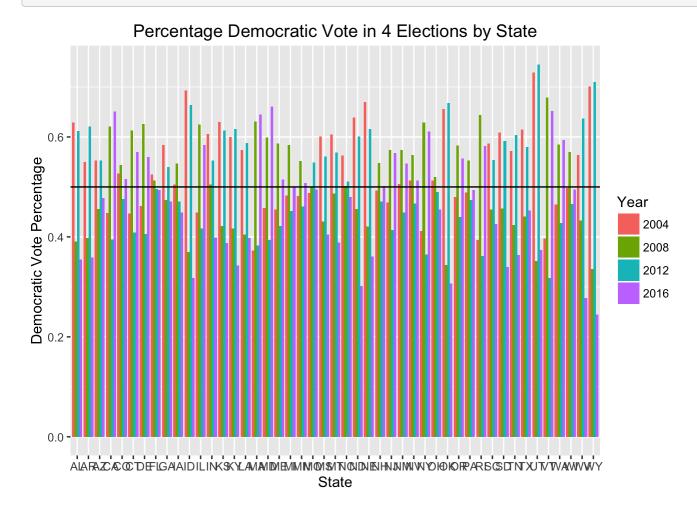
The first plot that was created to explore the final set of data was a plot of the percentage of Democratic votes for each state for each given election year. From the plot, we can assume that the party had the majority votes(more than 50%) won the state. In 2004, Democrat wins 27 states, in 2008 and 2012 Democrat won 22 states, and in 2016, Democrat won 16 states. Based on history, the 2004 and 2016 elected president was both Republican. However, Democrat won the 2004 votes state-wise but lost in 2016. Therefore, our assumption is not correct all the time.

This emphasizes the importance of winning the necessary amount of electoral votes through winning the appropriate counties. The reason our team found this data and finding interesting in terms of the elections of the past 4 years is because we believe it highlights a rhetoric often discussed about the electoral system in America. That is, does the electoral system in America underrepresent the governing bodies of the state in favor of winning incredibly populous counties. The concern is the diminishment of the value of less populous state opinions, which are often mostly cohesive. After all, it can be seen from the plot that the presidency can be won without a majority of the states such as in 2004, 2008, and 2012.

Note that Virginia, DC, and Hawaii were removed in the creation of this plot because of a lack of 2004 election data.

```
require(ggplot2)
# democrate votes change in 4 elections
plot1dataframe= bigDF[,seq(1:10)]
{\tt names(plot1dataframe)=c("A","B", "C", "D","E","F","G","H","I","J")}
total.de.2016 = aggregate(C~A, plot1dataframe, sum)
total.re.2016 = aggregate(D~A, plot1dataframe, sum)
total.de.2012 = aggregate(E~A, plot1dataframe, sum)
total.re.2012 = aggregate(F~A, plot1dataframe, sum)
total.de.2008 = aggregate(G~A, plot1dataframe, sum)
total.re.2008 = aggregate(H~A, plot1dataframe, sum)
total.de.2004 = aggregate(I~A, plot1dataframe, sum)
total.re.2004 = aggregate(J~A, plot1dataframe, sum)
total.de.2016 = total.de.2016[!total.de.2016$A %in% c("DC", "HI", "VA"),]
total.re.2016 = total.re.2016[!total.re.2016$A %in% c("DC", "HI", "VA"),]
total.de.2012 = total.de.2012[!total.de.2012$A %in% c("DC", "HI", "VA"),]
total.re.2012 = total.re.2012[!total.re.2012$A %in% c("DC", "HI", "VA"),]
total.de.2008 = total.de.2008[!total.de.2008$A %in% c("DC", "HI", "VA"),]
total.re.2008 = total.re.2008[!total.re.2008$A %in% c("DC", "HI", "VA"),]
total.de.2004 = total.de.2004[!total.de.2004$A %in% c("DC", "HI", "VA"),]
total.re.2004 = total.re.2004[!total.re.2004$A %in% c("DC", "HI", "VA"),]
countsplot1= data.frame(total.de.2016,total.de.2012,total.de.2008,total.de.2004,total.re.2016,
total.re.2012,total.re.2008,total.re.2004)
countsplot1=countsplot1[-seq(from=3, to=16,by=2)]
names(countsplot1)=c("State", "2016 dem Votes", "2012 dem Votes", "2008 dem Votes", "2004 dem
Votes", "2016 rep Votes", "2012 rep Votes", "2008 rep Votes", "2004 rep Votes")
countsplot1$'2016 total' = countsplot1$'2016 dem Votes' + countsplot1$'2016 rep Votes'
countsplot1$'2012 total' = countsplot1$'2012 dem Votes' + countsplot1$'2012 rep Votes'
countsplot1$'2008 total' = countsplot1$`2008 dem Votes` + countsplot1$`2008 rep Votes`
countsplot1$'2004 total' = countsplot1$`2004 dem Votes` + countsplot1$`2004 rep Votes`
step1 = cbind(countsplot1[,c(1,2,10)],data.frame(rep(2016, nrow(countsplot1))))
step2 = cbind(countsplot1[,c(1,3,11)],data.frame(rep(2012, nrow(countsplot1))))
step3 = cbind(countsplot1[,c(1,4,12)],data.frame(rep(2008, nrow(countsplot1))))
step4 = cbind(countsplot1[,c(1,5,13)],data.frame(rep(2004, nrow(countsplot1))))
demTotal1 = cbind(step1[,1], data.frame(step1[,2]/step1[,3]),step1[,4])
demTotal2 = cbind(step2[,1], data.frame(step2[,2]/step2[,3]),step2[,4])
demTotal3 = cbind(step3[,1], data.frame(step3[,2]/step3[,3]),step3[,4])
demTotal4 = cbind(step4[,1], data.frame(step4[,2]/step4[,3]),step4[,4])
names(demTotal1) = c("State", "PerDem", "Year")
names(demTotal2) = c("State", "PerDem", "Year")
names(demTotal3) = c("State", "PerDem", "Year")
names(demTotal4) = c("State", "PerDem", "Year")
newDF = rbind(demTotal1,demTotal2,demTotal3,demTotal4)
plot1=ggplot(data=newDF, aes(x=State, y = PerDem, fill=factor(Year))) + geom_bar(stat="identit
y", position="dodge")+geom_hline(aes(yintercept=0.5)) + guides(fill=guide_legend(title="Year")
) + labs(title="Percentage Democratic Vote in 4 Elections by State", y = "Democratic Vote Perc
```

entage")
plot1



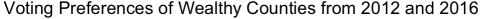
Our group wanted to see how wealthy is going to affect voting preferences. So we examed the top 20 counties wealthiest counties by our metric. To calculate the wealth level for a given county, we leveraged the 2010 census data. The 2010 census data includes population counts for people in various income brackets. The wealth number for a county was calculated taking the total percentage of residents occupying the lowest income bracket on the census (less than \$10,000) subtracted by the total percantage of residents occupying the highest income bracket on the census (greater than \$200,000). If the number for a county was negative, it indicated a predominantly wealthy county. The converse of the prior statement is also true.

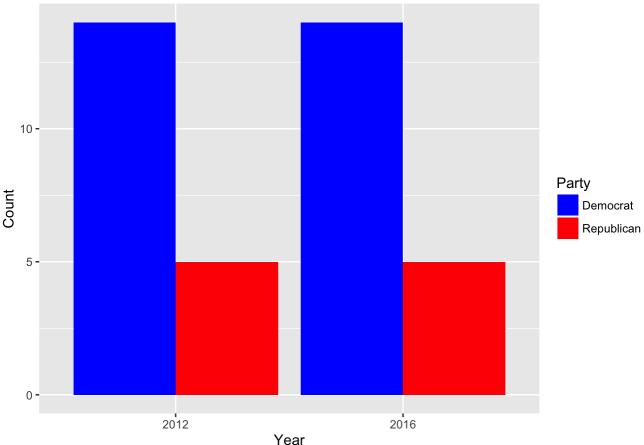
After finding the top 20 wealthiest counties by this metric, we analyzed the vote numbers for these counties for the election years 2012 and 2016 to see how they voted. Our results were that 15 of the counties voted Democrat and 5 voted Republican. Still, the results are mostly obersvational and merely describe a correlation. It could be the fact that most of the states of the counties represent often vote in such a direction. That is, it is unsurprising that the California counties included in the results voted Democrat or that the Texas counties voted Republican, regardless of their score on our team's wealth metric.

In fact, perhaps the most interesting result stems from observing the dataframe itself. When analyzing the top 20 wealthy counties that cast a vote separate from the way their state voted in the elections, we observe that more counties cast a vote for the Republican candidate, particularly in the counties of New Jersey. This may indicate that despite the results of the plot below, wealthy counties may actually correlate towards voting Republican even in predominantly Democratic states.

Voting Preferences if Wealthy Counties from 2012 and 2016

```
incomeDF2012= bigDF[,c("State","County","HC01_VC74","HC01_VC75","HC01_VC84.y","2016 Trump Vote
s","2016 Clinton Votes","2012 Republican Votes", "2012 Democrat Votes")]
incomeDF2012=incomeDF2012[c(-2878,-2875,-2876),]
names(incomeDF2012)=c("State", "County", "total", "less", "more", "rep2016", "dem2016", "rep2012", "
dem2012")
incomeDF2012$less= incomeDF2012$less/ incomeDF2012$total
incomeDF2012$more= incomeDF2012$more/ incomeDF2012$total
incomeDF2012$diff= incomeDF2012$less - incomeDF2012$more
incomeDF2012 = incomeDF2012[c(order(incomeDF2012$diff)),]
refinedDF2012= head(incomeDF2012, n=28)
refinedDF2012 = refinedDF2012[refinedDF2012$County!='fairfax',]
refinedDF2012 = refinedDF2012[c(-1),]
refinedDF2012$voted2012 = refinedDF2012$rep2012 > refinedDF2012$dem2012
refinedDF2012$voted2012[refinedDF2012$voted2012 == FALSE] = 'Democrat'
refinedDF2012$voted2012[refinedDF2012$voted2012 == TRUE] = 'Republican'
refinedDF2012$voted2016 = refinedDF2012$rep2016 > refinedDF2012$dem2016
refinedDF2012$voted2016[refinedDF2012$voted2016 == FALSE] = 'Democrat'
refinedDF2012$voted2016[refinedDF2012$voted2016 == TRUE] = 'Republican'
plot2DF = data.frame(as.factor(c(2016,2016,2012,2012)), c(length(grep("Democrat",refinedDF2012
$voted2016)),length(grep("Republican",refinedDF2012$voted2016)),length(grep("Democrat",refined
DF2012$voted2012)),length(grep("Republican",refinedDF2012$voted2012))),c('Democrat','Republica
n','Democrat','Republican'))
names(plot2DF) = c("Year", "Count", "Party")
plot2=ggplot(data=plot2DF, aes(x=Year, y=Count, fill=Party)) + geom_bar(stat="identity", posit
ion="dodge")+ggtitle("Voting Preferences of Wealthy Counties from 2012 and 2016")+scale_fill_m
anual(values = c(Democrat="blue",Republican="red"))
plot2
```





In plot 3, our team tried to find the relationship between percentage of 2012 votes and percentage of unemployment rate by county. We first make a data frame "employmentDF" by using our primary dataframe bigDF by picking up employment status "HC01_VC06, HC01_VC07, HC01_VC08", "2016 Trump Votes", "2016 Clinton Votes", "2012 Republican Votes" and "2012 Democrat Votes" to implement our data analysis.

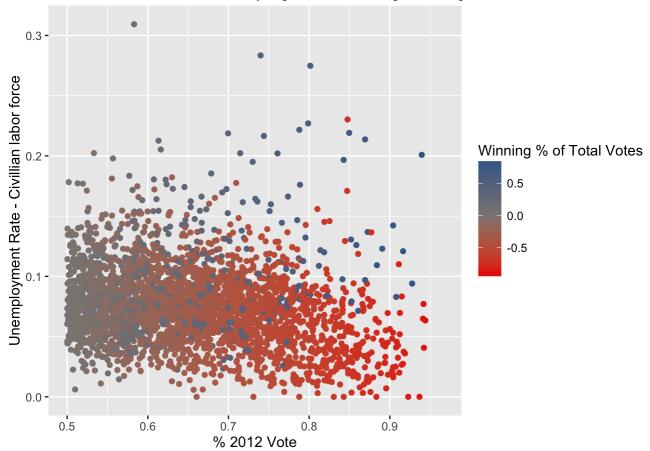
Right next, our team added three elements to the data frame "unem.rate.2012, dem.per.2012 and rep.per.2012", which stand for unemployment rate(use formula unemployed population/ total population), percentage of democrats voters and percentage of republican voters for year 2016 and 2012. "winner.per.2012" element in the dataframe stands for the winner of election year 2012. Also, we basically follow the same step for election year 2016. We decided to make a scatter plots because each jitter point with different color will better represent votes of each county of interest. We decide to compare scatter plots of 2016 and 2012 to draw a conclusion. In each graph, every county is a point, x is percentage of democrats or republican votes of a specific county, y is unemployment rate of the county, grouping is color by "total.per.2012", which is the percentage of democrats votes – percentage of republican votes.

2 plots displayed similar distribution of the colored dot. Red dot, representing county where republic wins over democrats, are concentrated on middle and right region of graph. Blue color dot, representing county where democrats wins , are concentrated on the left region of graph.

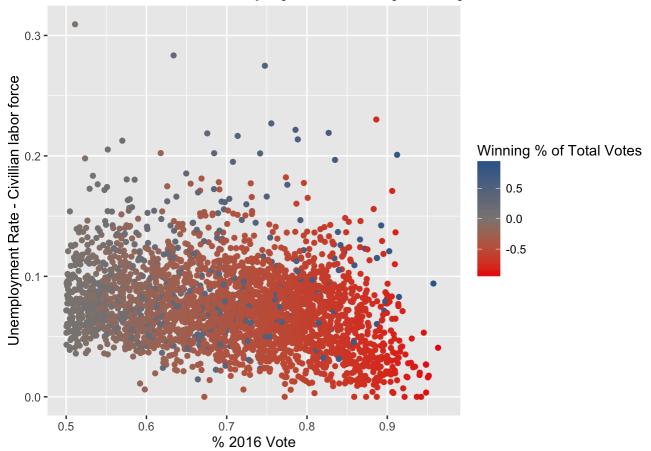
```
# unemplo vs employed
# HC01_VC06,Estimate; EMPLOYMENT STATUS - In labor force - Civilian labor force
# HC01_VC07,Estimate; EMPLOYMENT STATUS - In labor force - Civilian labor force - Employed
# HC01_VC08,Estimate; EMPLOYMENT STATUS - In labor force - Civilian labor force - Unemployed
employmentDF = bigDF[,c("State","County","HC01_VC06","HC01_VC07","HC01_VC08","2016 Trump Votes
","2016 Clinton Votes","2012 Republican Votes", "2012 Democrat Votes")]
names(employmentDF) = c("State","County", "Total","Employed","Unemployed","2016 rep","2016 dem
","2012 rep","2012 dem")
employmentDF$unem.rate = employmentDF$Unemployed / employmentDF$Total
```

```
employmentDF$dem.per.2012 = employmentDF$`2012 dem`/(employmentDF$`2012 dem` + employmentDF$`2
012 rep`)
employmentDF$rep.per.2012 = employmentDF$`2012 rep`/(employmentDF$`2012 dem` + employmentDF$`2
012 rep`)
# positive value indicates democratic vote, negative value indicates republican vote
# magnitude is the severity of the victory
employmentDF$total.per.2012 = employmentDF$dem.per.2012 - employmentDF$rep.per.2012
# has the percentage value of the winner
employmentDF$winner.per.2012 = pmax(employmentDF$dem.per.2012, employmentDF$rep.per.2012)
employmentDF$dem.per.2016 = employmentDF$`2016 dem`/(employmentDF$`2016 dem` + employmentDF$`2
016 rep`)
employmentDF$rep.per.2016 = employmentDF$`2016 rep`/(employmentDF$`2016 dem` + employmentDF$`2
016 rep`)
# positive value indicates democratic vote, negative value indicates republican vote
# magnitude is the severity of the victory
employmentDF$total.per.2016 = employmentDF$dem.per.2016 - employmentDF$rep.per.2016
# has the percentage value of the winner
employmentDF$winner.per.2016 = pmax(employmentDF$dem.per.2016, employmentDF$rep.per.2016)
# scatterplot, every county is a point, x is % dem/rep vote, y is unemployment rate, grouping
is color by dem/rep vote?
#2012
ggplot(data=employmentDF) + geom_point(mapping = aes(x = winner.per.2012, y = unem.rate, color
= total.per.2012)) + xlab("% 2012 Vote") + ylab("Unemployment Rate - Civillian labor force")
+ ggtitle("% of 2012 Vote and Unemployment Rate by County") + theme(plot.title = element_text(
face="bold")) + scale_colour_gradient2(name="Winning % of Total Votes ",low="#E91D0E", mid="se
ashell4", high="#336699", midpoint = 0)
```

% of 2012 Vote and Unemployment Rate by County



% of 2016 Vote and Unemployment Rate by County

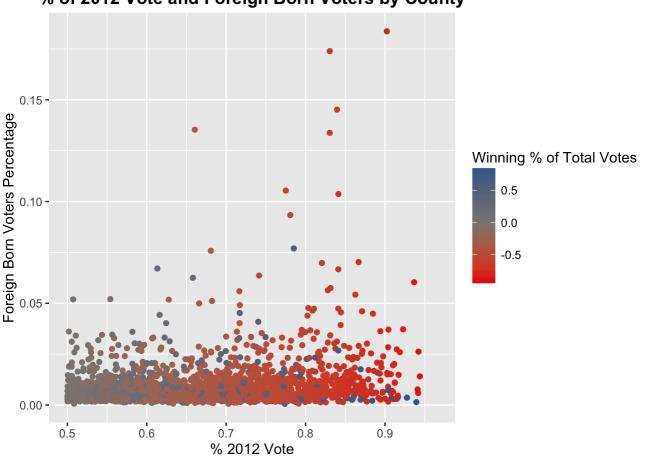


In plot 4, our team tried to find difference between native voters and non-native voters by county. And we compare this in two election years, 2016 and 2012. And we compare this relationship in two election years, 2016 and 2012. We first make a dataframe "birthDF" by using our primary dataframe "bigDF" and picking up residency and birth status "HC01 VC128, HC01 VC129 HC02 VC134", "2016 Trump Votes", "2016 Clinton Votes", "2012 Republican Votes" and "2012 Democrat Votes" to implement our data analysis. Each year, we first calculate percentage of votes of each party by county. We sort winner party by using "pmax" function on the comparison of percentage of democrats votes and republican votes. And in the graph, republican-win county is represented by red dot and democrats-win county are represented by blue dot. We basically follow the same step for 2 election tears. We decided to make a scatter plots because each jitter point with different color will better represent votes of each county of interest. Apparently it we can tell by how much more votes approximately a party wins over the other party in each election within county. We decide to compare scatter plots of 2016 and 2012 to draw a conclusion. In each graph, every county is a point, x is by how many percent of votes a party win over the others, y foreign born voters percentage of county, grouping is color by "total.per.2012 and total.per.2016", which is the percentage of democrats votes minors percentage of republican votes in 2 election years. 2 plots displayed similar distribution of the colored dot. Red dot, representing county where republic wins over democrats, are concentrated on middle and right region of graph. Blue color dot, representing county where democrats wins, are concentrated on the left region of graph. In 2 election years, scatters are both staying majorly at the bottom. It could be because of the fact the non-native voter's population percentage are fairly low in each county. Or maybe voting right are primarily reserved to native American voters. Interestingly, outliers with higher non-native vote rate are largely republican-win county.

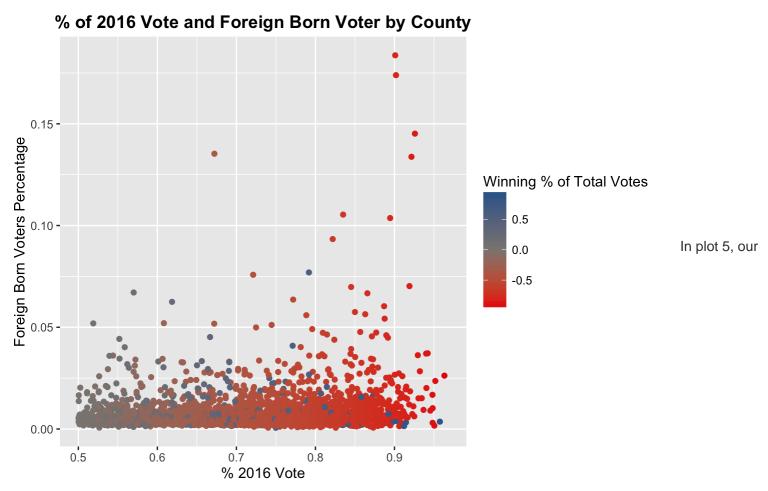
```
# native vs non-native
# HC01_VC128,Estimate; PLACE OF BIRTH - Total population
# HC01_VC129,Estimate; PLACE OF BIRTH - Native
# HC01_VC130,Estimate; PLACE OF BIRTH - Native - Born in United States
```

```
birthDF = bigDF[,c("State", "County", "HC01_VC128", "HC01_VC129", "HC02_VC134", "2016 Trump Votes",
"2016 Clinton Votes", "2012 Republican Votes", "2012 Democrat Votes")]
names(birthDF) = c("State", "County", "Total", "Native", "Fborn", "2016 rep", "2016 dem", "2012 rep"
,"2012 dem")
birthDF$fborn.rate= birthDF$Fborn/ birthDF$Total
birthDF$dem.per.2012 = birthDF$`2012 dem`/ (birthDF$`2012 dem`+ birthDF$`2012 rep`)
birthDF$rep.per.2012 = birthDF$`2012 rep`/ (birthDF$`2012 dem`+ birthDF$`2012 rep`)
birthDF$dem.per.2016 = birthDF$`2016 dem`/ (birthDF$`2016 dem`+ birthDF$`2016 rep`)
birthDF$rep.per.2016 = birthDF$`2016 rep`/ (birthDF$`2016 dem`+ birthDF$`2016 rep`)
birthDF$total.per.2012 = birthDF$dem.per.2012 - birthDF$rep.per.2012
birthDF$winner.per.2012 = pmax(birthDF$dem.per.2012, birthDF$rep.per.2012)
birthDF$total.per.2016 = birthDF$dem.per.2016 - birthDF$rep.per.2016
# has the percentage value of the winner
birthDF$winner.per.2016 = pmax(birthDF$dem.per.2016, birthDF$rep.per.2016)
#2012
ggplot(data=birthDF) + geom_point(mapping = aes(x = winner.per.2012, y = fborn.rate, color = t
otal.per.2012)) + xlab("% 2012 Vote") + ylab("Foreign Born Voters Percentage") + ggtitle("% of
 2012 Vote and Foreign Born Voters by County") + theme(plot.title = element_text(face="bold"))
 + scale_colour_gradient2(name="Winning % of Total Votes ",low="#E91D0E", mid="seashell4", hi
gh = "#336699", midpoint = 0)
```

% of 2012 Vote and Foreign Born Voters by County



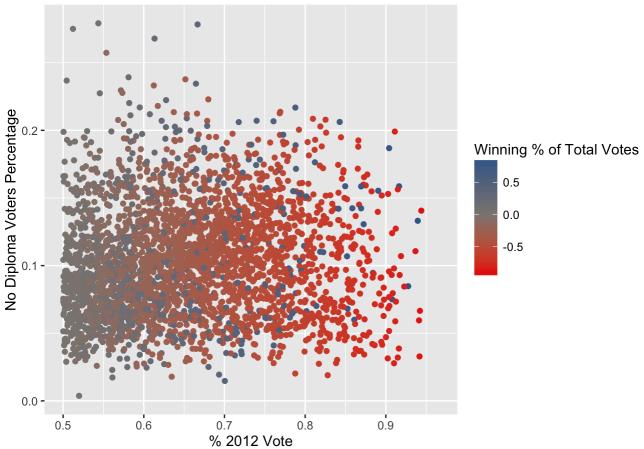
#2016
ggplot(data=birthDF) + geom_point(mapping = aes(x = winner.per.2016, y = fborn.rate, color = t
otal.per.2016)) + xlab("% 2016 Vote") + ylab("Foreign Born Voters Percentage") + ggtitle("% of
2016 Vote and Foreign Born Voter by County") + theme(plot.title = element_text(face="bold"))
+ scale_colour_gradient2(name="Winning % of Total Votes ",low="#E91D0E", mid="seashell4", hig
h="#336699", midpoint = 0)



team tried to find how under-high-school degree voters differ from bachelor degree voters by county. And we compare this in two election years, 2016 and 2012. And we compare this relationship in two election years, 2016 and 2012. We first make a dataframe "educationDF" by using our primary dataframe "bigDF" and picking up "State", "County", "Total Underhigh-school and Bachelor population", "Under-high-school population", "Bachelor population" 2016 Trump Votes", "2016 Clinton Votes", "2012 Republican Votes" and "2012 Democrat Votes" to implement our data analysis. In each county, we calculate proportion of under-high-school voters and bachelor degree voters in each county. Each year, we first calculate percentage of votes of each party by county. We sort winner party by using "pmax" function on the comparison of percentage of democrats votes and republican votes. And in the graph, republican-win county is represented by red dot and democrats-win county are represented by blue dot. We basically follow the same step for 2 election tears. Every county is a point, x is by how many percent of votes a party win over the others, y percentage of under-high-school voters or percentage of bachelor-degree voters, grouping is color by "total.per.2012 and total.per.2016", which is the percentage of democrats votes minors percentage of republican votes in 2 election years. Red dot, representing county where republic wins over democrats, are concentrated on middle and right region of graph. Blue color dot, representing county where democrats wins, are concentrated on the left region of graph. In comparison between percentage of under-high-school voters and bachelor degree voters of 2012, we can't draw any conclusion for democrats-win county, for scatters of which stay in similar region. For republican-win county, there are more higher scatters on graph with bachelor degree compared to graph with under-high-school. Conclusion can be made that high education voters are more in favor of republican. Whereas at 2016, there're more proportion of under-high-school in republican-win county.

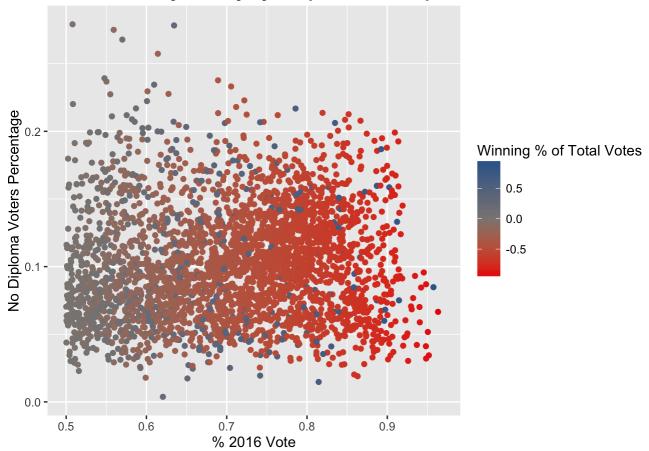
```
# 9-12 vs bachelor dooooone
educationDF = bigDF[,c("State","County","HC01_VC84.x","HC01_VC86","HC01_VC90","2016 Trump Vote
s","2016 Clinton Votes","2012 Republican Votes", "2012 Democrat Votes")]
names(educationDF) = c("State", "County", "Total", "Underhighschool", "Bachelor", "2016 rep", "2016
dem","2012 rep","2012 dem")
educationDF$underhighschool.rate= educationDF$Underhighschool/ educationDF$Total
educationDF$bachelor.rate= educationDF$Bachelor/ educationDF$Total
educationDF$dem.per.2012 = educationDF$`2012 dem`/ (educationDF$`2012 dem`+ educationDF$`2012
rep`)
educationDF$rep.per.2012 = educationDF$`2012 rep`/ (educationDF$`2012 dem`+ educationDF$`2012
educationDF$dem.per.2016 = educationDF$`2016 dem`/ (educationDF$`2016 dem`+ educationDF$`2016
rep`)
educationDF$rep.per.2016 = educationDF$`2016 rep`/ (educationDF$`2016 dem`+ educationDF$`2016
rep`)
educationDF$total.per.2012 = educationDF$dem.per.2012 - educationDF$rep.per.2012
educationDF$winner.per.2012 = pmax(educationDF$dem.per.2012, educationDF$rep.per.2012)
educationDF$total.per.2016 = educationDF$dem.per.2016 - educationDF$rep.per.2016
# has the percentage value of the winner
educationDF$winner.per.2016 = pmax(educationDF$dem.per.2016, educationDF$rep.per.2016)
#2012 9-12 grade
ggplot(data=educationDF) + geom_point(mapping = aes(x = winner.per.2012, y = underhighschool.r
ate, color = total.per.2012)) + xlab("% 2012 Vote") + ylab("No Diploma Voters Percentage") + g
gtitle("% of 2012 Vote by County by People with No Diploma") + theme(plot.title = element_text
(face="bold")) + scale_colour_gradient2(name="Winning % of Total Votes ",low="#E91D0E", mid="s
eashell4", high="#336699", midpoint = 0)
```

% of 2012 Vote by County by People with No Diploma



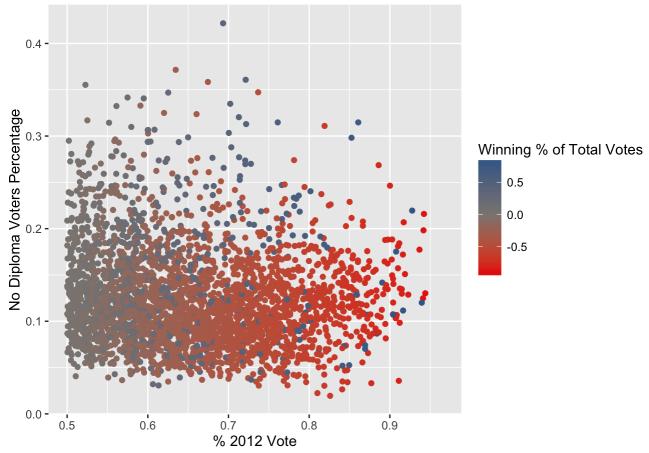
#2016 9-12 grade
ggplot(data=educationDF) + geom_point(mapping = aes(x = winner.per.2016, y = underhighschool.r
ate, color = total.per.2016)) + xlab("% 2016 Vote") + ylab("No Diploma Voters Percentage") + g
gtitle("% of 2016 Vote by County by People with No Diploma") + theme(plot.title = element_text
(face="bold")) + scale_colour_gradient2(name="Winning % of Total Votes ",low="#E91D0E", mid="s
eashell4", high="#336699", midpoint = 0)

% of 2016 Vote by County by People with No Diploma



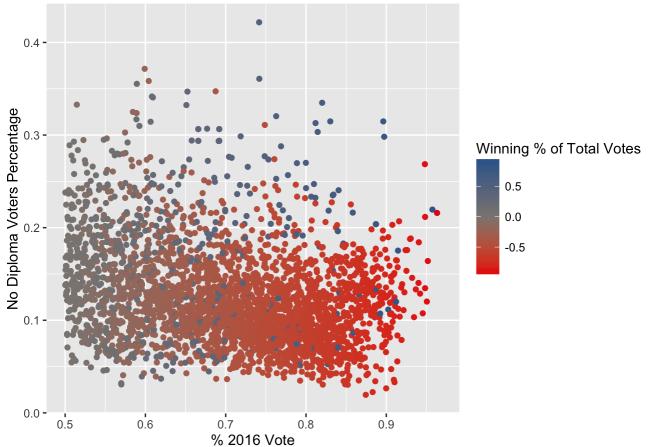
#2012 bachelor degree
ggplot(data=educationDF) + geom_point(mapping = aes(x = winner.per.2012, y = bachelor.rate, co
lor = total.per.2012)) + xlab("% 2012 Vote") + ylab("No Diploma Voters Percentage") + ggtitle(
"% of 2012 Vote by County by People with Bachelor Degree") + theme(plot.title = element_text(f
ace="bold")) + scale_colour_gradient2(name="Winning % of Total Votes ",low="#E91D0E", mid="sea
shell4", high="#336699", midpoint = 0)

% of 2012 Vote by County by People with Bachelor Degree



#2016 bachelor degree
ggplot(data=educationDF) + geom_point(mapping = aes(x = winner.per.2016, y = bachelor.rate, co
lor = total.per.2016)) + xlab("% 2016 Vote") + ylab("No Diploma Voters Percentage") + ggtitle(
"% of 2016 Vote by County by People with Bachelor Degrees") + theme(plot.title = element_text(
face="bold")) + scale_colour_gradient2(name="Winning % of Total Votes ",low="#E91D0E", mid="se
ashell4", high="#336699", midpoint = 0)

% of 2016 Vote by County by People with Bachelor Degrees



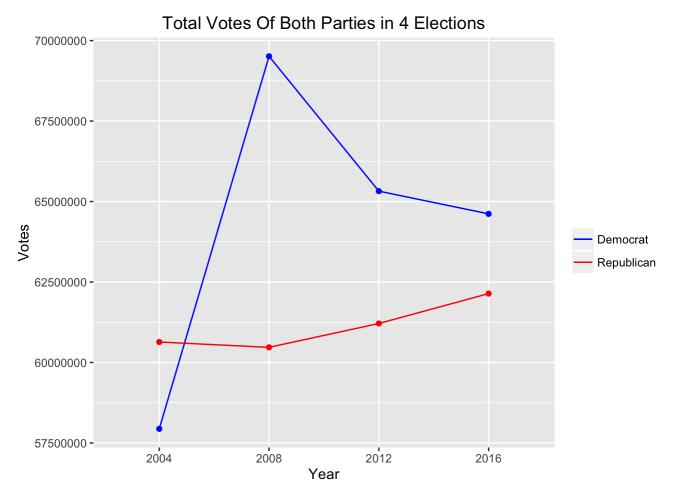
In plot 6, our team wanted to compare total votes in 4 election years. We decide to use line plot because it will directly show the number of votes change in 4 elections for both parties. We first make a dataframe "educationDF" by using our primary dataframe "partyDF" and subset "State", "County", "2016 Trump Votes", "2016 Clinton Votes", "2012 Republican Votes", "2012 Democrat Votes", "2008 McCain Votes", "2008 Obama Votes", "2004 Bush Votes", "2004 Kerry Votes" from our original dataframe "bigDF". In addition, we add a new dataframe called "newpartyDF" by summing up total votes of democrats and republican in 4 years. And we drop all NA data. Also, we calculate total vote number of each year. We use out newpartyDf to make our data frame. For first line plot, we set x as year of election, y as total number of votes and color as "democrats". For second line plot, we set x as year of election, y as total number of votes and color as "republican". We find that the total number of votes of 2008, 2012 and 2016 stays similar because that voting population remain the same in the passing 12 years. Furthermore, by institution, we assume that whoever has more votes wins the election. In our plot, it states correct in 2004, 2008, 2012. However, in 2016, Democrat won more votes than Republican, and Donald Trump still wins the election, which overturned our assumption. Therefore, we know that more votes doesn't mean wining the election.

```
# Democrat Vs Republican
partyDF = bigDF[,c("State","County","2016 Trump Votes","2016 Clinton Votes","2012 Republican V
otes", "2012 Democrat Votes", "2008 McCain Votes", "2008 Obama Votes", "2004 Bush Votes", "200
4 Kerry Votes")]
names(partyDF) = c("State","County","2016 rep","2016 dem","2012 rep","2012 dem","2008 rep","20
08 dem","2004 rep","2004 dem")

newpartyDF = data.frame(c(sum(partyDF$^2016 dem^, na.rm=TRUE), sum(partyDF$^2012 dem^, na.rm=T
RUE), sum(partyDF$^2008 dem^, na.rm=TRUE), sum(partyDF$^2004 dem^, na.rm=TRUE)), c(sum(partyDF
$^2016 rep^, na.rm=TRUE), sum(partyDF$^2012 rep^, na.rm=TRUE), sum(partyDF$^2008 rep^, na.rm=T
RUE), sum(partyDF$^2004 rep^, na.rm=TRUE)), factor(c(2016,2012,2008,2004)))
```

```
newpartyDF$Total = newpartyDF[,1] + newpartyDF[,2]
names(newpartyDF) = c("Total Democrat Votes", "Total Republican Votes", "Year", "Total")

ggplot(data=newpartyDF,aes(group=1))+ geom_line(aes( x = newpartyDF$Year, y =newpartyDF$`Total
  Democrat Votes`,colour='Democrat')) +geom_line(aes( x = newpartyDF$Year, y =newpartyDF$`Total
  Republican Votes`,colour='Republican')) +labs(title= "Total Votes Of Both Parties in 4 Electi
  ons", x= "Year", y= "Votes")+scale_colour_manual("", breaks = c("Democrat", "Republican"),valu
  es = c("blue", "red"))+geom_point(aes(x=newpartyDF$Year, y=newpartyDF$`Total Democrat Votes`),
    color='blue')+geom_point(aes(x=newpartyDF$Year, y=newpartyDF$`Total Republican Votes`), color='red')
```

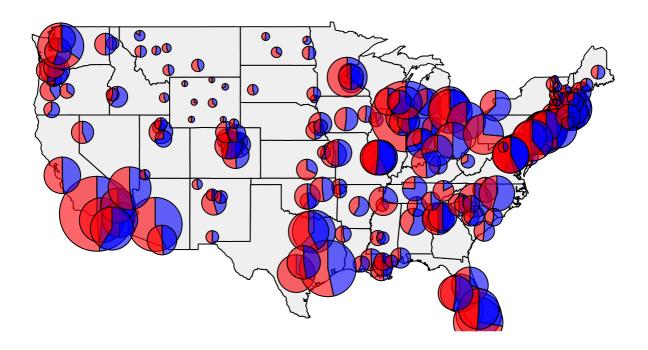


3. Map

For the election map, our group is trying to draw the proportion of voting in different county. By using base R graphing,we use the longitude and latitude from data frame to identify each county location. We extract state names, county names, longitude, latitude and 2016 votes for Clinton and Trump. We omit all NA in the data and calculate the total vote from each county. At the beginning, we draw the pie graphs for each county that have portion of Clinton's vote and trump's votes, and the radius of each pie graph is depending on the number of total vote for each county. However, some counties have so little vote that radius tends to be zero, and become black little dot. Hence, we want to delete those counties votes if they have too little portion in their states. We use dglyr library to group all the vote by state. Since the votes are distributing according to the portion in each state, we group the vote by different state, and calculate the portion of vote from each county in the state. Since there are so many small counties, we only take the voting data from counties that have more than 5 percent total number of votes of their states.

```
library(maps)
library(mapdata)
```

```
library(mapplots)
library(dplyr)
library(scales)
myDF=bigDF[,c(1,2,3,4,84,85)]
myDF=na.omit(myDF)
myDF$votes=myDF[,3]+myDF[,4]
vote= group_by (myDF,State)
vote=summarise(vote, totalvote=sum(votes))
vote1=left_join (myDF,vote,by="State")
vote1$percentVote=vote1$votes/vote1$totalvote
votefinal=vote1[vote1$percentVote>=0.05,]
ClinVote=as.numeric(votefinal[,3])
TrumVote=as.numeric(votefinal[,4])
z=array(c(abs(ClinVote/(ClinVote+TrumVote))),abs(TrumVote/(ClinVote+TrumVote))))
z=matrix(z,ncol=2,byrow=TRUE)
map("state", col="gray95", fill=TRUE)
points(votefinal$Longitude, votefinal$Latitude)
text(x= votefinal$Longitude, votefinal$Latitude,labels = votefinal$County, pos=4)
draw.pie(z=z,x=as.numeric(votefinal$Longitude)/1000000,y=as.numeric(votefinal$Latitude)/100000
0,radius=sqrt(ClinVote+TrumVote)/500, col=c(alpha("blue",0.6), alpha("red",0.6)))
```



4. predicting the 2016 result (Made by Chase Humiston) Method Use building regression line predict 2016 election results.

Our group recombined the data frame with all different group of people's votes, such as the people with high level of education, native people, and so on. We use those specific group of people so that the prediction of data will be more

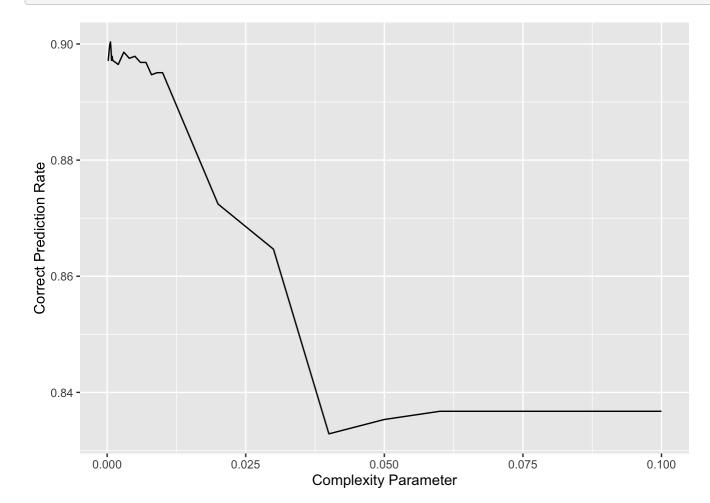
accurate. We set up the seed to generate random number, and put them in matrix as folds. To have less error in the predictor, we tried different cp values. By taking all columns except for the actual vote in column three, we use for loop and rpart function to generate and predict the data for each cp value. We apply the function on each prediction data set and find out the the ones that have sum more than 0.5.

Then, we select the maximum cpr value to use for the actual prediction to be more precise. We draw a plot with cps and cpr values to figure our the relations between them. Using exactly the same steps, we redo the previous steps with different ranges of cp values. Then, we draw the plot again for relations between cps and cpr. Looking at the plot, we find out when cp value is 0.0008, we have maximum of correct prediction rate. By looking at both the plot and the table, we see that when cp value is 0.0008, the error percentage is 0.17177 which means we predict 0.82823 correct.

```
# Building a regression tree
meddf = bigDF[,c("State","County","2016 Clinton Votes","2016 Trump Votes","HC03_VC04","HC03_VC
06","HC03_VC07","HC03_VC08","HC03_VC09","HC03_VC10","HC03_VC11","HC03_VC12","HC03_VC13.x","HC0
3_VC14","HC03_VC15","HC03_VC17","HC03_VC18","HC03_VC85","HC03_VC86","HC03_VC87","HC03_VC88","H
C03_VC89","HC03_VC90","HC03_VC91","HC03_VC129","HC03_VC130","HC03_VC131","HC03_VC132","HC03_VC
133","HC03_VC134","HC03_VC05","HC03_VC13.Y","HC03_VC75","HC03_VC76","HC03_VC77","HC03_VC778","H
C03_VC79","HC03_VC80","HC03_VC81","HC03_VC82","HC03_VC83","HC03_VC84","HC01_VC85.y","HC03_VC15
6", "Longitude", "Latitude")]
meddf[,-(1:2)] = sapply(meddf[,-(1:2)],as.numeric)
meddf = meddf[complete.cases(meddf),]
meddf$State = as.factor(meddf$State)
pred2016 = data.frame("repvotes" = meddf[,4]/(meddf[,3]+meddf[,4]), meddf[,-(3:4)])
#separate predictor build and test data
set.seed(98070320)
npred = nrow(pred2016)
splitset = sample(npred, size = round(npred * .9, -1), replace = FALSE)
testset = pred2016[-splitset, ]
buildset = pred2016[splitset, ]
#create folds matrix
nbuild = nrow(buildset)
permuteIndices = sample(nbuild)
folds = matrix(permuteIndices, ncol = 10)
#cp value vector
cps = c(seq(0.0001, 0.001, by = 0.0001),
      seq(0.001, 0.01, by = 0.001),
       seq(0.01, 0.1, by = 0.01))
#prediction matrix
preds = matrix(nrow = nbuild, ncol = length(cps))
tree = list()
require(rpart)
#build tree
for (i in 1:10) {
 buildfold = folds[, -i]
 testfold = folds[, i]
```

```
## [1] 6
```

```
cprdf = data.frame(cps, cpr)
ggplot(data = cprdf, aes(x = cps, y = cpr)) +
  geom_line() +
  labs(x = "Complexity Parameter", y = "Correct Prediction Rate")
```



```
for(i in 1:10){
  printcp(tree[[i]])
}
```

```
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
     method = "anova", control = rpart.control(cp = cps[j]))
##
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05 HC03_VC07
                                                  HC03_VC08
## [6] HC03 VC09 HC03 VC10 HC03 VC11 HC03 VC12
                                                  HC03 VC129
## [11] HC03_VC13.x HC03_VC13.y HC03_VC130 HC03_VC131 HC03_VC132
## [16] HC03_VC133 HC03_VC134 HC03_VC14 HC03_VC15
                                                  HC03_VC156
## [21] HC03 VC17 HC03 VC18 HC03 VC75 HC03 VC76
                                                  HC03 VC77
## [26] HC03_VC78
                 HC03_VC79 HC03_VC80 HC03_VC81
                                                  HC03_VC82
## [36] HC03_VC88
                HC03_VC89 HC03_VC90
                                      HC03_VC91 Latitude
## [41] Longitude
                State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
             CP nsplit rel error xerror
## 1
    0.26894188
                   0 1.00000 1.00060 0.031334
## 2
     0.15300146
                    1 0.73106 0.73643 0.023451
                   2 0.57806 0.58958 0.020901
## 3
     0.04905506
## 4
     0.03483358
                   3 0.52900 0.53984 0.019920
     0.02575390
                   4 0.49417 0.51093 0.019307
## 5
                   5 0.46841 0.49562 0.018471
## 6
     0.02255952
## 7
     0.02195363
                    6
                      0.44585 0.49419 0.018285
## 8
     0.01812404
                   7 0.42390 0.47646 0.017220
## 9
      0.01460201
                   8
                       0.40578 0.46132 0.017048
## 10 0.01373019
                   9 0.39117 0.44618 0.016689
## 11 0.01318438
                   10
                      0.37744 0.43350 0.016484
                  11 0.36426 0.42325 0.016196
## 12 0.01113299
                  12 0.35313 0.41953 0.016186
## 13 0.01044189
## 14 0.00876037
                   13
                      0.34269 0.41599 0.016108
                      0.33393 0.40633 0.015347
## 15 0.00771485
                   14
## 16 0.00737522
                   15
                      0.32621 0.40716 0.015450
## 17 0.00651898
                      0.31884 0.40303 0.015399
                   16
                        0.31232 0.40237 0.015363
## 18 0.00609098
                   17
## 19 0.00582690
                  18 0.30623 0.40261 0.015740
## 20 0.00523612
                  19
                       0.30040 0.39500 0.015544
                   20 0.29516 0.39270 0.015241
## 21 0.00482466
                      0.29034 0.39517 0.015487
## 22 0.00479629
                   21
## 23 0.00455377
                  22 0.28554 0.39640 0.015521
## 24 0.00406023
                   23 0.28099 0.39004 0.015212
## 25 0.00390075
                   24
                      0.27693 0.38808 0.015236
## 26 0.00386309
                   25 0.27303 0.38666 0.015304
                        0.26916 0.38525 0.015297
## 27 0.00373690
                   26
```

```
## 28
      0.00323021
                      27
                           0.26543 0.38076 0.015068
## 29
      0.00287222
                      28
                           0.26220 0.37850 0.014835
## 30
      0.00276227
                      29
                          0.25932 0.37629 0.014708
      0.00273625
                         0.25656 0.37533 0.014709
## 31
                      30
     0.00269698
                      31
                          0.25383 0.37514 0.014702
## 32
## 33 0.00265792
                      32
                          0.25113 0.37438 0.014689
## 34 0.00261475
                          0.24847 0.37416 0.014686
                      33
## 35
      0.00259402
                      34
                           0.24586 0.37330 0.014664
## 36
      0.00242374
                      35
                          0.24326 0.37332 0.014779
## 37
      0.00234022
                      36
                           0.24084 0.37024 0.014713
## 38
      0.00226835
                      37
                           0.23850 0.37107 0.014736
## 39
      0.00217154
                      39
                          0.23396 0.37087 0.014747
                         0.23179 0.37154 0.015028
## 40
      0.00203158
                      40
## 41
      0.00200903
                      41
                          0.22976 0.36905 0.014958
## 42 0.00197756
                      43
                         0.22574 0.36816 0.014948
      0.00192518
                      44
                         0.22376 0.36702 0.014934
## 43
## 44
      0.00180554
                      45
                           0.22184 0.36682 0.015000
## 45
      0.00174488
                      47
                           0.21823 0.36976 0.015152
      0.00171649
                           0.21648 0.36939 0.015192
## 46
                      48
## 47
      0.00171513
                      49
                          0.21476 0.36973 0.015184
      0.00163250
                      50
                          0.21305 0.36946 0.015207
## 48
## 49
      0.00160365
                      51
                          0.21142 0.36864 0.015182
      0.00154749
                      52
                          0.20981 0.36985 0.015204
## 50
      0.00145486
## 51
                      53
                          0.20827 0.36981 0.015213
## 52 0.00145420
                      54
                          0.20681 0.37015 0.015223
## 53
      0.00142485
                      55
                          0.20536 0.36934 0.015167
      0.00140643
                          0.20393 0.36917 0.015170
## 54
                      56
                      58
                           0.20112 0.36960 0.015170
## 55
      0.00139441
## 56
      0.00136615
                      59
                          0.19972 0.36947 0.015178
## 57
      0.00134432
                      62
                          0.19563 0.36940 0.015172
                          0.19428 0.36923 0.015173
## 58
      0.00132904
                      63
      0.00132240
                      64
                          0.19295 0.36983 0.015204
## 59
## 60
     0.00123928
                      65
                          0.19163 0.36856 0.015183
                          0.19039 0.36812 0.015177
## 61
      0.00123217
                      66
## 62
      0.00116417
                      67
                           0.18916 0.36738 0.015148
## 63
     0.00115728
                      68
                          0.18799 0.36803 0.015220
                      70
## 64
      0.00111347
                           0.18568 0.36825 0.015222
## 65
      0.00107149
                      71
                         0.18457 0.36852 0.015303
      0.00106199
                      72
                          0.18350 0.36702 0.015268
## 66
      0.00099296
                      73
                         0.18243 0.36725 0.015345
## 67
      0.00097298
                      74
                          0.18144 0.36948 0.015488
## 68
      0.00096571
                      75
                          0.18047 0.36941 0.015501
## 69
## 70
      0.00094299
                      76
                           0.17950 0.36998 0.015519
## 71
      0.00092604
                      77
                           0.17856 0.37055 0.015541
## 72
      0.00086791
                      78
                           0.17763 0.37156 0.015585
                      80
## 73
      0.00086082
                           0.17590 0.37109 0.015605
## 74
      0.00083882
                      81
                           0.17504 0.37031 0.015558
## 75
      0.00082185
                           0.17420 0.37032 0.015563
                      82
## 76
      0.00081999
                      83
                           0.17338 0.37073 0.015619
## 77
      0.00081510
                      84
                           0.17256 0.37041 0.015619
      0.00080718
                           0.17174 0.37112 0.015655
## 78
                      85
## 79
      0.00080253
                      86
                           0.17093 0.37087 0.015652
## 80
       0.00080214
                      87
                           0.17013 0.37065 0.015652
       0.00079999
                      88
                           0.16933 0.37036 0.015647
## 81
```

```
## 82 0.00077675
                     89
                        0.16853 0.37153 0.015728
## 83 0.00076692
                     90
                        0.16775 0.37091 0.015715
## 84 0.00075579
                     91
                         0.16698 0.37126 0.015720
## 85 0.00074858
                     92
                        0.16623 0.37181 0.015736
## 86
      0.00070380
                     94
                        0.16473 0.37057 0.015729
## 87 0.00069992
                     95
                        0.16403 0.37065 0.015701
## 88 0.00069223
                   96
                        0.16333 0.37231 0.015737
## 89 0.00068902
                     97
                        0.16264 0.37143 0.015663
## 90 0.00068832
                     98
                        0.16195 0.37143 0.015663
## 91 0.00066915
                   99
                        0.16126 0.37178 0.015659
## 92 0.00066580
                 100
                        0.16059 0.37261 0.015680
## 93 0.00063716
                   103
                         0.15859 0.37354 0.015665
                        0.15795 0.37339 0.015649
## 94 0.00063355
                 104
## 95 0.00061813
                  105
                        0.15732 0.37451 0.015673
## 96 0.00061596
                  107
                        0.15609 0.37494 0.015713
## 97 0.00061410
                 108
                        0.15547 0.37492 0.015715
## 98 0.00060509
                 109
                        0.15486 0.37473 0.015707
## 99 0.00059366
                 110
                        0.15425 0.37504 0.015709
## 100 0.00057957
                   111
                        0.15366 0.37536 0.015537
## 101 0.00057526
                 112
                        0.15308 0.37499 0.015539
## 102 0.00055524
                   114
                         0.15193 0.37495 0.015537
## 103 0.00055083
                   115
                        0.15137 0.37485 0.015539
## 104 0.00054831
                   116
                        0.15082 0.37452 0.015542
## 105 0.00054719
                 117 0.15027 0.37469 0.015543
## 106 0.00049059
                        0.14972 0.37552 0.015582
                  118
## 107 0.00048324
                  119
                        0.14923 0.37483 0.015544
## 108 0.00048039
                 120 0.14875 0.37537 0.015631
                 121
                        0.14827 0.37549 0.015575
## 109 0.00046824
## 110 0.00046728
                   122
                        0.14780 0.37506 0.015546
## 111 0.00046207
                   123
                        0.14733 0.37506 0.015546
## 112 0.00044998
                 124
                        0.14687 0.37446 0.015509
## 113 0.00043664
                   125
                        0.14642 0.37418 0.015501
## 114 0.00043135
                  126
                        0.14599 0.37427 0.015512
                 127
## 115 0.00042858
                        0.14555 0.37443 0.015512
## 116 0.00041923
                 128
                        0.14513 0.37377 0.015491
## 117 0.00041219
                 129
                        0.14471 0.37363 0.015448
## 118 0.00040882
                   130
                        0.14429 0.37380 0.015456
## 119 0.00040711
                 131
                        0.14389 0.37412 0.015491
## 120 0.00040614
                    132
                         0.14348 0.37412 0.015491
## 121 0.00039895
                   133
                        0.14307 0.37434 0.015494
## 122 0.00038747
                   134
                        0.14267 0.37353 0.015486
## 123 0.00038480
                 135
                        0.14229 0.37329 0.015486
## 124 0.00038424
                   136
                        0.14190 0.37344 0.015486
## 125 0.00037809
                   137
                        0.14152 0.37354 0.015484
## 126 0.00037584
                 138
                        0.14114 0.37336 0.015480
                 140
## 127 0.00036870
                        0.14039 0.37356 0.015485
## 128 0.00034819
                   141
                        0.14002 0.37350 0.015472
## 129 0.00034302
                         0.13967 0.37379 0.015472
                   142
## 130 0.00033810
                 143
                        0.13933 0.37387 0.015472
## 131 0.00033694
                   144
                        0.13899 0.37442 0.015486
## 132 0.00033661
                  145
                        0.13865 0.37425 0.015469
## 133 0.00033647
                  146
                        0.13832 0.37425 0.015469
                  147
## 134 0.00032613
                        0.13798 0.37449 0.015445
## 135 0.00031906
                    148
                         0.13765 0.37482 0.015451
```

```
## 136 0.00031893
                  149
                       0.13733 0.37529 0.015451
## 137 0.00031861 150 0.13702 0.37529 0.015451
                 151 0.13670 0.37538 0.015451
## 138 0.00031509
## 139 0.00031365
                152 0.13638 0.37564 0.015450
## 140 0.00031258
                153 0.13607 0.37564 0.015448
                154 0.13576 0.37534 0.015452
## 141 0.00030788
## 142 0.00029802 155 0.13545 0.37502 0.015446
                 156
## 143 0.00029594
                       0.13515 0.37554 0.015443
## 144 0.00027781 158 0.13456 0.37574 0.015442
                 159
## 145 0.00027672
                       0.13428 0.37562 0.015436
## 146 0.00027287
                  160 0.13400 0.37534 0.015436
## 147 0.00027246
                 161
                       0.13373 0.37583 0.015438
## 148 0.00027010
                162 0.13346 0.37583 0.015438
## 149 0.00025144
                 163 0.13319 0.37617 0.015439
## 150 0.00024464
                 164 0.13294 0.37599 0.015447
## 151 0.00024056 165 0.13269 0.37561 0.015441
                 166 0.13245 0.37567 0.015442
## 152 0.00023660
## 153 0.00023198
                 167 0.13221 0.37581 0.015445
## 154 0.00023124
                 168
                       0.13198 0.37582 0.015445
## 155 0.00022249
                169 0.13175 0.37621 0.015476
## 156 0.00021870
                 170 0.13153 0.37658 0.015475
## 157 0.00020670
                 173 0.13087 0.37678 0.015476
## 158 0.00020481
                 174 0.13067 0.37716 0.015474
                 175 0.13046 0.37697 0.015474
## 159 0.00020284
## 160 0.00020023
                176 0.13026 0.37705 0.015474
## 161 0.00019943
                  177
                       0.13006 0.37705 0.015474
## 162 0.00019887
                178 0.12986 0.37713 0.015473
## 163 0.00019599
                   179
                       0.12966 0.37696 0.015473
## 164 0.00019341
                  180 0.12946 0.37696 0.015473
## 165 0.00019139
                 182
                       0.12908 0.37694 0.015472
## 166 0.00018900
                183 0.12889 0.37703 0.015468
## 167 0.00018848
                184 0.12870 0.37696 0.015468
                 185 0.12851 0.37696 0.015468
## 168 0.00018555
## 169 0.00018454 186 0.12832 0.37660 0.015465
                 187
## 170 0.00018155
                       0.12814 0.37663 0.015465
## 171 0.00017521
                 188
                       0.12796 0.37713 0.015468
## 172 0.00016557
                 189
                       0.12778 0.37697 0.015467
## 173 0.00015708
                190 0.12762 0.37744 0.015467
## 174 0.00015606
                 191
                       0.12746 0.37737 0.015468
## 175 0.00014319
                 192 0.12730 0.37794 0.015476
## 176 0.00013881
                194 0.12702 0.37833 0.015476
## 177 0.00013062
                195 0.12688 0.37871 0.015474
## 178 0.00013040
                196 0.12675 0.37903 0.015473
## 179 0.00012943
                 197
                       0.12662 0.37898 0.015472
## 180 0.00012822 198 0.12649 0.37890 0.015472
                 199
## 181 0.00012368
                       0.12636 0.37899 0.015473
## 182 0.00012341
                200 0.12624 0.37903 0.015473
                 201 0.12611 0.37919 0.015476
## 183 0.00010871
                202 0.12600 0.37954 0.015475
## 184 0.00010297
## 185 0.00010000
                   203 0.12590 0.37978 0.015475
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
      method = "anova", control = rpart.control(cp = cps[j]))
```

```
##
## Variables actually used in tree construction:
## [1] HC01 VC85.y HC03 VC04 HC03 VC05
                                       HC03 VC07
                                                   HC03 VC08
## [6] HC03_VC09 HC03_VC10 HC03_VC11 HC03_VC12
                                                   HC03_VC129
## [11] HC03_VC13.x HC03_VC13.y HC03_VC130 HC03_VC131 HC03_VC132
                                                   HC03_VC156
## [16] HC03_VC133 HC03_VC134 HC03_VC14 HC03_VC15
## [21] HC03_VC17 HC03_VC18 HC03_VC75 HC03_VC76
                                                   HC03_VC77
## [26] HC03_VC78
                HC03_VC79 HC03_VC80
                                      HC03_VC81 HC03_VC82
## [31] HC03 VC83 HC03 VC84 HC03 VC85 HC03 VC86
                                                   HC03 VC87
## [36] HC03 VC88
                HC03_VC89 HC03_VC90
                                       HC03_VC91
                                                   Latitude
## [41] Longitude
                  State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
             CP nsplit rel error xerror
     ## 1
                     1 0.73106 0.73858 0.023654
## 2
     0.15300146
                     2 0.57806 0.59007 0.021072
## 3
     0.04905506
                    3 0.52900 0.54442 0.020147
## 4
      0.03483358
## 5
     0.02575390
                    4 0.49417 0.51565 0.019528
## 6
     0.02255952
                    5 0.46841 0.51013 0.019315
## 7
     0.02195363
                   6 0.44585 0.49704 0.018760
                   7 0.42390 0.49106 0.018329
## 8
      0.01812404
      0.01460201
## 9
                   8 0.40578 0.47962 0.018020
## 10
     0.01373019
                    9 0.39117 0.47186 0.018194
                   10 0.37744 0.46590 0.018004
## 11
     0.01318438
## 12 0.01113299
                   11
                       0.36426 0.45023 0.017765
## 13
     0.01044189
                    12
                       0.35313 0.44112 0.017537
                       0.34269 0.43251 0.017122
## 14 0.00876037
                   13
## 15 0.00771485
                   14
                       0.33393 0.42497 0.016794
## 16 0.00737522
                   15 0.32621 0.41461 0.016156
                       0.31884 0.41097 0.016121
## 17
     0.00651898
                   16
## 18 0.00609098
                   17 0.31232 0.41483 0.016740
                       0.30623 0.41510 0.016719
## 19 0.00582690
                   18
## 20 0.00523612
                   19
                       0.30040 0.41369 0.016688
## 21
     0.00482466
                    20
                       0.29516 0.41064 0.016571
## 22 0.00479629
                    21
                        0.29034 0.40951 0.016741
                       0.28554 0.40815 0.016688
## 23 0.00455377
                   22
## 24 0.00406023
                    23
                       0.28099 0.40742 0.016828
## 25 0.00390075
                   24 0.27693 0.40181 0.016641
                  25
                       0.27303 0.40074 0.016614
## 26 0.00386309
                       0.26916 0.39568 0.016166
## 27 0.00373690
                    26
## 28
     0.00323021
                    27
                       0.26543 0.39376 0.016105
                    28
                       0.26220 0.39062 0.016089
## 29
     0.00287222
## 30
     0.00276227
                    29
                       0.25932 0.39411 0.016199
## 31
     0.00273625
                    30
                       0.25656 0.39431 0.016198
                       0.25383 0.39312 0.016164
## 32 0.00269698
                   31
## 33 0.00265792
                   32
                       0.25113 0.39238 0.016130
## 34 0.00261475
                   33 0.24847 0.39238 0.016130
## 35 0.00259402
                   34
                       0.24586 0.39238 0.016130
## 36 0.00242374
                   35 0.24326 0.39109 0.016082
## 37 0.00234022
                    36
                        0.24084 0.38771 0.015916
```

```
## 38
      0.00226835
                      37
                           0.23850 0.38761 0.016034
## 39
      0.00217154
                      39
                           0.23396 0.38544 0.015918
## 40
      0.00203158
                      40
                          0.23179 0.38352 0.015974
      0.00200903
                         0.22976 0.38255 0.016043
## 41
                      41
     0.00197756
                      43
                          0.22574 0.38255 0.016046
## 42
                          0.22376 0.38399 0.016129
## 43
      0.00192518
                      44
## 44 0.00180554
                      45
                          0.22184 0.38242 0.015993
## 45
      0.00174488
                      47
                           0.21823 0.38238 0.015988
## 46
      0.00171649
                      48
                          0.21648 0.38259 0.015749
## 47
       0.00171513
                      49
                           0.21476 0.38325 0.015761
## 48
      0.00163250
                      50
                          0.21305 0.38208 0.015706
## 49
      0.00160365
                      51
                          0.21142 0.38033 0.015676
                         0.20981 0.38100 0.015701
## 50
      0.00154749
                      52
## 51
     0.00145486
                      53
                          0.20827 0.38232 0.015750
## 52 0.00145420
                      54
                          0.20681 0.37885 0.015567
                          0.20536 0.37846 0.015565
## 53
      0.00142485
                      55
## 54
      0.00140643
                      56
                           0.20393 0.37809 0.015589
## 55
      0.00139441
                      58
                           0.20112 0.37787 0.015588
      0.00136615
                      59
                           0.19972 0.37638 0.015568
## 56
## 57
      0.00134432
                      62
                          0.19563 0.37603 0.015571
## 58
      0.00132904
                      63
                           0.19428 0.37585 0.015570
                          0.19295 0.37526 0.015574
## 59
      0.00132240
                      64
      0.00123928
                      65
                          0.19163 0.37343 0.015254
## 60
      0.00123217
                      66
                          0.19039 0.37367 0.015260
## 61
## 62 0.00116417
                      67
                           0.18916 0.37365 0.015305
## 63
      0.00115728
                      68
                          0.18799 0.37505 0.015321
      0.00111347
                      70
                          0.18568 0.37451 0.015302
## 64
                      71
                           0.18457 0.37406 0.015345
## 65
      0.00107149
## 66
      0.00106199
                      72
                          0.18350 0.37361 0.015321
## 67
      0.00099296
                      73
                          0.18243 0.37273 0.015338
                      74
      0.00097298
                         0.18144 0.37366 0.015334
## 68
      0.00096571
                      75
                          0.18047 0.37388 0.015338
## 69
## 70
     0.00094299
                      76
                          0.17950 0.37429 0.015408
                      77
## 71
      0.00092604
                          0.17856 0.37393 0.015402
## 72
      0.00086791
                      78
                           0.17763 0.37429 0.015446
## 73
      0.00086082
                      80
                           0.17590 0.37551 0.015423
                           0.17504 0.37597 0.015448
## 74
      0.00083882
                      81
## 75
      0.00082185
                      82
                          0.17420 0.37605 0.015443
## 76
      0.00081999
                      83
                           0.17338 0.37479 0.015399
## 77
      0.00081510
                           0.17256 0.37454 0.015381
                      84
      0.00080718
                      85
                          0.17174 0.37465 0.015385
## 78
## 79
      0.00080253
                           0.17093 0.37471 0.015392
                      86
## 80
      0.00080214
                      87
                           0.17013 0.37501 0.015393
## 81
      0.00079999
                      88
                           0.16933 0.37515 0.015393
## 82
      0.00077675
                      89
                           0.16853 0.37537 0.015392
                      90
                           0.16775 0.37450 0.015345
## 83
      0.00076692
## 84
      0.00075579
                      91
                           0.16698 0.37333 0.015315
      0.00074858
                      92
                          0.16623 0.37369 0.015325
## 85
      0.00070380
                      94
                          0.16473 0.37251 0.015291
## 86
## 87
      0.00069992
                      95
                           0.16403 0.37289 0.015369
      0.00069223
## 88
                      96
                           0.16333 0.37286 0.015382
## 89
      0.00068902
                      97
                          0.16264 0.37359 0.015382
## 90
       0.00068832
                      98
                           0.16195 0.37352 0.015383
       0.00066915
                      99
                           0.16126 0.37321 0.015382
## 91
```

```
## 92 0.00066580
                  100
                       0.16059 0.37289 0.015364
## 93 0.00063716 103
                       0.15859 0.37277 0.015368
                 104
## 94 0.00063355
                       0.15795 0.37276 0.015292
## 95 0.00061813
                  105
                       0.15732 0.37396 0.015336
                       0.15609 0.37507 0.015394
## 96 0.00061596
                 107
## 97 0.00061410
                 108
                       0.15547 0.37542 0.015411
                 109
## 98 0.00060509
                       0.15486 0.37538 0.015413
## 99 0.00059366
                  110 0.15425 0.37507 0.015409
## 100 0.00057957
                 111
                       0.15366 0.37528 0.015444
                 112 0.15308 0.37555 0.015468
## 101 0.00057526
## 102 0.00055524
                   114 0.15193 0.37660 0.015497
## 103 0.00055083
                   115
                       0.15137 0.37684 0.015572
## 104 0.00054831
                       0.15082 0.37718 0.015577
                 116
                 117
## 105 0.00054719
                       0.15027 0.37729 0.015578
## 106 0.00049059
                 118 0.14972 0.37568 0.015534
## 107 0.00048324
                 119
                       0.14923 0.37599 0.015554
## 108 0.00048039
                 120 0.14875 0.37628 0.015558
## 109 0.00046824
                 121 0.14827 0.37707 0.015566
## 110 0.00046728
                 122
                       0.14780 0.37745 0.015574
## 111 0.00046207
                 123 0.14733 0.37783 0.015578
                 124
## 112 0.00044998
                       0.14687 0.37828 0.015592
## 113 0.00043664
                 125
                       0.14642 0.37793 0.015586
## 114 0.00043135
                 126
                       0.14599 0.37792 0.015588
## 115 0.00042858
                 127 0.14555 0.37818 0.015589
## 116 0.00041923
                 128 0.14513 0.37763 0.015562
## 117 0.00041219
                 129 0.14471 0.37765 0.015564
## 118 0.00040882 130 0.14429 0.37858 0.015569
                 131
## 119 0.00040711
                       0.14389 0.37859 0.015571
## 120 0.00040614
                   132 0.14348 0.37859 0.015571
## 121 0.00039895
                 133
                       0.14307 0.37867 0.015572
                       0.14267 0.37857 0.015577
## 122 0.00038747
                 134
## 123 0.00038480
                 135
                       0.14229 0.37832 0.015576
## 124 0.00038424
                 136 0.14190 0.37832 0.015576
                 137
## 125 0.00037809
                       0.14152 0.37833 0.015575
## 126 0.00037584
                 138 0.14114 0.37838 0.015576
## 127 0.00036870
                 140 0.14039 0.37875 0.015573
## 128 0.00034819
                 141
                       0.14002 0.37867 0.015567
## 129 0.00034302
                 142 0.13967 0.37992 0.015652
## 130 0.00033810
                 143
                       0.13933 0.38007 0.015615
## 131 0.00033694
                 144
                       0.13899 0.38016 0.015615
## 132 0.00033661
                 145
                       0.13865 0.37993 0.015613
## 133 0.00033647
                 146 0.13832 0.38008 0.015612
                 147
## 134 0.00032613
                       0.13798 0.38064 0.015617
## 135 0.00031906
                  148
                       0.13765 0.38110 0.015617
## 136 0.00031893
                 149
                       0.13733 0.38169 0.015620
                 150
## 137 0.00031861
                       0.13702 0.38162 0.015620
## 138 0.00031509
                   151
                       0.13670 0.38095 0.015605
## 139 0.00031365
                   152
                        0.13638 0.38102 0.015604
## 140 0.00031258
                 153
                       0.13607 0.38109 0.015604
## 141 0.00030788
                 154
                       0.13576 0.38086 0.015600
## 142 0.00029802
                 155
                       0.13545 0.38048 0.015598
## 143 0.00029594
                 156
                       0.13515 0.38015 0.015602
                 158
## 144 0.00027781
                       0.13456 0.38045 0.015612
                         0.13428 0.38094 0.015611
## 145 0.00027672
                   159
```

```
## 146 0.00027287
                160
                     0.13400 0.38091 0.015611
## 147 0.00027246 161 0.13373 0.38137 0.015614
## 148 0.00027010 162 0.13346 0.38148 0.015615
## 149 0.00025144 163 0.13319 0.38222 0.015611
## 150 0.00024464 164 0.13294 0.38246 0.015629
## 152 0.00023660 166 0.13245 0.38234 0.015629
               167 0.13221 0.38279 0.015627
## 153 0.00023198
## 154 0.00023124 168 0.13198 0.38265 0.015628
               169 0.13175 0.38253 0.015627
## 155 0.00022249
## 156 0.00021870
               170 0.13153 0.38294 0.015631
## 157 0.00020670
               173 0.13087 0.38286 0.015631
## 158 0.00020481 174 0.13067 0.38283 0.015635
## 159 0.00020284 175 0.13046 0.38294 0.015636
## 160 0.00020023 176 0.13026 0.38282 0.015635
## 161 0.00020000 177 0.13006 0.38282 0.015635
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
##
    method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05 HC03_VC07
                                               HC03_VC09
## [6] HC03_VC10 HC03_VC11 HC03_VC12 HC03_VC129 HC03_VC13.x
## [11] HC03_VC13.y HC03_VC130 HC03_VC132 HC03_VC133 HC03_VC134
## [16] HC03_VC15 HC03_VC156 HC03_VC17
                                   HC03_VC18
                                               HC03_VC75
## [26] HC03_VC81 HC03_VC82 HC03_VC83 HC03_VC84
                                               HC03_VC85
## [36] HC03_VC91 Latitude Longitude State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
            CP nsplit rel error xerror
    ## 1
## 2
     0.15300146
                  1 0.73106 0.73888 0.023588
## 3
     0.04905506
                  2 0.57806 0.59374 0.021080
## 4
     0.03483358
                  3 0.52900 0.54859 0.020155
                  4 0.49417 0.52550 0.019636
## 5
     0.02575390
     0.02255952
                  5 0.46841 0.51639 0.018787
## 6
                  6 0.44585 0.50911 0.018490
## 7
     0.02195363
     0.01812404
                  7 0.42390 0.49956 0.017997
## 8
## 9
     0.01460201
                  8 0.40578 0.48108 0.017992
                  9 0.39117 0.47519 0.017947
## 10 0.01373019
## 11 0.01318438
                 10 0.37744 0.47101 0.017855
## 12 0.01113299
                 11
                     0.36426 0.46301 0.018096
                 12 0.35313 0.45632 0.017870
## 13 0.01044189
## 14 0.00876037
                 13 0.34269 0.45121 0.017705
                 14
## 15 0.00771485
                     0.33393 0.44417 0.017576
                 15 0.32621 0.43935 0.017202
## 16 0.00737522
## 17 0.00651898
                 16 0.31884 0.43323 0.017039
## 18 0.00609098
                  17
                      0.31232 0.43266 0.017048
```

```
## 19
      0.00582690
                     18
                          0.30623 0.43512 0.017688
## 20
      0.00523612
                     19
                          0.30040 0.42747 0.017460
## 21
      0.00482466
                      20
                          0.29516 0.42395 0.017551
      0.00479629
                         0.29034 0.42108 0.017581
## 22
                      21
## 23
      0.00455377
                      22
                          0.28554 0.41800 0.017484
      0.00406023
                      23
                         0.28099 0.41567 0.017349
## 24
## 25
      0.00390075
                      24
                          0.27693 0.41353 0.017420
## 26 0.00386309
                      25
                         0.27303 0.41022 0.017151
## 27
                         0.26916 0.40768 0.017024
      0.00373690
                      26
## 28
      0.00323021
                      27
                          0.26543 0.40509 0.016955
## 29
      0.00287222
                      28
                         0.26220 0.39924 0.016904
## 30
      0.00276227
                      29
                          0.25932 0.39480 0.016561
                         0.25656 0.39218 0.016484
## 31
      0.00273625
                      30
## 32
      0.00269698
                      31
                          0.25383 0.39218 0.016484
     0.00265792
                         0.25113 0.38891 0.015943
## 33
                      32
## 34
      0.00261475
                      33
                          0.24847 0.38720 0.015900
## 35
      0.00259402
                     34
                         0.24586 0.38650 0.015770
## 36 0.00242374
                      35
                         0.24326 0.38741 0.015888
## 37
      0.00234022
                      36
                          0.24084 0.38835 0.015890
## 38
      0.00226835
                      37
                         0.23850 0.38888 0.015940
## 39
      0.00217154
                      39
                          0.23396 0.38951 0.015920
## 40
      0.00203158
                      40
                         0.23179 0.39240 0.016011
## 41
      0.00200903
                      41
                          0.22976 0.39187 0.016000
     0.00197756
                      43
                         0.22574 0.39056 0.015887
## 42
## 43
      0.00192518
                      44
                         0.22376 0.38930 0.015872
## 44 0.00180554
                      45
                         0.22184 0.39076 0.015921
      0.00174488
                      47
                         0.21823 0.38766 0.015996
## 45
## 46
      0.00171649
                      48
                          0.21648 0.38755 0.016060
## 47
      0.00171513
                      49
                          0.21476 0.38804 0.016115
      0.00163250
                      50
                          0.21305 0.38837 0.016145
## 48
## 49
      0.00160365
                      51
                          0.21142 0.38799 0.016155
## 50
      0.00154749
                      52
                          0.20981 0.39153 0.016299
## 51 0.00145486
                         0.20827 0.38734 0.015688
                      53
## 52
     0.00145420
                      54
                          0.20681 0.38529 0.015684
## 53 0.00142485
                      55
                         0.20536 0.38495 0.015670
## 54 0.00140643
                         0.20393 0.38569 0.015724
                      56
## 55
      0.00139441
                      58
                          0.20112 0.38585 0.015722
## 56
      0.00136615
                      59
                         0.19972 0.38514 0.015720
      0.00134432
                      62
                          0.19563 0.38457 0.015735
## 57
## 58
      0.00132904
                      63
                         0.19428 0.38420 0.015702
## 59
      0.00132240
                      64
                          0.19295 0.38420 0.015702
## 60
      0.00123928
                      65
                         0.19163 0.38429 0.015740
## 61
      0.00123217
                      66
                          0.19039 0.38354 0.015739
## 62 0.00116417
                      67
                          0.18916 0.38459 0.015767
## 63
      0.00115728
                      68
                         0.18799 0.38487 0.015795
                      70
## 64
      0.00111347
                          0.18568 0.38530 0.015800
      0.00107149
                      71
                          0.18457 0.38817 0.016039
## 65
                      72
                          0.18350 0.38765 0.016030
## 66
      0.00106199
## 67
      0.00099296
                      73
                         0.18243 0.38738 0.016055
      0.00097298
                      74
                          0.18144 0.38809 0.016133
## 68
                      75
## 69
      0.00096571
                          0.18047 0.38799 0.016130
## 70
      0.00094299
                      76
                          0.17950 0.38842 0.016129
                      77
## 71
      0.00092604
                          0.17856 0.39098 0.016427
## 72
      0.00086791
                      78
                           0.17763 0.38891 0.016409
```

```
## 73 0.00086082
                    80
                        0.17590 0.38574 0.016251
## 74 0.00083882
                    81
                       0.17504 0.38536 0.016258
## 75 0.00082185
                    82
                        0.17420 0.38493 0.016320
## 76 0.00081999
                       0.17338 0.38452 0.016321
                   83
## 77 0.00081510
                    84
                        0.17256 0.38363 0.016318
## 78 0.00080718
                       0.17174 0.38364 0.016319
                   85
## 79 0.00080253
                    86
                       0.17093 0.38315 0.016318
## 80 0.00080214
                    87
                        0.17013 0.38295 0.016304
## 81
     0.00079999
                    88
                        0.16933 0.38230 0.016307
## 82
     0.00077675
                    89
                        0.16853 0.38409 0.016346
## 83 0.00076692
                    90
                        0.16775 0.38353 0.016300
## 84 0.00075579
                    91
                        0.16698 0.38345 0.016304
## 85 0.00074858
                   92 0.16623 0.38376 0.016300
## 86 0.00070380
                   94
                       0.16473 0.38406 0.016326
## 87 0.00069992
                    95
                       0.16403 0.38428 0.016334
## 88 0.00069223
                       0.16333 0.38439 0.016328
                    96
                   97
## 89 0.00068902
                       0.16264 0.38430 0.016334
## 90
     0.00068832
                    98
                        0.16195 0.38430 0.016334
## 91 0.00066915
                   99
                        0.16126 0.38498 0.016343
## 92 0.00066580
                 100
                       0.16059 0.38595 0.016387
## 93 0.00063716
                 103
                        0.15859 0.38728 0.016415
## 94 0.00063355
                  104
                       0.15795 0.38650 0.016435
## 95 0.00061813
                 105
                        0.15732 0.38686 0.016433
                 107
## 96 0.00061596
                       0.15609 0.38694 0.016430
## 97 0.00061410
                 108
                       0.15547 0.38675 0.016429
## 98 0.00060509
                 109
                        0.15486 0.38594 0.016432
## 99 0.00059366
                 110
                       0.15425 0.38699 0.016423
                 111
## 100 0.00057957
                        0.15366 0.38705 0.016426
## 101 0.00057526
                 112 0.15308 0.38741 0.016431
## 102 0.00055524
                 114
                       0.15193 0.38785 0.016444
                 115 0.15137 0.38742 0.016449
## 103 0.00055083
## 104 0.00054831
                 116 0.15082 0.38747 0.016448
## 105 0.00054719
                  117
                       0.15027 0.38753 0.016448
## 106 0.00049059
                       0.14972 0.38559 0.016355
                 118
                 119
## 107 0.00048324
                       0.14923 0.38634 0.016376
## 108 0.00048039
                   120
                       0.14875 0.38531 0.016358
## 109 0.00046824
                 121
                        0.14827 0.38523 0.016357
## 110 0.00046728
                 122 0.14780 0.38551 0.016367
                 123
## 111 0.00046207
                       0.14733 0.38566 0.016375
## 112 0.00044998
                 124 0.14687 0.38566 0.016383
## 113 0.00043664
                 125
                       0.14642 0.38706 0.016405
                 126
## 114 0.00043135
                       0.14599 0.38749 0.016404
## 115 0.00042858
                       0.14555 0.38757 0.016404
                 127
## 116 0.00041923
                  128
                        0.14513 0.38792 0.016402
## 117 0.00041219
                 129
                       0.14471 0.38720 0.016383
## 118 0.00040882
                   130
                        0.14429 0.38743 0.016386
## 119 0.00040711
                   131
                       0.14389 0.38737 0.016387
## 120 0.00040614
                 132
                        0.14348 0.38737 0.016387
                 133
## 121 0.00039895
                       0.14307 0.38780 0.016394
## 122 0.00038747
                  134
                       0.14267 0.38779 0.016375
## 123 0.00038480
                  135
                       0.14229 0.38793 0.016377
## 124 0.00038424
                 136
                       0.14190 0.38791 0.016376
## 125 0.00037809
                   137
                         0.14152 0.38795 0.016376
## 126 0.00037584
                   138
                         0.14114 0.38840 0.016374
```

```
## 129 0.00034302 142 0.13967 0.38924 0.016359
## 130 0.00033810 143 0.13933 0.38925 0.016358
## 131 0.00033694 144 0.13899 0.38916 0.016353
## 132 0.00033661 145 0.13865 0.38916 0.016353
## 133 0.00033647 146 0.13832 0.38916 0.016353
## 134 0.00032613 147 0.13798 0.38945 0.016365
## 136 0.00031893 149 0.13733 0.38934 0.016363
## 137 0.00031861 150 0.13702 0.38934 0.016363
## 138 0.00031509
             151 0.13670 0.38968 0.016371
## 141 0.00030788 154 0.13576 0.38962 0.016371
## 142 0.00030000 155 0.13545 0.38974 0.016370
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
   method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05 HC03_VC07
                                        HC03_VC09
## [6] HC03_VC10 HC03_VC11 HC03_VC12 HC03_VC129 HC03_VC13.x
## [11] HC03_VC13.y HC03_VC130 HC03_VC132 HC03_VC133 HC03_VC134
## [36] Longitude
              State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
          CP nsplit rel error xerror
##
   0.26894188 0 1.00000 1.00155 0.031361
## 1
## 2
    0.15300146
               1 0.73106 0.74155 0.023679
## 3
    0.04905506
               2 0.57806 0.59104 0.020994
               3 0.52900 0.54520 0.020071
## 4
    0.03483358
## 5
    0.02575390
               4 0.49417 0.51179 0.019595
## 6
    0.02255952
               5 0.46841 0.49739 0.018899
               6 0.44585 0.49222 0.018343
## 7
    0.02195363
    0.01812404
               7 0.42390 0.48633 0.018351
## 8
## 9
    0.01460201
               8 0.40578 0.47610 0.018274
## 10 0.01373019
               9 0.39117 0.46353 0.017995
## 11 0.01318438
               10 0.37744 0.46010 0.017916
## 12 0.01113299
               11
                  0.36426 0.44495 0.017486
               12 0.35313 0.42978 0.017668
## 13 0.01044189
## 14 0.00876037
               13 0.34269 0.42365 0.017534
               14 0.33393 0.42257 0.017363
## 15 0.00771485
## 16 0.00737522
               15 0.32621 0.42177 0.017322
## 17 0.00651898
               16 0.31884 0.42070 0.017387
## 18 0.00609098
               17
                   0.31232 0.41403 0.016834
```

```
## 19
      0.00582690
                     18
                          0.30623 0.41106 0.016709
## 20
      0.00523612
                     19
                         0.30040 0.40988 0.016625
## 21
      0.00482466
                     20
                          0.29516 0.41006 0.016587
## 22 0.00479629
                         0.29034 0.40727 0.016730
                     21
      0.00455377
                      22
                         0.28554 0.40446 0.016698
## 23
                         0.28099 0.40026 0.016621
## 24 0.00406023
                      23
## 25 0.00390075
                      24
                          0.27693 0.39499 0.016603
## 26
      0.00386309
                      25
                          0.27303 0.39462 0.016608
## 27
      0.00373690
                      26
                         0.26916 0.38832 0.016202
## 28
      0.00323021
                      27
                          0.26543 0.38951 0.016353
## 29
      0.00287222
                      28
                         0.26220 0.38492 0.016080
## 30
      0.00276227
                      29
                          0.25932 0.38388 0.016046
                         0.25656 0.38376 0.016047
## 31
      0.00273625
                     30
## 32 0.00269698
                     31
                         0.25383 0.38389 0.016046
## 33 0.00265792
                     32
                         0.25113 0.38452 0.016094
## 34
                         0.24847 0.38361 0.016104
      0.00261475
                     33
## 35
      0.00259402
                      34
                          0.24586 0.38176 0.016063
## 36
      0.00242374
                      35
                         0.24326 0.38063 0.016063
                          0.24084 0.37873 0.015939
## 37
      0.00234022
                      36
## 38
      0.00226835
                     37
                         0.23850 0.37934 0.015950
## 39
      0.00217154
                     39
                          0.23396 0.37383 0.015559
                         0.23179 0.37251 0.015387
## 40
     0.00203158
                     40
      0.00200903
                         0.22976 0.37512 0.015594
## 41
                     41
## 42 0.00197756
                     43
                         0.22574 0.37646 0.015670
## 43 0.00192518
                     44
                         0.22376 0.37600 0.015725
## 44
      0.00180554
                      45
                          0.22184 0.37429 0.015873
      0.00174488
                      47
                         0.21823 0.37565 0.015992
## 45
                          0.21648 0.37151 0.015684
## 46
      0.00171649
                     48
## 47
      0.00171513
                      49
                         0.21476 0.37179 0.015683
## 48
      0.00163250
                      50
                          0.21305 0.37065 0.015695
## 49
      0.00160365
                     51
                         0.21142 0.36948 0.015467
     0.00154749
                     52
                         0.20981 0.37041 0.015522
## 50
## 51
     0.00145486
                      53
                         0.20827 0.36787 0.015443
## 52
     0.00145420
                      54
                         0.20681 0.36606 0.015393
## 53
      0.00142485
                     55
                          0.20536 0.36644 0.015395
## 54
     0.00140643
                      56
                         0.20393 0.36792 0.015466
## 55
      0.00139441
                      58
                          0.20112 0.36678 0.015426
## 56
      0.00136615
                      59
                         0.19972 0.36640 0.015429
## 57
      0.00134432
                      62
                          0.19563 0.36467 0.015415
     0.00132904
                         0.19428 0.36558 0.015487
## 58
                      63
                         0.19295 0.36575 0.015521
## 59
      0.00132240
                      64
      0.00123928
                      65
                         0.19163 0.36524 0.015520
## 60
## 61
      0.00123217
                      66
                         0.19039 0.36561 0.015526
## 62
      0.00116417
                      67
                          0.18916 0.36426 0.015513
## 63
      0.00115728
                      68
                         0.18799 0.36339 0.015500
                      70
## 64
      0.00111347
                          0.18568 0.36386 0.015444
## 65
     0.00107149
                      71
                          0.18457 0.36175 0.015405
      0.00106199
                     72
                          0.18350 0.36313 0.015427
## 66
                     73
      0.00099296
                         0.18243 0.36348 0.015547
## 67
      0.00097298
                     74
                         0.18144 0.36297 0.015602
## 68
      0.00096571
                      75
## 69
                          0.18047 0.36317 0.015635
## 70
      0.00094299
                      76
                          0.17950 0.36297 0.015633
## 71
       0.00092604
                      77
                          0.17856 0.36322 0.015640
## 72
      0.00086791
                          0.17763 0.36160 0.015593
                      78
```

```
## 73 0.00086082
                    80
                        0.17590 0.35887 0.015618
## 74 0.00083882
                    81
                       0.17504 0.35908 0.015615
## 75 0.00082185
                    82
                        0.17420 0.35993 0.015535
## 76 0.00081999
                       0.17338 0.36040 0.015559
                    83
## 77 0.00081510
                    84
                        0.17256 0.36095 0.015596
## 78 0.00080718
                    85
                       0.17174 0.35999 0.015584
## 79 0.00080253
                    86
                        0.17093 0.36031 0.015580
## 80 0.00080214
                    87
                        0.17013 0.36003 0.015571
## 81 0.00079999
                    88
                        0.16933 0.35980 0.015571
## 82 0.00077675
                    89
                        0.16853 0.36091 0.015585
## 83 0.00076692
                    90
                        0.16775 0.36205 0.015637
## 84 0.00075579
                    91
                         0.16698 0.36116 0.015377
                       0.16623 0.36154 0.015362
## 85 0.00074858
                    92
## 86 0.00070380
                    94
                        0.16473 0.36112 0.015311
## 87 0.00069992
                    95
                       0.16403 0.36169 0.015322
## 88 0.00069223
                    96
                        0.16333 0.36185 0.015321
## 89 0.00068902
                   97
                       0.16264 0.36171 0.015319
## 90 0.00068832
                    98
                        0.16195 0.36145 0.015319
## 91 0.00066915
                   99
                        0.16126 0.36229 0.015338
## 92 0.00066580
                 100
                        0.16059 0.36314 0.015356
## 93 0.00063716
                 103
                        0.15859 0.36353 0.015362
## 94 0.00063355
                  104
                       0.15795 0.36428 0.015395
## 95 0.00061813
                  105
                        0.15732 0.36459 0.015393
## 96 0.00061596
                 107 0.15609 0.36416 0.015381
                 108
                        0.15547 0.36438 0.015380
## 97 0.00061410
## 98 0.00060509
                  109 0.15486 0.36422 0.015380
## 99 0.00059366
                 110 0.15425 0.36459 0.015414
                 111
## 100 0.00057957
                       0.15366 0.36502 0.015417
## 101 0.00057526
                  112 0.15308 0.36640 0.015426
## 102 0.00055524
                   114
                        0.15193 0.36723 0.015432
## 103 0.00055083
                 115 0.15137 0.36710 0.015427
## 104 0.00054831
                  116
                        0.15082 0.36723 0.015428
## 105 0.00054719
                  117 0.15027 0.36723 0.015428
                 118
## 106 0.00049059
                       0.14972 0.36719 0.015377
## 107 0.00048324
                 119 0.14923 0.36782 0.015381
## 108 0.00048039
                 120 0.14875 0.36780 0.015380
## 109 0.00046824
                  121
                       0.14827 0.36671 0.015269
## 110 0.00046728
                 122 0.14780 0.36672 0.015277
## 111 0.00046207
                   123
                        0.14733 0.36663 0.015277
## 112 0.00044998
                  124 0.14687 0.36603 0.015275
## 113 0.00043664
                 125
                        0.14642 0.36586 0.015264
## 114 0.00043135
                 126 0.14599 0.36628 0.015555
                 127
## 115 0.00042858
                       0.14555 0.36626 0.015556
## 116 0.00041923
                  128 0.14513 0.36637 0.015565
## 117 0.00041219
                 129 0.14471 0.36654 0.015610
                 130 0.14429 0.36612 0.015606
## 118 0.00040882
## 119 0.00040711
                   131 0.14389 0.36649 0.015621
## 120 0.00040614
                   132
                        0.14348 0.36668 0.015618
## 121 0.00040000
                 133 0.14307 0.36772 0.015687
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
      method = "anova", control = rpart.control(cp = cps[j]))
##
##
```

```
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05
                                       HC03_VC07
                                                    HC03_VC09
## [6] HC03_VC10 HC03_VC11 HC03_VC12 HC03_VC129 HC03_VC13.y
## [11] HC03_VC130 HC03_VC132 HC03_VC133 HC03_VC134 HC03_VC15
## [16] HC03_VC156 HC03_VC17 HC03_VC18 HC03_VC75
                                                    HC03_VC76
## [21] HC03_VC79
                  HC03_VC82 HC03_VC83 HC03_VC84
                                                    HC03_VC85
## [26] HC03_VC86 HC03_VC87 HC03_VC89
                                       HC03_VC90
                                                    HC03_VC91
## [31] Latitude
                  Longitude State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
              CP nsplit rel error xerror
##
## 1
     0.26894188
                  0 1.00000 1.00180 0.031369
## 2
     0.15300146
                     1 0.73106 0.74176 0.023924
                     2 0.57806 0.60123 0.021652
## 3
      0.04905506
## 4
      0.03483358
                    3 0.52900 0.55611 0.020830
      0.02575390
                       0.49417 0.53240 0.020343
## 5
                     4
## 6
      0.02255952
                    5 0.46841 0.51769 0.019450
## 7
      0.02195363
                    6 0.44585 0.50936 0.018819
      0.01812404
                    7 0.42390 0.50542 0.018670
## 8
## 9
      0.01460201
                    8 0.40578 0.49427 0.018466
     0.01373019
                    9 0.39117 0.48279 0.018634
## 10
## 11 0.01318438
                   10 0.37744 0.47520 0.018415
## 12 0.01113299
                   11
                       0.36426 0.46022 0.018035
## 13 0.01044189
                   12
                       0.35313 0.45204 0.018129
     0.00876037
                   13
                       0.34269 0.45075 0.018258
## 14
                       0.33393 0.44708 0.018553
## 15 0.00771485
                   14
## 16 0.00737522
                    15
                       0.32621 0.44371 0.018336
                   16 0.31884 0.44509 0.018425
## 17 0.00651898
## 18 0.00609098
                   17
                       0.31232 0.44015 0.018303
                       0.30623 0.43784 0.018761
## 19 0.00582690
                    18
     0.00523612
                   19
                       0.30040 0.43040 0.018717
## 20
## 21
     0.00482466
                    20
                       0.29516 0.43121 0.018479
## 22 0.00479629
                   21
                       0.29034 0.42938 0.018443
                    22
                        0.28554 0.42706 0.018382
## 23
     0.00455377
                   23 0.28099 0.43046 0.018613
## 24 0.00406023
## 25 0.00390075
                   24
                       0.27693 0.42810 0.018556
## 26 0.00386309
                    25 0.27303 0.42560 0.018554
## 27 0.00373690
                    26
                       0.26916 0.42564 0.018555
                   27 0.26543 0.41830 0.018025
## 28 0.00323021
                       0.26220 0.40850 0.017612
## 29 0.00287222
                   28
## 30 0.00276227
                    29
                       0.25932 0.40673 0.017558
## 31
     0.00273625
                   30
                       0.25656 0.40541 0.017531
                   31
                       0.25383 0.40510 0.017554
## 32 0.00269698
## 33 0.00265792
                   32
                       0.25113 0.40411 0.017483
## 34 0.00261475
                    33
                       0.24847 0.40506 0.017534
                   34 0.24586 0.40519 0.017524
## 35 0.00259402
## 36 0.00242374
                   35
                       0.24326 0.40686 0.017587
## 37 0.00234022
                    36
                       0.24084 0.40466 0.018218
                       0.23850 0.40289 0.018153
## 38 0.00226835
                   37
## 39
     0.00217154
                    39 0.23396 0.40023 0.018028
## 40
     0.00203158
                    40
                         0.23179 0.40011 0.018070
```

```
## 41
     0.00200903
                     41
                          0.22976 0.40111 0.018096
## 42 0.00197756
                      43
                         0.22574 0.40108 0.018092
## 43
      0.00192518
                      44
                          0.22376 0.39951 0.018115
     0.00180554
                         0.22184 0.39863 0.018094
## 44
                      45
## 45
      0.00174488
                      47
                          0.21823 0.39759 0.018098
      0.00171649
                      48
                         0.21648 0.39574 0.018072
## 46
## 47
      0.00171513
                     49
                          0.21476 0.39598 0.018123
     0.00163250
                         0.21305 0.39669 0.018183
## 48
                      50
## 49
      0.00160365
                      51
                          0.21142 0.39728 0.018152
## 50
      0.00154749
                     52
                          0.20981 0.39802 0.018302
## 51
      0.00145486
                      53
                         0.20827 0.39683 0.018223
## 52
      0.00145420
                      54
                          0.20681 0.39421 0.018211
                         0.20536 0.39411 0.018214
## 53
      0.00142485
                      55
## 54
      0.00140643
                      56
                          0.20393 0.39463 0.018220
     0.00139441
                      58
                         0.20112 0.39319 0.018178
## 55
## 56
      0.00136615
                     59
                          0.19972 0.39006 0.017657
## 57
      0.00134432
                     62
                         0.19563 0.38978 0.017630
     0.00132904
                      63
                         0.19428 0.38983 0.017630
## 58
## 59
      0.00132240
                      64
                          0.19295 0.39001 0.017672
## 60
      0.00123928
                      65
                         0.19163 0.38856 0.017614
## 61
      0.00123217
                      66
                          0.19039 0.38571 0.017396
## 62
     0.00116417
                      67
                          0.18916 0.38592 0.017406
## 63
      0.00115728
                      68
                          0.18799 0.38773 0.017483
## 64 0.00111347
                      70
                         0.18568 0.38740 0.017473
## 65
      0.00107149
                     71
                         0.18457 0.38703 0.017500
                      72
## 66 0.00106199
                         0.18350 0.38709 0.017485
      0.00099296
                     73
                         0.18243 0.38600 0.017442
## 67
                      74
                          0.18144 0.38581 0.017404
## 68
      0.00097298
## 69
      0.00096571
                      75
                          0.18047 0.38572 0.017404
      0.00094299
                      76
                          0.17950 0.38631 0.017394
## 70
                      77
## 71
      0.00092604
                         0.17856 0.38698 0.017400
## 72
      0.00086791
                     78
                          0.17763 0.38639 0.017416
     0.00086082
                         0.17590 0.38654 0.017431
## 73
                      80
## 74
      0.00083882
                      81
                          0.17504 0.38655 0.017436
## 75
      0.00082185
                     82
                         0.17420 0.38862 0.017460
     0.00081999
                          0.17338 0.38794 0.017453
## 76
                      83
## 77
      0.00081510
                      84
                          0.17256 0.38774 0.017454
## 78
      0.00080718
                      85
                          0.17174 0.38781 0.017437
## 79
      0.00080253
                      86
                          0.17093 0.38747 0.017439
## 80
      0.00080214
                      87
                          0.17013 0.38790 0.017444
## 81
      0.00079999
                      88
                          0.16933 0.38781 0.017444
## 82 0.00077675
                      89
                         0.16853 0.38729 0.017439
## 83 0.00076692
                     90
                          0.16775 0.38804 0.017466
## 84 0.00075579
                      91
                          0.16698 0.38891 0.017500
## 85
      0.00074858
                      92
                         0.16623 0.38906 0.017493
## 86
      0.00070380
                      94
                          0.16473 0.39040 0.017516
## 87
      0.00069992
                      95
                          0.16403 0.39086 0.017502
      0.00069223
                          0.16333 0.39052 0.017503
## 88
                      96
## 89
      0.00068902
                      97
                          0.16264 0.39006 0.017486
## 90
      0.00068832
                    98
                          0.16195 0.39025 0.017484
## 91
     0.00066915
                     99
                          0.16126 0.39068 0.017488
## 92
     0.00066580
                   100
                         0.16059 0.38920 0.017439
## 93 0.00063716
                    103
                          0.15859 0.38895 0.017463
## 94
      0.00063355
                    104
                          0.15795 0.38857 0.017453
```

```
## 95 0.00061813
                 105
                       0.15732 0.38861 0.017487
## 97 0.00061410 108 0.15547 0.38863 0.017483
## 98 0.00060509 109 0.15486 0.38846 0.017462
## 99 0.00059366 110 0.15425 0.38743 0.017464
## 100 0.00057957 111 0.15366 0.38884 0.017477
## 101 0.00057526
                112 0.15308 0.38885 0.017474
                114 0.15193 0.38955 0.017458
## 102 0.00055524
## 103 0.00055083 115 0.15137 0.38929 0.017452
                116 0.15082 0.38987 0.017479
## 104 0.00054831
## 105 0.00054719 117 0.15027 0.38983 0.017479
## 106 0.00050000
                118 0.14972 0.39096 0.017495
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
     method = "anova", control = rpart.control(cp = cps[j]))
##
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05 HC03_VC07
                                                  HC03_VC09
## [6] HC03_VC10 HC03_VC11 HC03_VC12 HC03_VC129 HC03_VC13.y
## [11] HC03_VC130 HC03_VC132 HC03_VC133 HC03_VC134 HC03_VC15
## [16] HC03_VC156 HC03_VC17 HC03_VC18 HC03_VC75 HC03_VC76
## [21] HC03_VC79 HC03_VC82 HC03_VC83 HC03_VC84 HC03_VC85
## [26] HC03_VC86 HC03_VC87 HC03_VC89 HC03_VC90 HC03_VC91
## [31] Latitude Longitude State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
           CP nsplit rel error xerror
##
## 1 0.26894188 0 1.00000 1.00036 0.031323
                  1 0.73106 0.74209 0.023963
## 2 0.15300146
                  2 0.57806 0.59321 0.021511
## 3 0.04905506
## 4 0.03483358
                  3 0.52900 0.55061 0.020632
## 5 0.02575390
                  4 0.49417 0.52761 0.020155
                      0.46841 0.50854 0.018410
## 6 0.02255952
                  5
## 7 0.02195363
                  6 0.44585 0.50697 0.018360
## 8 0.01812404
                  7
                     0.42390 0.50124 0.018194
## 9 0.01460201
                     0.40578 0.48594 0.018214
                  8
## 10 0.01373019
                  9 0.39117 0.47474 0.018158
## 11 0.01318438
                 10 0.37744 0.46953 0.018007
## 12 0.01113299
                 11 0.36426 0.45804 0.017656
## 13 0.01044189
                 12
                      0.35313 0.44732 0.017499
## 14 0.00876037
                 13 0.34269 0.43172 0.016869
## 15 0.00771485
                 14 0.33393 0.42361 0.016594
## 16 0.00737522
                 15 0.32621 0.41623 0.016236
## 17 0.00651898
                     0.31884 0.41348 0.016085
                 16
                 17 0.31232 0.40844 0.015578
## 18 0.00609098
## 19 0.00582690
                 18 0.30623 0.40841 0.015578
                 19 0.30040 0.40606 0.015561
## 20 0.00523612
## 21 0.00482466
                 20 0.29516 0.40678 0.015475
## 22 0.00479629
                 21 0.29034 0.39928 0.015079
## 23 0.00455377
                 22 0.28554 0.39890 0.015069
```

```
23 0.28099 0.39426 0.015164
## 24 0.00406023
## 25 0.00390075
                 24 0.27693 0.39292 0.015140
## 26 0.00386309
                 25 0.27303 0.39233 0.015190
                 26 0.26916 0.39052 0.015113
## 27 0.00373690
                 27
## 28 0.00323021
                      0.26543 0.38603 0.015108
## 29 0.00287222
                 28 0.26220 0.38450 0.015049
## 30 0.00276227
                 29 0.25932 0.38295 0.015485
                 30 0.25656 0.38008 0.015471
## 31 0.00273625
## 32 0.00269698
                 31 0.25383 0.38013 0.015487
## 33 0.00265792
                 32 0.25113 0.38061 0.015492
## 34 0.00261475
                 33 0.24847 0.38135 0.015584
## 35 0.00259402
                 34
                      0.24586 0.38165 0.015716
## 36 0.00242374
                 35 0.24326 0.38212 0.016001
## 37 0.00234022 36 0.24084 0.37944 0.015967
## 38 0.00226835
                 37 0.23850 0.37868 0.015992
## 39 0.00217154
                 39 0.23396 0.37914 0.015971
## 40 0.00203158
                 40 0.23179 0.37785 0.015960
## 41 0.00200903
                 41 0.22976 0.37682 0.015783
                 43 0.22574 0.37799 0.015810
## 42 0.00197756
## 43 0.00192518
                 44 0.22376 0.37689 0.015803
               45
## 44 0.00180554
                      0.22184 0.37626 0.015869
## 45 0.00174488
                 47 0.21823 0.37498 0.015889
                 48
                      0.21648 0.37412 0.015948
## 46 0.00171649
## 47 0.00171513
                 49 0.21476 0.37410 0.015947
## 48 0.00163250
                 50 0.21305 0.37572 0.016108
                 51 0.21142 0.37792 0.016161
## 49 0.00160365
## 50 0.00154749
                 52 0.20981 0.37746 0.016099
## 51 0.00145486 53 0.20827 0.37819 0.016054
## 52 0.00145420
                 54 0.20681 0.37839 0.016107
## 53 0.00142485
                 55
                      0.20536 0.38045 0.016158
## 54 0.00140643
                 56 0.20393 0.38052 0.016166
## 55 0.00139441
                 58 0.20112 0.37975 0.016153
                 59 0.19972 0.37999 0.016150
## 56 0.00136615
## 57 0.00134432
                 62 0.19563 0.37977 0.016228
## 58 0.00132904
                 63 0.19428 0.37916 0.016187
## 59 0.00132240
                 64 0.19295 0.37916 0.016187
## 60 0.00123928
                 65
                      0.19163 0.37849 0.016091
## 61 0.00123217
                 66 0.19039 0.37881 0.016083
               67 0.18916 0.38131 0.016104
## 62 0.00116417
## 63 0.00115728
                 68 0.18799 0.38035 0.016102
## 64 0.00111347
                 70 0.18568 0.38119 0.016206
## 65 0.00107149
                 71 0.18457 0.38149 0.016237
## 66 0.00106199
                 72 0.18350 0.38317 0.016278
                 73 0.18243 0.38373 0.016346
## 67 0.00099296
## 68 0.00097298
                 74 0.18144 0.38472 0.016342
                 75 0.18047 0.38392 0.016334
## 69 0.00096571
## 70 0.00094299
                 76 0.17950 0.38477 0.016337
## 71 0.00092604
                 77
                      0.17856 0.38535 0.016335
## 72 0.00086791
                 78 0.17763 0.38574 0.016336
## 73 0.00086082
                 80 0.17590 0.38583 0.016328
## 74 0.00083882
                 81 0.17504 0.38594 0.016354
## 75 0.00082185
                 82 0.17420 0.38537 0.016329
                 83 0.17338 0.38628 0.016341
## 76 0.00081999
## 77 0.00081510
                 84 0.17256 0.38651 0.016367
```

```
## 78 0.00080718
                85 0.17174 0.38675 0.016374
                86 0.17093 0.38718 0.016370
## 79 0.00080253
## 80 0.00080214
                87 0.17013 0.38617 0.016286
## 81 0.00079999
                88 0.16933 0.38617 0.016286
                89 0.16853 0.38706 0.016305
## 82 0.00077675
## 83 0.00076692
                90 0.16775 0.38619 0.016286
                91 0.16698 0.38632 0.016289
## 84 0.00075579
                92 0.16623 0.38641 0.016296
## 85 0.00074858
## 86 0.00070380
                94 0.16473 0.38583 0.016253
## 87 0.00069992
                95 0.16403 0.38489 0.016224
                96 0.16333 0.38428 0.016235
## 88 0.00069223
## 89 0.00068902
                97
                    0.16264 0.38397 0.016230
## 90 0.00068832
                98 0.16195 0.38393 0.016231
                 99 0.16126 0.38457 0.016249
## 91 0.00066915
## 92 0.00066580
                100 0.16059 0.38384 0.016239
## 93 0.00063716 103 0.15859 0.38352 0.016250
## 94 0.00063355 104 0.15795 0.38356 0.016254
## 95 0.00061813 105 0.15732 0.38470 0.016468
## 96 0.00061596 107 0.15609 0.38465 0.016479
## 97 0.00061410 108 0.15547 0.38496 0.016478
## 98 0.00060509 109 0.15486 0.38527 0.016493
## 99 0.00060000 110 0.15425 0.38498 0.016475
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
     method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05 HC03_VC07 HC03_VC09
## [6] HC03_VC10 HC03_VC11 HC03_VC12 HC03_VC129 HC03_VC13.y
## [11] HC03_VC130 HC03_VC132 HC03_VC133 HC03_VC134 HC03_VC156
## [16] HC03_VC17 HC03_VC18 HC03_VC76 HC03_VC79 HC03_VC82
## [31] State
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
           CP nsplit rel error xerror
## 1 0.26894188 0 1.00000 1.00174 0.031379
## 2 0.15300146
                  1 0.73106 0.73790 0.023692
                 2 0.57806 0.58845 0.021003
## 3 0.04905506
## 4 0.03483358
                 3 0.52900 0.54058 0.020064
                 4 0.49417 0.53661 0.020482
## 5 0.02575390
## 6 0.02255952
                 5 0.46841 0.52597 0.020172
                 6 0.44585 0.52312 0.020073
## 7 0.02195363
## 8 0.01812404
                 7 0.42390 0.51667 0.019658
                 8 0.40578 0.48858 0.019163
## 9 0.01460201
                 9 0.39117 0.47236 0.018786
## 10 0.01373019
                10 0.37744 0.46268 0.018625
## 11 0.01318438
## 12 0.01113299
                11 0.36426 0.46317 0.018893
## 13 0.01044189
                 12 0.35313 0.45268 0.018681
```

```
13 0.34269 0.44645 0.018356
## 14 0.00876037
## 15 0.00771485
                 14 0.33393 0.44070 0.018214
                 15 0.32621 0.43540 0.017799
## 16 0.00737522
                 16 0.31884 0.42657 0.017095
## 17 0.00651898
## 18 0.00609098
                 17
                      0.31232 0.41812 0.016514
## 19 0.00582690
                 18 0.30623 0.41745 0.016728
## 20 0.00523612
                 19 0.30040 0.41403 0.016553
                 20 0.29516 0.41427 0.016592
## 21 0.00482466
## 22 0.00479629
                 21 0.29034 0.41377 0.016595
## 23 0.00455377
                 22 0.28554 0.41363 0.016639
## 24 0.00406023
                 23 0.28099 0.40941 0.016453
## 25 0.00390075
                 24
                      0.27693 0.40296 0.016151
                 25 0.27303 0.40175 0.016076
## 26 0.00386309
## 27 0.00373690 26 0.26916 0.40036 0.016050
## 28 0.00323021
                 27 0.26543 0.39671 0.015814
## 29 0.00287222
                 28 0.26220 0.39250 0.015546
## 30 0.00276227
                 29 0.25932 0.38749 0.015543
## 31 0.00273625
                 30 0.25656 0.38669 0.015592
                 31
                     0.25383 0.38628 0.015635
## 32 0.00269698
## 33 0.00265792
                 32 0.25113 0.38691 0.015652
## 34 0.00261475 33 0.24847 0.38681 0.015646
## 35 0.00259402
                 34 0.24586 0.38711 0.015692
                 35 0.24326 0.38332 0.015182
## 36 0.00242374
## 37 0.00234022
                 36 0.24084 0.38068 0.015115
## 38 0.00226835 37 0.23850 0.37972 0.015047
                 39 0.23396 0.38042 0.015037
## 39 0.00217154
## 40 0.00203158
                 40 0.23179 0.38143 0.015068
## 41 0.00200903 41 0.22976 0.37865 0.015009
## 42 0.00197756
                 43 0.22574 0.37780 0.014956
## 43 0.00192518
                 44
                      0.22376 0.37779 0.014968
## 44 0.00180554
                 45 0.22184 0.37769 0.015010
## 45 0.00174488 47 0.21823 0.37680 0.015000
                 48 0.21648 0.37509 0.014956
## 46 0.00171649
## 47 0.00171513
                 49 0.21476 0.37448 0.014956
## 48 0.00163250
                 50 0.21305 0.37390 0.014951
## 49 0.00160365
                 51 0.21142 0.37231 0.014916
## 50 0.00154749
                 52 0.20981 0.37145 0.014888
## 51 0.00145486
                 53 0.20827 0.37115 0.014918
## 52 0.00145420
                 54 0.20681 0.37085 0.014944
## 53 0.00142485
                 55 0.20536 0.37076 0.014943
                 56 0.20393 0.37216 0.015021
## 54 0.00140643
## 55 0.00139441
                 58 0.20112 0.37259 0.015027
## 56 0.00136615
                 59 0.19972 0.37289 0.015036
                 62 0.19563 0.37258 0.015017
## 57 0.00134432
## 58 0.00132904
                 63 0.19428 0.37166 0.014950
## 59 0.00132240
                 64
                     0.19295 0.37257 0.014972
## 60 0.00123928
                 65 0.19163 0.37331 0.015011
                 66
                      0.19039 0.37255 0.014998
## 61 0.00123217
## 62 0.00116417
                 67 0.18916 0.37006 0.014975
## 63 0.00115728 68 0.18799 0.36999 0.014982
                 70 0.18568 0.37040 0.014982
## 64 0.00111347
## 65 0.00107149
                 71 0.18457 0.36888 0.014906
## 66 0.00106199
                 72 0.18350 0.36907 0.014945
## 67 0.00099296
                  73 0.18243 0.37039 0.014953
```

```
## 68 0.00097298
                 74 0.18144 0.37082 0.014963
                 75 0.18047 0.36993 0.014969
## 69 0.00096571
## 70 0.00094299 76 0.17950 0.36979 0.014954
## 71 0.00092604
                 77 0.17856 0.37016 0.015006
## 72 0.00086791
                 78 0.17763 0.37145 0.015109
## 73 0.00086082
                 80 0.17590 0.37209 0.015131
                 81 0.17504 0.37109 0.015143
## 74 0.00083882
                     0.17420 0.37111 0.015097
## 75 0.00082185
                 82
## 76 0.00081999
                 83 0.17338 0.37114 0.015107
## 77 0.00081510
                 84
                     0.17256 0.37104 0.015108
## 78 0.00080718
                 85 0.17174 0.37142 0.015071
## 79 0.00080253
                 86
                     0.17093 0.37169 0.015070
## 80 0.00080214
                 87 0.17013 0.37169 0.015140
                 88 0.16933 0.37178 0.015139
## 81 0.00079999
                 89 0.16853 0.37209 0.015159
## 82 0.00077675
## 83 0.00076692
                 90 0.16775 0.37272 0.015178
## 84 0.00075579
                 91 0.16698 0.37319 0.015201
## 85 0.00074858
                 92 0.16623 0.37306 0.015177
## 86 0.00070380
                 94 0.16473 0.37191 0.015250
## 87 0.00070000
                 95 0.16403 0.37243 0.015238
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
   method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
## [1] HC01 VC85.y HC03 VC04 HC03 VC05 HC03 VC07 HC03 VC10
## [6] HC03_VC11 HC03_VC12 HC03_VC129 HC03_VC13.y HC03_VC130
## [11] HC03_VC133 HC03_VC134 HC03_VC156 HC03_VC17 HC03_VC18
## [16] HC03_VC79 HC03_VC82 HC03_VC83 HC03_VC84 HC03_VC85
## [26] Latitude Longitude State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
           CP nsplit rel error xerror
## 1 0.26894188 0 1.00000 1.00257 0.031368
## 2 0.15300146
                  1 0.73106 0.74095 0.023726
                  2 0.57806 0.59824 0.021515
## 3 0.04905506
## 4 0.03483358
                  3 0.52900 0.55089 0.020667
                  4 0.49417 0.52010 0.019395
## 5 0.02575390
                     0.46841 0.49866 0.018540
## 6 0.02255952
## 7 0.02195363
                  6 0.44585 0.48792 0.017866
## 8 0.01812404
                  7 0.42390 0.48447 0.017924
## 9 0.01460201
                  8 0.40578 0.47573 0.017806
## 10 0.01373019
                  9
                     0.39117 0.46621 0.017805
## 11 0.01318438
                 10 0.37744 0.45954 0.017679
## 12 0.01113299
                 11 0.36426 0.45061 0.017285
                 12 0.35313 0.43447 0.017183
## 13 0.01044189
## 14 0.00876037
                 13 0.34269 0.42867 0.017352
## 15 0.00771485
                 14 0.33393 0.42533 0.017060
## 16 0.00737522
                 15 0.32621 0.42173 0.016900
```

```
16 0.31884 0.42172 0.016887
## 17 0.00651898
## 18 0.00609098
                 17 0.31232 0.41766 0.016771
                 18 0.30623 0.41111 0.016323
## 19 0.00582690
                 19 0.30040 0.41170 0.016421
## 20 0.00523612
                 20 0.29516 0.41004 0.016887
## 21 0.00482466
## 22 0.00479629
                 21 0.29034 0.40955 0.016920
                 22 0.28554 0.40894 0.016933
## 23 0.00455377
                 23 0.28099 0.40240 0.016819
## 24 0.00406023
## 25 0.00390075
                 24 0.27693 0.39921 0.016561
## 26 0.00386309
                 25 0.27303 0.39605 0.016152
## 27 0.00373690
                 26 0.26916 0.40181 0.016566
## 28 0.00323021
                 27
                      0.26543 0.40228 0.016622
## 29 0.00287222
                 28 0.26220 0.39671 0.016433
               29 0.25932 0.39447 0.016457
## 30 0.00276227
## 31 0.00273625
                 30 0.25656 0.39496 0.016469
## 32 0.00269698
                 31 0.25383 0.39679 0.016722
## 33 0.00265792
                 32 0.25113 0.39748 0.016767
## 34 0.00261475
                 33 0.24847 0.39767 0.016779
                 34
                      0.24586 0.39797 0.016775
## 35 0.00259402
## 36 0.00242374
                 35 0.24326 0.39418 0.016595
## 37 0.00234022 36 0.24084 0.39217 0.016582
## 38 0.00226835
                 37 0.23850 0.39396 0.016680
                 39
## 39 0.00217154
                      0.23396 0.39443 0.016645
## 40 0.00203158
                 40 0.23179 0.39212 0.016616
## 41 0.00200903
                 41 0.22976 0.39143 0.016713
                 43 0.22574 0.39080 0.016706
## 42 0.00197756
                 44 0.22376 0.39276 0.016736
## 43 0.00192518
## 44 0.00180554
                 45 0.22184 0.39064 0.016705
## 45 0.00174488
                 47 0.21823 0.38883 0.016572
## 46 0.00171649
                 48
                      0.21648 0.38921 0.016635
## 47 0.00171513
                 49 0.21476 0.38927 0.016629
## 48 0.00163250
                 50 0.21305 0.39045 0.016631
                 51 0.21142 0.39135 0.016682
## 49 0.00160365
## 50 0.00154749
                 52 0.20981 0.39023 0.016682
                 53 0.20827 0.39049 0.016713
## 51 0.00145486
## 52 0.00145420
                 54 0.20681 0.38908 0.016586
## 53 0.00142485
                 55
                      0.20536 0.38872 0.016581
## 54 0.00140643
                 56 0.20393 0.38773 0.016575
## 55 0.00139441
                 58 0.20112 0.38859 0.016648
## 56 0.00136615
                 59 0.19972 0.38746 0.016600
                 62 0.19563 0.38711 0.016592
## 57 0.00134432
## 58 0.00132904
                 63 0.19428 0.38653 0.016476
## 59 0.00132240
                 64 0.19295 0.38700 0.016467
                      0.19163 0.38724 0.016449
## 60 0.00123928
                 65
## 61 0.00123217
                 66 0.19039 0.38780 0.016578
## 62 0.00116417 67 0.18916 0.38865 0.016617
## 63 0.00115728
                 68 0.18799 0.38803 0.016647
                  70
## 64 0.00111347
                      0.18568 0.38743 0.016617
## 65 0.00107149
                 71 0.18457 0.38750 0.016655
## 66 0.00106199
                 72 0.18350 0.38848 0.016677
                 73 0.18243 0.38780 0.016689
## 67 0.00099296
## 68 0.00097298
                 74 0.18144 0.38955 0.016716
                 75 0.18047 0.39117 0.016747
## 69 0.00096571
## 70 0.00094299
                  76 0.17950 0.39021 0.016686
```

```
## 71 0.00092604
                 77 0.17856 0.38971 0.016641
## 72 0.00086791
                 78 0.17763 0.38902 0.016649
## 73 0.00086082
                 80 0.17590 0.38913 0.016692
## 74 0.00083882
                 81 0.17504 0.38903 0.016695
                 82 0.17420 0.38895 0.016710
## 75 0.00082185
## 76 0.00081999
                 83 0.17338 0.38829 0.016700
                 84 0.17256 0.38829 0.016700
## 77 0.00081510
                 85 0.17174 0.38842 0.016712
## 78 0.00080718
## 79 0.00080253
                 86 0.17093 0.38945 0.016731
## 80 0.00080214
                 87 0.17013 0.38937 0.016731
## 81 0.00080000
                 88 0.16933 0.38937 0.016731
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
     method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
## [1] HC01 VC85.y HC03 VC04 HC03 VC05 HC03 VC07
                                                 HC03 VC10
## [11] HC03_VC134 HC03_VC156 HC03_VC17 HC03_VC18 HC03_VC79
## [16] HC03_VC82 HC03_VC83 HC03_VC85 HC03_VC86 HC03_VC87
## [21] HC03_VC89 HC03_VC90 HC03_VC91 Latitude Longitude
## [26] State
##
## Root node error: 67.293/2547 = 0.02642
## n = 2547
##
           CP nsplit rel error xerror
##
## 1 0.26894188 0 1.00000 1.00096 0.031319
## 2 0.15300146
                  1 0.73106 0.74146 0.023909
## 3 0.04905506
                  2 0.57806 0.59841 0.021574
                  3 0.52900 0.55429 0.020681
## 4 0.03483358
                  4 0.49417 0.53329 0.020643
## 5 0.02575390
                  5 0.46841 0.52226 0.020115
## 6 0.02255952
## 7 0.02195363
                  6 0.44585 0.50053 0.018383
## 8 0.01812404
                  7
                     0.42390 0.49486 0.018044
## 9 0.01460201
                  8 0.40578 0.47986 0.017778
## 10 0.01373019
                  9 0.39117 0.47636 0.017775
## 11 0.01318438
                 10 0.37744 0.47565 0.017793
                 11 0.36426 0.45447 0.017575
## 12 0.01113299
## 13 0.01044189
                 12 0.35313 0.44361 0.017387
                 13 0.34269 0.43818 0.017300
## 14 0.00876037
## 15 0.00771485
                 14
                     0.33393 0.42520 0.017156
## 16 0.00737522
                 15 0.32621 0.42066 0.016854
                 16 0.31884 0.41760 0.016643
## 17 0.00651898
## 18 0.00609098
                 17 0.31232 0.41644 0.016783
                 18 0.30623 0.41578 0.016840
## 19 0.00582690
## 20 0.00523612
                 19 0.30040 0.41463 0.016811
## 21 0.00482466
                 20 0.29516 0.40618 0.016910
                 21 0.29034 0.40089 0.016237
## 22 0.00479629
## 23 0.00455377
                 22 0.28554 0.40076 0.016327
                 23 0.28099 0.39844 0.016408
## 24 0.00406023
## 25 0.00390075
                 24 0.27693 0.39892 0.016421
```

```
25 0.27303 0.39892 0.016421
## 26 0.00386309
## 27 0.00373690
                         26 0.26916 0.39756 0.016402
## 28 0.00323021 27 0.26543 0.39274 0.016049
## 29 0.00287222
                         28 0.26220 0.38289 0.015693
                         29 0.25932 0.37711 0.015574
## 30 0.00276227
## 31 0.00273625 30 0.25656 0.37903 0.015647
## 32 0.00269698 31 0.25383 0.37964 0.015640
## 33 0.00265792
                         32 0.25113 0.37873 0.015644
## 34 0.00261475 33 0.24847 0.37583 0.015517
## 35 0.00259402 34 0.24586 0.37549 0.015535
## 36 0.00242374 35 0.24326 0.37569 0.015474
## 37 0.00234022 36 0.24084 0.37645 0.015588
## 38 0.00226835 37 0.23850 0.37799 0.015640
## 39 0.00217154 39 0.23396 0.37868 0.015620
## 40 0.00203158
                         40 0.23179 0.37634 0.015660
## 41 0.00200903
                         41 0.22976 0.37730 0.015661
## 42 0.00197756 43 0.22574 0.37584 0.015582
## 43 0.00192518 44 0.22376 0.37753 0.015598
                         45 0.22184 0.37340 0.015321
## 44 0.00180554
## 45 0.00174488
                         47 0.21823 0.37335 0.015317
## 46 0.00171649 48 0.21648 0.37180 0.015305
## 47 0.00171513
                         49 0.21476 0.37024 0.015292
## 48 0.00163250
                         50 0.21305 0.37045 0.015370
## 49 0.00160365 51 0.21142 0.36819 0.015350
## 50 0.00154749 52 0.20981 0.36878 0.015315
                         53 0.20827 0.36503 0.015216
## 51 0.00145486
                         54 0.20681 0.36555 0.015274
## 52 0.00145420
## 53 0.00142485 55 0.20536 0.36643 0.015398
## 54 0.00140643 56 0.20393 0.36604 0.015402
## 55 0.00139441 58 0.20112 0.36611 0.015416
## 56 0.00136615 59 0.19972 0.36508 0.015416
## 57 0.00134432 62 0.19563 0.36565 0.015424
## 58 0.00132904
                         63 0.19428 0.36662 0.015426
## 59 0.00132240
                         64 0.19295 0.36559 0.015380
## 60 0.00123928 65 0.19163 0.36351 0.015295
## 61 0.00123217 66 0.19039 0.36316 0.015292
                         67 0.18916 0.36223 0.015319
68 0.18799 0.36249 0.015306
## 62 0.00116417
## 63 0.00115728
## 64 0.00111347 70 0.18568 0.36273 0.015385
## 65 0.00107149 71 0.18457 0.36143 0.015325
## 66 0.00106199 72 0.18350 0.36150 0.015342
## 67 0.00099296 73 0.18243 0.36182 0.015338
## 68 0.00097298 74 0.18144 0.36382 0.015573
## 69 0.00096571 75 0.18047 0.36411 0.015583
## 70 0.00094299 76 0.17950 0.36418 0.015611
## 71 0.00092604 77 0.17856 0.36601 0.015699
## 72 0.00090000
                          78 0.17763 0.36614 0.015696
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
       method = "anova", control = rpart.control(cp = cps[j]))
##
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC05 HC03_VC07 HC03_VC10 HC03_VC11
```

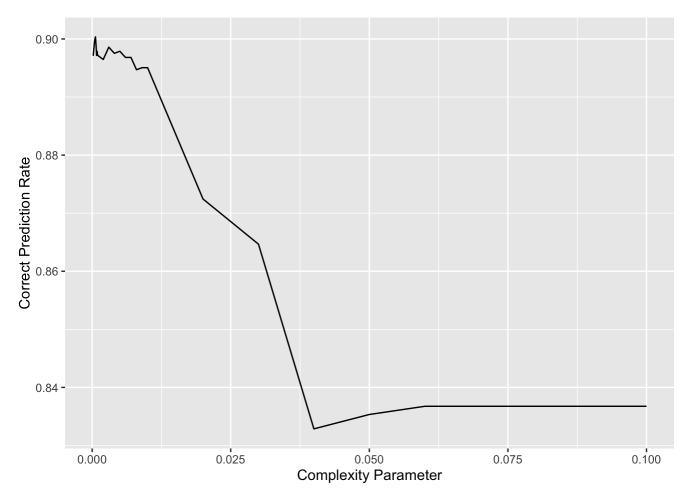
```
## [6] HC03 VC12
                 HC03_VC13.y HC03_VC130 HC03_VC133 HC03_VC134
## [11] HC03_VC156 HC03_VC17 HC03_VC18 HC03_VC79
                                                  HC03_VC82
## [16] HC03 VC83
                 HC03_VC85 HC03_VC86 HC03_VC87
                                                  HC03_VC89
## [21] HC03_VC90 HC03_VC91 Latitude Longitude
                                                  State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
           CP nsplit rel error xerror
                                      xstd
## 1 0.2689419 0 1.00000 1.00061 0.031308
## 2 0.1530015
                  1 0.73106 0.74017 0.023628
## 3 0.0490551
                 2 0.57806 0.59738 0.021119
                 3 0.52900 0.54261 0.020042
## 4 0.0348336
                 4 0.49417 0.51566 0.019329
## 5 0.0257539
## 6 0.0225595
## 7 0.0219536
                 5 0.46841 0.49506 0.018605
                 6 0.44585 0.48501 0.017841
## 8 0.0181240
                 7 0.42390 0.48042 0.017698
## 9 0.0146020
                  8 0.40578 0.45473 0.016749
## 10 0.0137302
                 9 0.39117 0.43944 0.016572
## 10 0.0137302 9 0.39117 0.43944 0.016572
## 11 0.0131844 10 0.37744 0.43534 0.016529
## 12 0.0111330
                 11 0.36426 0.44227 0.017600
## 13 0.0104419
                12 0.35313 0.43206 0.017502
## 14 0.0087604 13 0.34269 0.42979 0.017353
## 15 0.0077149
                14 0.33393 0.42231 0.017378
                 15 0.32621 0.42185 0.017313
## 16 0.0073752
## 17 0.0065190
                16 0.31884 0.41651 0.017153
## 19 0.0058269
                 18 0.30623 0.41513 0.017258
                19 0.30040 0.41075 0.017134
## 20 0.0052361
## 21 0.0048247
                20 0.29516 0.40718 0.017089
## 22 0.0047963 21 0.29034 0.40379 0.017086
                 22 0.28554 0.40593 0.017100
## 23 0.0045538
## 24 0.0040602
                23 0.28099 0.40729 0.017391
## 25 0.0039007 24 0.27693 0.40525 0.017370
## 26 0.0038631
                25 0.27303 0.40547 0.017577
## 27 0.0037369
                  26 0.26916 0.40583 0.017582
## 28 0.0032302
                27 0.26543 0.40219 0.017279
## 29 0.0028722 28 0.26220 0.39982 0.017260
## 30 0.0027623
                 29 0.25932 0.39424 0.016782
## 31 0.0027362
                30 0.25656 0.39071 0.016330
## 32 0.0026970 31 0.25383 0.38969 0.016304
## 33 0.0026579
                32 0.25113 0.38889 0.016289
                 33 0.24847 0.38883 0.016287
## 34 0.0026147
## 35 0.0025940
                34 0.24586 0.38928 0.016343
## 36 0.0024237 35 0.24326 0.38973 0.016367
## 37 0.0023402
                 36 0.24084 0.38725 0.016288
## 38 0.0022683
                 37 0.23850 0.38623 0.016271
## 39 0.0021715
                39 0.23396 0.38638 0.016305
## 40 0.0020316
                40 0.23179 0.38646 0.016381
                 41 0.22976 0.38252 0.016251
## 41 0.0020090
## 42 0.0019776
                43 0.22574 0.38251 0.016293
## 43 0.0019252
                44 0.22376 0.38237 0.016304
## 44 0.0018055
                  45
                      0.22184 0.37929 0.016259
```

```
## 45 0.0017449
                  47 0.21823 0.38235 0.016430
## 46 0.0017165
                  48 0.21648 0.38275 0.016446
## 47 0.0017151
                  49 0.21476 0.38151 0.016430
## 48 0.0016325
                  50 0.21305 0.38254 0.016543
                  51 0.21142 0.38269 0.016574
## 49 0.0016037
## 50 0.0015475
                  52 0.20981 0.38367 0.016599
                 53 0.20827 0.38038 0.016447
## 51 0.0014549
## 52 0.0014542
                  54 0.20681 0.37897 0.016433
                  55 0.20536 0.37784 0.016416
## 53 0.0014249
## 54 0.0014064
                 56 0.20393 0.37854 0.016394
## 55 0.0013944
                  58 0.20112 0.37796 0.016398
## 56 0.0013662
                  59
                      0.19972 0.37794 0.016402
## 57 0.0013443
                  62 0.19563 0.37665 0.016361
## 58 0.0013290
                 63 0.19428 0.37470 0.016359
## 59 0.0013224
                 64 0.19295 0.37523 0.016348
## 60 0.0012393
                 65 0.19163 0.37489 0.016367
## 61 0.0012322
                 66 0.19039 0.37599 0.016428
                 67 0.18916 0.37623 0.016418
## 62 0.0011642
                  68 0.18799 0.37600 0.016399
## 63 0.0011573
## 64 0.0011135
                 70 0.18568 0.37479 0.016264
## 65 0.0010715
                  71 0.18457 0.37331 0.016227
## 66 0.0010620
                  72 0.18350 0.37354 0.016255
## 67 0.0010000
                  73 0.18243 0.37435 0.016238
```

```
#build tree again with new cp range
cps2 = c(seq(0.0005, 0.0015, by = .0001))
preds2 = matrix(nrow = nbuild, ncol = length(cps))
tree2 = list()
for (i in 1:10) {
 buildfold = folds[, -i]
 testfold = folds[, i]
 for (j in 1:length(cps)) {
   tree2[[j]] = rpart( repvotes ~ .,
            data = buildset[buildfold, -(3)],
            method = "anova",
            control = rpart.control(cp = cps[j]))
    preds2[testfold, j] =
      predict(tree2[[j]],
              newdata = buildset[testfold, -c(1,3)],
              type = "vector")
cpr2 = apply(preds2, 2, function(oneSet) {
 return(sum(c(oneSet>.5)==c(buildset[,1]>.5))/nbuild)
})
which.max(cpr2)
```

```
## [1] 6
```

```
cprdf = data.frame(cps, cpr2)
ggplot(data = cprdf, aes(x = cps, y = cpr2)) +
  geom_line() +
  labs(x = "Complexity Parameter", y = "Correct Prediction Rate")
```



```
for(i in 1:10){
  printcp(tree2[[i]])
}
```

```
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
##
      method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
  [1] HC01_VC85.y HC03_VC04 HC03_VC05 HC03_VC07
                                                     HC03_VC08
   [6] HC03_VC09 HC03_VC10 HC03_VC11 HC03_VC12
                                                     HC03_VC129
## [11] HC03_VC13.x HC03_VC13.y HC03_VC130 HC03_VC131 HC03_VC132
## [16] HC03_VC133 HC03_VC134 HC03_VC14 HC03_VC15
                                                     HC03_VC156
## [21] HC03_VC17
                  HC03_VC18
                             HC03_VC75
                                        HC03_VC76
                                                     HC03_VC77
## [26] HC03_VC78
                 HC03_VC79 HC03_VC80
                                        HC03_VC81
                                                     HC03_VC82
## [31] HC03_VC83
                  HC03_VC84
                             HC03_VC85
                                        HC03_VC86
                                                     HC03_VC87
```

```
## [36] HC03 VC88
                 HC03_VC89
                             HC03 VC90
                                         HC03 VC91
                                                      Latitude
## [41] Longitude
                   State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
              CP nsplit rel error xerror
## 1
      0.26894188
                     0 1.00000 1.00045 0.031321
## 2
      0.15300146
                      1
                        0.73106 0.74194 0.023900
                      2 0.57806 0.59182 0.021475
## 3
      0.04905506
## 4
      0.03483358
                      3
                        0.52900 0.54587 0.020513
      0.02575390
                     4 0.49417 0.52939 0.020089
## 5
                     5 0.46841 0.51754 0.019705
## 6
      0.02255952
## 7
      0.02195363
                      6 0.44585 0.50741 0.019094
      0.01812404
                     7
                        0.42390 0.49686 0.018547
## 8
                        0.40578 0.48644 0.018362
## 9
      0.01460201
                     8
## 10
      0.01373019
                     9
                        0.39117 0.47268 0.017853
      0.01318438
                     10
                         0.37744 0.46683 0.017838
## 11
## 12
     0.01113299
                    11
                        0.36426 0.46119 0.017736
## 13
      0.01044189
                     12
                        0.35313 0.45142 0.017328
## 14 0.00876037
                        0.34269 0.43675 0.017226
                     13
      0.00771485
                     14
                        0.33393 0.42940 0.017001
## 15
                        0.32621 0.42019 0.016381
## 16 0.00737522
                    15
## 17 0.00651898
                     16
                        0.31884 0.41523 0.016162
## 18
      0.00609098
                     17
                         0.31232 0.41323 0.016092
## 19
      0.00582690
                     18
                        0.30623 0.41749 0.017110
      0.00523612
                     19
                         0.30040 0.41884 0.017175
## 20
## 21 0.00482466
                     20
                        0.29516 0.41304 0.017024
## 22 0.00479629
                     21
                         0.29034 0.41325 0.016984
## 23 0.00455377
                        0.28554 0.40600 0.016227
                     22
## 24 0.00406023
                     23
                        0.28099 0.40981 0.016437
                        0.27693 0.41180 0.016568
## 25 0.00390075
                     24
                     25
                        0.27303 0.41204 0.016563
## 26 0.00386309
## 27
      0.00373690
                     26
                         0.26916 0.41045 0.016570
## 28
     0.00323021
                     27
                        0.26543 0.40817 0.016546
      0.00287222
                         0.26220 0.40546 0.016624
## 29
                     28
## 30
     0.00276227
                     29
                        0.25932 0.40436 0.016660
## 31 0.00273625
                     30
                        0.25656 0.40384 0.016657
## 32 0.00269698
                     31
                        0.25383 0.40445 0.016861
## 33 0.00265792
                     32
                        0.25113 0.40370 0.016843
                        0.24847 0.40133 0.016851
## 34 0.00261475
                     33
                        0.24586 0.40109 0.016854
## 35 0.00259402
                     34
## 36
     0.00242374
                     35
                         0.24326 0.40057 0.016768
## 37
      0.00234022
                     36
                        0.24084 0.40043 0.016752
      0.00226835
                     37
                          0.23850 0.40201 0.016753
## 38
## 39
     0.00217154
                     39
                        0.23396 0.40277 0.016829
      0.00203158
                     40
                         0.23179 0.40128 0.016882
## 40
                        0.22976 0.39875 0.016744
## 41
     0.00200903
                     41
## 42 0.00197756
                     43
                        0.22574 0.39904 0.016784
## 43 0.00192518
                        0.22376 0.39825 0.016782
                     44
## 44 0.00180554
                     45
                        0.22184 0.39996 0.016910
## 45
      0.00174488
                     47
                          0.21823 0.40271 0.017091
      0.00171649
                     48
                          0.21648 0.40324 0.017077
## 46
```

```
## 47
      0.00171513
                      49
                           0.21476 0.40256 0.017078
## 48
      0.00163250
                      50
                          0.21305 0.40217 0.016962
## 49
       0.00160365
                      51
                           0.21142 0.40479 0.017059
      0.00154749
                          0.20981 0.40226 0.016949
## 50
                      52
## 51
      0.00145486
                      53
                           0.20827 0.39998 0.016864
      0.00145420
## 52
                      54
                          0.20681 0.39891 0.016913
## 53
      0.00142485
                      55
                           0.20536 0.39874 0.016867
     0.00140643
                          0.20393 0.39928 0.016876
## 54
                      56
## 55
      0.00139441
                      58
                          0.20112 0.39919 0.016868
## 56
      0.00136615
                      59
                          0.19972 0.39928 0.016870
## 57
      0.00134432
                      62
                           0.19563 0.39690 0.016809
## 58
      0.00132904
                      63
                           0.19428 0.39670 0.016767
                          0.19295 0.39666 0.016772
## 59
      0.00132240
                      64
## 60
      0.00123928
                      65
                           0.19163 0.39370 0.016655
      0.00123217
                          0.19039 0.39263 0.016670
## 61
                      66
## 62
     0.00116417
                      67
                          0.18916 0.39282 0.016674
## 63 0.00115728
                      68
                          0.18799 0.39187 0.016625
## 64 0.00111347
                      70
                          0.18568 0.39081 0.016614
## 65
      0.00107149
                      71
                           0.18457 0.38994 0.016592
## 66
      0.00106199
                      72
                          0.18350 0.39092 0.016603
## 67
       0.00099296
                      73
                           0.18243 0.39058 0.016623
## 68
      0.00097298
                      74
                          0.18144 0.39108 0.016756
## 69
      0.00096571
                      75
                          0.18047 0.39400 0.016890
## 70
      0.00094299
                      76
                          0.17950 0.39342 0.016891
                      77
## 71
      0.00092604
                           0.17856 0.39372 0.016864
## 72
     0.00086791
                      78
                          0.17763 0.39264 0.016902
      0.00086082
                          0.17590 0.39251 0.016898
## 73
                      80
## 74
      0.00083882
                      81
                           0.17504 0.39231 0.016903
## 75
      0.00082185
                      82
                           0.17420 0.39396 0.016909
      0.00081999
                      83
                           0.17338 0.39356 0.016817
## 76
## 77
      0.00081510
                      84
                           0.17256 0.39344 0.016818
## 78
      0.00080718
                      85
                           0.17174 0.39345 0.016859
## 79
      0.00080253
                           0.17093 0.39323 0.016853
                      86
## 80
      0.00080214
                      87
                           0.17013 0.39332 0.016855
## 81
      0.00079999
                      88
                          0.16933 0.39332 0.016855
                      89
                          0.16853 0.39407 0.016862
## 82 0.00077675
## 83
      0.00076692
                      90
                           0.16775 0.39329 0.016835
## 84
      0.00075579
                      91
                          0.16698 0.39368 0.016830
      0.00074858
                      92
                           0.16623 0.39278 0.016811
## 85
## 86
      0.00070380
                      94
                          0.16473 0.39476 0.016837
## 87
      0.00069992
                      95
                           0.16403 0.39581 0.016836
## 88
      0.00069223
                      96
                          0.16333 0.39550 0.016835
                      97
## 89
      0.00068902
                           0.16264 0.39535 0.016845
## 90
     0.00068832
                      98
                           0.16195 0.39547 0.016845
## 91
      0.00066915
                      99
                          0.16126 0.39599 0.016850
## 92
      0.00066580
                     100
                           0.16059 0.39558 0.016852
## 93
      0.00063716
                     103
                           0.15859 0.39508 0.016844
      0.00063355
                     104
                           0.15795 0.39392 0.016806
## 94
## 95
      0.00061813
                     105
                           0.15732 0.39384 0.016810
## 96
      0.00061596
                     107
                           0.15609 0.39389 0.016802
## 97
      0.00061410
                     108
                          0.15547 0.39433 0.016838
## 98
      0.00060509
                     109
                          0.15486 0.39393 0.016838
## 99
       0.00059366
                     110
                           0.15425 0.39420 0.016837
## 100 0.00057957
                     111
                           0.15366 0.39433 0.016860
```

```
## 101 0.00057526
                 112
                       0.15308 0.39613 0.016922
## 102 0.00055524 114 0.15193 0.39527 0.016883
                 115 0.15137 0.39535 0.016892
## 103 0.00055083
## 104 0.00054831
                 116 0.15082 0.39533 0.016890
## 105 0.00054719
                 117 0.15027 0.39541 0.016889
                 118 0.14972 0.39553 0.016884
## 106 0.00049059
## 107 0.00048324
                 119 0.14923 0.39623 0.016949
                 120 0.14875 0.39527 0.016773
## 108 0.00048039
## 109 0.00046824
                 121
                       0.14827 0.39457 0.016764
## 110 0.00046728
                 122
                       0.14780 0.39409 0.016765
## 111 0.00046207
                  123 0.14733 0.39424 0.016766
## 112 0.00044998
                 124
                       0.14687 0.39313 0.016748
## 113 0.00043664
                 125 0.14642 0.39306 0.016738
## 114 0.00043135
                 126 0.14599 0.39312 0.016728
## 115 0.00042858
                 127 0.14555 0.39363 0.016736
## 116 0.00041923
                 128 0.14513 0.39345 0.016720
                 129 0.14471 0.39393 0.016718
## 117 0.00041219
## 118 0.00040882
                   130 0.14429 0.39412 0.016717
## 119 0.00040711
                   131
                       0.14389 0.39366 0.016710
## 120 0.00040614
                 132 0.14348 0.39351 0.016713
## 121 0.00039895
                 133
                       0.14307 0.39319 0.016709
## 122 0.00038747
                 134 0.14267 0.39438 0.016741
## 123 0.00038480
                 135 0.14229 0.39408 0.016740
## 124 0.00038424
                 136 0.14190 0.39401 0.016741
## 125 0.00037809
                 137 0.14152 0.39388 0.016735
                 138
## 126 0.00037584
                       0.14114 0.39386 0.016735
## 127 0.00036870
                 140 0.14039 0.39378 0.016736
                 141
## 128 0.00034819
                       0.14002 0.39400 0.016732
## 129 0.00034302
                 142 0.13967 0.39441 0.016756
                 143
## 130 0.00033810
                       0.13933 0.39403 0.016682
## 131 0.00033694
                 144 0.13899 0.39420 0.016681
## 132 0.00033661
                 145 0.13865 0.39409 0.016682
## 133 0.00033647
                 146
                       0.13832 0.39409 0.016682
## 134 0.00032613
                 147 0.13798 0.39462 0.016685
                 148
## 135 0.00031906
                       0.13765 0.39599 0.016696
## 136 0.00031893
                 149
                       0.13733 0.39626 0.016695
## 137 0.00031861
                 150
                       0.13702 0.39626 0.016695
## 138 0.00031509
                 151 0.13670 0.39629 0.016697
## 139 0.00031365
                 152 0.13638 0.39643 0.016697
## 140 0.00031258
                 153 0.13607 0.39680 0.016704
## 141 0.00030788
                 154 0.13576 0.39646 0.016702
                 155 0.13545 0.39601 0.016658
## 142 0.00029802
## 143 0.00029594
                 156 0.13515 0.39599 0.016659
## 144 0.00027781
                 158
                       0.13456 0.39602 0.016660
## 145 0.00027672
                 159
                       0.13428 0.39603 0.016661
## 146 0.00027287
                        0.13400 0.39636 0.016675
                   160
## 147 0.00027246
                   161
                       0.13373 0.39636 0.016675
## 148 0.00027010
                 162
                       0.13346 0.39630 0.016675
## 149 0.00025144
                 163 0.13319 0.39637 0.016673
## 150 0.00024464
                 164 0.13294 0.39705 0.016655
## 151 0.00024056
                  165
                       0.13269 0.39692 0.016652
## 152 0.00023660
                 166
                       0.13245 0.39726 0.016653
## 153 0.00023198
                   167
                       0.13221 0.39739 0.016653
## 154 0.00023124
                   168
                         0.13198 0.39758 0.016656
```

```
## 155 0.00022249 169 0.13175 0.39778 0.016664
## 156 0.00021870 170 0.13153 0.39803 0.016666
## 157 0.00020670 173 0.13087 0.39808 0.016667
## 158 0.00020481 174 0.13067 0.39765 0.016652
             175 0.13046 0.39781 0.016658
## 159 0.00020284
## 160 0.00020023 176 0.13026 0.39765 0.016646
## 161 0.00019943 177 0.13006 0.39779 0.016645
## 162 0.00019887 178 0.12986 0.39782 0.016645
## 163 0.00019599 179 0.12966 0.39782 0.016645
## 164 0.00019341 180 0.12946 0.39781 0.016648
## 165 0.00019139 182 0.12908 0.39812 0.016657
## 166 0.00018900
             183 0.12889 0.39812 0.016657
## 167 0.00018848 184 0.12870 0.39810 0.016657
## 168 0.00018555 185 0.12851 0.39811 0.016653
## 169 0.00018454 186 0.12832 0.39821 0.016654
## 170 0.00018155 187 0.12814 0.39744 0.016634
## 171 0.00017521 188 0.12796 0.39731 0.016632
## 172 0.00016557 189 0.12778 0.39769 0.016611
## 173 0.00015708
             190 0.12762 0.39821 0.016617
## 176 0.00013881 194 0.12702 0.39887 0.016617
## 181 0.00012368 199 0.12636 0.39948 0.016622
## 182 0.00012341     200     0.12624 0.39951 0.016622
## 183 0.00010871 201 0.12611 0.39969 0.016622
             202 0.12600 0.40000 0.016619
## 184 0.00010297
## 185 0.00010000 203 0.12590 0.39997 0.016618
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
  method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
## [1] HC01 VC85.y HC03 VC04 HC03 VC05 HC03 VC07
                                          HC03 VC08
## [6] HC03_VC09 HC03_VC10 HC03_VC11 HC03_VC12
                                          HC03_VC129
## [11] HC03_VC13.x HC03_VC13.y HC03_VC130 HC03_VC131 HC03_VC132
## [16] HC03_VC133 HC03_VC134 HC03_VC14 HC03_VC15 HC03_VC156
## [21] HC03_VC17 HC03_VC18 HC03_VC75 HC03_VC76 HC03_VC77
## [41] Longitude
               State
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
           CP nsplit rel error xerror xstd
## 1 0.26894188 0 1.00000 1.00124 0.031353
## 2
     0.15300146
                1 0.73106 0.74319 0.023934
```

```
## 3
      0.04905506
                          0.57806 0.59506 0.021450
## 4
      0.03483358
                      3
                        0.52900 0.54913 0.020519
## 5
      0.02575390
                      4
                         0.49417 0.53287 0.020115
                     5 0.46841 0.52345 0.019590
## 6
      0.02255952
## 7
      0.02195363
                         0.44585 0.50381 0.018691
                      6
                     7
                        0.42390 0.50079 0.018779
## 8
      0.01812404
## 9
      0.01460201
                         0.40578 0.48614 0.018335
                     8
## 10
      0.01373019
                     9
                         0.39117 0.47243 0.018373
## 11
      0.01318438
                     10
                         0.37744 0.47090 0.018428
## 12
      0.01113299
                     11
                          0.36426 0.46228 0.018262
## 13 0.01044189
                     12
                         0.35313 0.44786 0.018341
## 14
      0.00876037
                     13
                         0.34269 0.43944 0.018209
     0.00771485
                        0.33393 0.43521 0.018000
## 15
                    14
## 16 0.00737522
                     15
                         0.32621 0.43085 0.017762
## 17
      0.00651898
                     16
                         0.31884 0.42604 0.017676
      0.00609098
                     17
                         0.31232 0.42026 0.017512
## 18
## 19
      0.00582690
                     18
                         0.30623 0.41524 0.017280
## 20
      0.00523612
                     19
                         0.30040 0.41381 0.017253
                     20
                          0.29516 0.40642 0.016863
## 21
      0.00482466
## 22
     0.00479629
                     21
                         0.29034 0.39979 0.016749
      0.00455377
                     22
                         0.28554 0.40142 0.016786
## 23
                         0.28099 0.39703 0.016489
## 24 0.00406023
                     23
      0.00390075
                     24
                         0.27693 0.39186 0.016182
## 25
## 26 0.00386309
                     25
                        0.27303 0.38951 0.016084
## 27 0.00373690
                     26
                         0.26916 0.39036 0.016052
## 28
      0.00323021
                     27
                         0.26543 0.38762 0.015891
## 29
      0.00287222
                     28
                         0.26220 0.38386 0.016016
                     29
                          0.25932 0.38210 0.015920
## 30
      0.00276227
## 31
     0.00273625
                     30
                         0.25656 0.38076 0.015858
## 32
      0.00269698
                     31
                         0.25383 0.37995 0.015844
## 33 0.00265792
                     32
                        0.25113 0.37956 0.015832
## 34 0.00261475
                     33
                         0.24847 0.37980 0.015840
## 35 0.00259402
                     34
                         0.24586 0.37859 0.015715
## 36
     0.00242374
                     35
                         0.24326 0.37959 0.015779
## 37
      0.00234022
                     36
                          0.24084 0.37503 0.015513
## 38
     0.00226835
                     37
                         0.23850 0.37287 0.015447
                     39
## 39
      0.00217154
                          0.23396 0.37288 0.015448
## 40
      0.00203158
                     40
                         0.23179 0.37243 0.015346
      0.00200903
                     41
                         0.22976 0.37431 0.015472
## 41
## 42 0.00197756
                     43
                         0.22574 0.37505 0.015577
                     44
                         0.22376 0.37442 0.015573
## 43 0.00192518
## 44 0.00180554
                     45
                         0.22184 0.37678 0.015624
## 45 0.00174488
                     47
                         0.21823 0.37611 0.015527
## 46
      0.00171649
                     48
                         0.21648 0.37830 0.015566
## 47
      0.00171513
                     49
                         0.21476 0.38068 0.015755
                     50
## 48
      0.00163250
                          0.21305 0.38104 0.015963
## 49
      0.00160365
                     51
                         0.21142 0.38176 0.016181
      0.00154749
                         0.20981 0.38265 0.016209
## 50
                     52
## 51
     0.00145486
                     53
                         0.20827 0.38162 0.016262
## 52 0.00145420
                     54
                         0.20681 0.38016 0.016381
                         0.20536 0.37991 0.016379
## 53 0.00142485
                     55
## 54
     0.00140643
                     56
                         0.20393 0.38211 0.016568
## 55
      0.00139441
                     58
                          0.20112 0.38218 0.016571
      0.00136615
                     59
                          0.19972 0.38015 0.016515
## 56
```

```
## 57 0.00134432
                     62
                          0.19563 0.37871 0.016357
## 58
      0.00132904
                     63
                          0.19428 0.37837 0.016352
## 59
      0.00132240
                     64
                          0.19295 0.37834 0.016352
      0.00123928
                         0.19163 0.37777 0.016352
## 60
                     65
## 61
      0.00123217
                     66
                          0.19039 0.37504 0.016298
     0.00116417
                     67
                         0.18916 0.37569 0.016361
## 62
## 63 0.00115728
                     68
                          0.18799 0.37632 0.016366
## 64 0.00111347
                     70
                         0.18568 0.37569 0.016354
      0.00107149
                     71
                         0.18457 0.37511 0.016345
## 65
## 66
      0.00106199
                     72
                          0.18350 0.37538 0.016356
## 67
     0.00099296
                     73
                         0.18243 0.37490 0.016329
## 68
      0.00097298
                     74
                          0.18144 0.37556 0.016330
                     75
                         0.18047 0.37542 0.016292
## 69
      0.00096571
## 70
      0.00094299
                     76
                          0.17950 0.37649 0.016308
## 71
     0.00092604
                     77
                          0.17856 0.37593 0.016295
                     78
## 72 0.00086791
                          0.17763 0.37502 0.016268
## 73 0.00086082
                     80
                          0.17590 0.37548 0.016281
## 74 0.00083882
                     81
                          0.17504 0.37629 0.016343
## 75
      0.00082185
                     82
                          0.17420 0.37630 0.016378
## 76
     0.00081999
                     83
                          0.17338 0.37582 0.016374
## 77
      0.00081510
                     84
                          0.17256 0.37592 0.016374
## 78
      0.00080718
                     85
                          0.17174 0.37617 0.016378
## 79
      0.00080253
                     86
                          0.17093 0.37614 0.016377
     0.00080214
                     87
                         0.17013 0.37614 0.016377
## 80
## 81 0.00079999
                     88
                          0.16933 0.37614 0.016377
## 82 0.00077675
                     89
                         0.16853 0.37659 0.016384
## 83 0.00076692
                     90
                         0.16775 0.37645 0.016385
## 84 0.00075579
                     91
                          0.16698 0.37653 0.016389
## 85
     0.00074858
                     92
                          0.16623 0.37532 0.016196
      0.00070380
                     94
                          0.16473 0.37485 0.016141
## 86
## 87
      0.00069992
                     95
                         0.16403 0.37471 0.016189
## 88
      0.00069223
                     96
                          0.16333 0.37467 0.016190
     0.00068902
                     97
                         0.16264 0.37435 0.016191
## 89
## 90
     0.00068832
                     98
                         0.16195 0.37435 0.016191
## 91 0.00066915
                    99
                         0.16126 0.37481 0.016188
## 92 0.00066580
                  100
                         0.16059 0.37511 0.016189
## 93 0.00063716
                   103
                          0.15859 0.37537 0.016187
## 94
     0.00063355
                   104
                         0.15795 0.37582 0.016187
      0.00061813
                    105
                          0.15732 0.37580 0.016186
## 95
## 96 0.00061596
                    107
                          0.15609 0.37610 0.016189
## 97
      0.00061410
                    108
                          0.15547 0.37672 0.016200
## 98 0.00060509
                  109
                         0.15486 0.37629 0.016183
## 99 0.00059366
                    110
                         0.15425 0.37641 0.016191
## 100 0.00057957
                    111
                         0.15366 0.37546 0.016174
## 101 0.00057526
                   112
                         0.15308 0.37577 0.016175
## 102 0.00055524
                    114
                          0.15193 0.37570 0.016163
## 103 0.00055083
                    115
                          0.15137 0.37681 0.016163
## 104 0.00054831
                          0.15082 0.37681 0.016176
                    116
## 105 0.00054719
                   117
                         0.15027 0.37787 0.016204
## 106 0.00049059
                    118
                          0.14972 0.37830 0.016209
## 107 0.00048324
                    119
                         0.14923 0.37958 0.016219
## 108 0.00048039
                    120
                         0.14875 0.37966 0.016232
                    121
                          0.14827 0.37941 0.016222
## 109 0.00046824
## 110 0.00046728
                    122
                          0.14780 0.37890 0.016205
```

```
## 111 0.00046207
                123
                       0.14733 0.37944 0.016215
## 112 0.00044998 124 0.14687 0.38030 0.016223
                125 0.14642 0.38083 0.016200
## 113 0.00043664
## 114 0.00043135 126 0.14599 0.38023 0.016189
## 115 0.00042858   127   0.14555 0.38059 0.016189
## 116 0.00041923   128   0.14513 0.38118 0.016187
## 117 0.00041219 129 0.14471 0.38148 0.016204
                130 0.14429 0.38160 0.016206
## 118 0.00040882
## 119 0.00040711 131 0.14389 0.38111 0.016204
                132
## 120 0.00040614
                       0.14348 0.38096 0.016204
## 121 0.00039895
                133 0.14307 0.38127 0.016218
## 122 0.00038747
                134
                       0.14267 0.38171 0.016204
## 123 0.00038480
                135 0.14229 0.38204 0.016211
                136 0.14190 0.38195 0.016212
## 124 0.00038424
## 125 0.00037809
                137 0.14152 0.38171 0.016210
## 126 0.00037584 138 0.14114 0.38200 0.016212
                140 0.14039 0.38254 0.016246
## 127 0.00036870
## 128 0.00034819
                141 0.14002 0.38310 0.016276
## 129 0.00034302
                142
                       0.13967 0.38367 0.016279
## 130 0.00033810 143 0.13933 0.38394 0.016283
## 131 0.00033694
                144 0.13899 0.38396 0.016283
## 132 0.00033661
                 145 0.13865 0.38393 0.016284
## 133 0.00033647
                146 0.13832 0.38393 0.016284
## 134 0.00032613
                147 0.13798 0.38402 0.016283
149
## 136 0.00031893
                       0.13733 0.38459 0.016274
## 137 0.00031861 150 0.13702 0.38459 0.016274
                151
## 138 0.00031509
                       0.13670 0.38476 0.016277
## 139 0.00031365
                152 0.13638 0.38492 0.016277
                153
## 140 0.00031258
                       0.13607 0.38477 0.016277
## 141 0.00030788
                154 0.13576 0.38479 0.016277
## 142 0.00029802 155 0.13545 0.38523 0.016274
## 143 0.00029594
                156 0.13515 0.38566 0.016274
## 144 0.00027781 158 0.13456 0.38604 0.016263
                159 0.13428 0.38569 0.016174
## 145 0.00027672
## 146 0.00027287
                160
                      0.13400 0.38549 0.016161
## 147 0.00027246
                       0.13373 0.38549 0.016161
                161
## 148 0.00027010 162 0.13346 0.38547 0.016161
                163 0.13319 0.38559 0.016151
## 149 0.00025144
## 150 0.00024464 164 0.13294 0.38657 0.016150
## 151 0.00024056 165 0.13269 0.38642 0.016150
                166 0.13245 0.38727 0.016161
## 152 0.00023660
## 153 0.00023198
                167 0.13221 0.38759 0.016156
## 154 0.00023124
                168
                       0.13198 0.38742 0.016156
## 155 0.00022249
                169 0.13175 0.38728 0.016155
                170
## 156 0.00021870
                       0.13153 0.38719 0.016158
## 157 0.00020670
                173 0.13087 0.38740 0.016158
                174 0.13067 0.38749 0.016161
## 158 0.00020481
## 159 0.00020284 175 0.13046 0.38745 0.016162
## 160 0.00020023
                176 0.13026 0.38756 0.016161
## 161 0.00020000
                  177
                        0.13006 0.38767 0.016161
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
```

```
method = "anova", control = rpart.control(cp = cps[j]))
##
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05 HC03_VC07
                                                   HC03_VC09
## [6] HC03_VC10 HC03_VC11 HC03_VC12 HC03_VC129 HC03_VC13.x
## [11] HC03_VC13.y HC03_VC130 HC03_VC132 HC03_VC133 HC03_VC134
## [16] HC03 VC15 HC03 VC156 HC03 VC17 HC03 VC18
                                                   HC03_VC75
## [21] HC03_VC76
                HC03_VC77
                             HC03_VC78
                                       HC03_VC79
                                                   HC03_VC80
## [26] HC03 VC81 HC03 VC82 HC03 VC83
                                       HC03_VC84
                                                   HC03 VC85
## [31] HC03_VC86 HC03_VC87 HC03_VC88
                                       HC03_VC89
                                                   HC03_VC90
## [36] HC03_VC91
                Latitude Longitude
                                       State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
             CP nsplit rel error xerror
                                           xstd
     ## 1
                     1
                       0.73106 0.73646 0.023571
## 2
     0.15300146
## 3
      0.04905506
                     2 0.57806 0.58767 0.021008
## 4
      0.03483358
                     3 0.52900 0.53770 0.019945
## 5
      0.02575390
                    4 0.49417 0.51441 0.019475
## 6
      0.02255952
                    5
                       0.46841 0.50731 0.019115
## 7
      0.02195363
                    6 0.44585 0.49091 0.017793
                    7
                       0.42390 0.49023 0.017805
## 8
      0.01812404
## 9
      0.01460201
                    8
                       0.40578 0.47412 0.017316
     0.01373019
                    9
                       0.39117 0.45665 0.017246
## 10
                       0.37744 0.45007 0.017105
## 11
     0.01318438
                   10
## 12 0.01113299
                   11
                       0.36426 0.44542 0.017206
## 13
     0.01044189
                    12
                        0.35313 0.44211 0.017433
                       0.34269 0.43582 0.017236
## 14 0.00876037
                   13
## 15
     0.00771485
                   14
                       0.33393 0.42560 0.017027
## 16 0.00737522
                   15 0.32621 0.42484 0.017021
                       0.31884 0.42004 0.016913
## 17
     0.00651898
                    16
## 18 0.00609098
                   17 0.31232 0.41644 0.016923
## 19 0.00582690
                   18
                       0.30623 0.40979 0.016929
## 20 0.00523612
                    19
                       0.30040 0.41367 0.017277
## 21
     0.00482466
                    20
                       0.29516 0.40742 0.017128
## 22
     0.00479629
                    21
                        0.29034 0.40728 0.017126
                       0.28554 0.40819 0.017127
## 23 0.00455377
                    22
## 24 0.00406023
                    23
                       0.28099 0.40427 0.017173
## 25 0.00390075
                   24 0.27693 0.40443 0.017546
                    25
## 26 0.00386309
                       0.27303 0.40309 0.017491
                       0.26916 0.40344 0.017505
## 27 0.00373690
                    26
## 28
     0.00323021
                    27
                       0.26543 0.39891 0.017132
                    28
## 29
     0.00287222
                       0.26220 0.39503 0.017073
## 30 0.00276227
                    29
                       0.25932 0.39864 0.017162
     0.00273625
                    30
                        0.25656 0.39972 0.017177
## 31
## 32 0.00269698
                   31
                       0.25383 0.39877 0.017150
## 33 0.00265792
                   32
                       0.25113 0.39715 0.017129
                       0.24847 0.39673 0.017129
## 34 0.00261475
                   33
## 35 0.00259402
                   34
                       0.24586 0.39583 0.017151
## 36 0.00242374
                    35 0.24326 0.39343 0.016660
## 37 0.00234022
                    36
                         0.24084 0.39186 0.016550
```

```
## 38
      0.00226835
                      37
                           0.23850 0.38945 0.016427
## 39
      0.00217154
                      39
                           0.23396 0.38989 0.016392
## 40
      0.00203158
                      40
                          0.23179 0.38776 0.016214
     0.00200903
                         0.22976 0.38472 0.015995
## 41
                      41
     0.00197756
                      43
                          0.22574 0.38393 0.015936
## 42
                          0.22376 0.38246 0.015927
## 43
      0.00192518
                      44
## 44 0.00180554
                      45
                          0.22184 0.38250 0.015869
## 45
      0.00174488
                      47
                           0.21823 0.37904 0.015735
## 46
      0.00171649
                      48
                          0.21648 0.38131 0.015852
## 47
       0.00171513
                      49
                           0.21476 0.38141 0.015851
## 48
      0.00163250
                      50
                          0.21305 0.38130 0.015938
## 49
      0.00160365
                      51
                          0.21142 0.38112 0.015947
                         0.20981 0.38255 0.015971
## 50
      0.00154749
                      52
## 51
     0.00145486
                      53
                          0.20827 0.38074 0.015888
## 52 0.00145420
                      54
                          0.20681 0.37962 0.015899
                          0.20536 0.37958 0.015898
## 53
      0.00142485
                      55
## 54
      0.00140643
                      56
                          0.20393 0.37940 0.015900
## 55
      0.00139441
                      58
                          0.20112 0.37929 0.015938
      0.00136615
                      59
                           0.19972 0.37840 0.015964
## 56
## 57
      0.00134432
                      62
                          0.19563 0.37781 0.015996
## 58
      0.00132904
                      63
                           0.19428 0.37819 0.015997
                         0.19295 0.37818 0.015997
## 59
      0.00132240
                      64
      0.00123928
                      65
                          0.19163 0.37661 0.015913
## 60
      0.00123217
                      66
                          0.19039 0.37581 0.015899
## 61
## 62 0.00116417
                      67
                          0.18916 0.37435 0.015840
## 63
      0.00115728
                      68
                          0.18799 0.37433 0.015873
      0.00111347
                      70
                          0.18568 0.37435 0.015764
## 64
                      71
                           0.18457 0.37177 0.015710
## 65
      0.00107149
## 66
      0.00106199
                      72
                          0.18350 0.37289 0.015735
## 67
      0.00099296
                      73
                          0.18243 0.37279 0.015575
                      74
      0.00097298
                         0.18144 0.36966 0.015452
## 68
      0.00096571
                      75
                          0.18047 0.36894 0.015427
## 69
## 70
     0.00094299
                      76
                          0.17950 0.36846 0.015410
                      77
## 71
      0.00092604
                          0.17856 0.36805 0.015408
## 72
      0.00086791
                      78
                           0.17763 0.36870 0.015422
## 73
      0.00086082
                      80
                           0.17590 0.36805 0.015413
## 74
      0.00083882
                      81
                           0.17504 0.36722 0.015396
## 75
      0.00082185
                      82
                          0.17420 0.36745 0.015430
## 76
      0.00081999
                      83
                           0.17338 0.36647 0.015439
## 77
      0.00081510
                           0.17256 0.36647 0.015439
                      84
      0.00080718
                          0.17174 0.36711 0.015476
## 78
                      85
## 79
      0.00080253
                           0.17093 0.36716 0.015476
                      86
## 80
      0.00080214
                      87
                           0.17013 0.36716 0.015476
## 81
      0.00079999
                      88
                           0.16933 0.36716 0.015476
## 82
      0.00077675
                      89
                           0.16853 0.36648 0.015443
                      90
## 83
      0.00076692
                           0.16775 0.36734 0.015447
## 84
      0.00075579
                      91
                           0.16698 0.36918 0.015506
      0.00074858
                      92
                          0.16623 0.37072 0.015521
## 85
      0.00070380
                      94
                          0.16473 0.36958 0.015473
## 86
## 87
      0.00069992
                      95
                           0.16403 0.37019 0.015443
      0.00069223
                           0.16333 0.37017 0.015458
## 88
                      96
## 89
      0.00068902
                      97
                          0.16264 0.36959 0.015421
## 90
       0.00068832
                      98
                           0.16195 0.36936 0.015422
       0.00066915
                      99
                           0.16126 0.36885 0.015420
## 91
```

```
## 92 0.00066580 100
                      0.16059 0.36835 0.015247
## 93 0.00063716 103 0.15859 0.36832 0.015248
## 94 0.00063355 104
                      0.15795 0.36842 0.015290
## 95 0.00061813
                105 0.15732 0.36812 0.015287
## 96 0.00061596
                107
                      0.15609 0.36869 0.015298
## 97 0.00061410 108 0.15547 0.36866 0.015298
                109
## 98 0.00060509
                      0.15486 0.36869 0.015298
## 99 0.00059366
                110 0.15425 0.36785 0.015273
## 100 0.00057957
                111 0.15366 0.36838 0.015316
                112 0.15308 0.36859 0.015463
## 101 0.00057526
## 102 0.00055524
                114 0.15193 0.36876 0.015461
                115
## 103 0.00055083
                      0.15137 0.36938 0.015466
## 104 0.00054831 116 0.15082 0.36927 0.015467
                117
## 105 0.00054719
                      0.15027 0.36927 0.015467
## 106 0.00049059
                118 0.14972 0.37019 0.015488
## 107 0.00048324 119 0.14923 0.37351 0.015566
## 108 0.00048039 120 0.14875 0.37411 0.015569
## 109 0.00046824
                121 0.14827 0.37527 0.015584
## 110 0.00046728
                122 0.14780 0.37483 0.015580
## 111 0.00046207 123 0.14733 0.37541 0.015610
                124
## 112 0.00044998
                      0.14687 0.37655 0.015620
## 113 0.00043664
                125 0.14642 0.37687 0.015617
## 114 0.00043135
                126
                      0.14599 0.37703 0.015641
## 115 0.00042858     127     0.14555 0.37702 0.015641
## 116 0.00041923
                128 0.14513 0.37695 0.015634
## 117 0.00041219   129   0.14471 0.37773 0.015637
## 118 0.00040882 130 0.14429 0.37776 0.015637
                131
## 119 0.00040711
                      0.14389 0.37792 0.015638
133
## 121 0.00039895
                      0.14307 0.37809 0.015652
## 122 0.00038747 134 0.14267 0.37830 0.015556
                135
## 123 0.00038480
                      0.14229 0.37873 0.015562
## 124 0.00038424
                136 0.14190 0.37864 0.015561
## 125 0.00037809 137
                      0.14152 0.37875 0.015563
                138 0.14114 0.37816 0.015563
## 126 0.00037584
141
## 128 0.00034819
                      0.14002 0.37805 0.015563
## 129 0.00034302 142 0.13967 0.37851 0.015659
## 130 0.00033810
                143
                      0.13933 0.37822 0.015648
## 131 0.00033694 144 0.13899 0.37818 0.015645
## 132 0.00033661
                145
                      0.13865 0.37816 0.015645
## 133 0.00033647 146 0.13832 0.37816 0.015645
## 134 0.00032613
                147
                      0.13798 0.37834 0.015639
## 135 0.00031906
                148 0.13765 0.37844 0.015638
## 136 0.00031893 149 0.13733 0.37829 0.015638
                150
## 137 0.00031861
                      0.13702 0.37829 0.015638
## 138 0.00031509
                151 0.13670 0.37829 0.015638
## 139 0.00031365
                152
                      0.13638 0.37905 0.015643
## 140 0.00031258 153 0.13607 0.37898 0.015643
                154 0.13576 0.37911 0.015643
## 141 0.00030788
## 142 0.00030000
                       0.13545 0.37880 0.015631
                  155
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
```

```
method = "anova", control = rpart.control(cp = cps[j]))
##
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05 HC03_VC07 HC03_VC09
## [6] HC03_VC10 HC03_VC11 HC03_VC12 HC03_VC129 HC03_VC13.x
## [11] HC03_VC13.y HC03_VC130 HC03_VC132 HC03_VC133 HC03_VC134
HC03_VC75
## [21] HC03_VC76
                HC03_VC79
                            HC03_VC80
                                      HC03_VC81
                                                  HC03_VC82
## [26] HC03 VC83
                HC03 VC84 HC03 VC85 HC03 VC86 HC03 VC87
## [31] HC03 VC88
                 HC03_VC89 HC03_VC90
                                      HC03_VC91
                                                  Latitude
## [36] Longitude
                 State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
             CP nsplit rel error xerror
## 1
    0.73106 0.73980 0.023892
## 2
      0.15300146
                    1
## 3
     0.04905506
                   2 0.57806 0.59109 0.021456
## 4
      0.03483358
                   3 0.52900 0.54339 0.020548
                   4 0.49417 0.52001 0.019567
## 5
     0.02575390
     0.02255952
                   5 0.46841 0.50708 0.019246
## 6
## 7
      0.02195363
                   6 0.44585 0.49595 0.018858
## 8
      0.01812404
                   7 0.42390 0.48499 0.018363
                   8
## 9
      0.01460201
                      0.40578 0.47541 0.018145
## 10
     0.01373019
                   9
                      0.39117 0.46087 0.018012
     0.01318438
                   10
                      0.37744 0.45836 0.018072
## 11
                      0.36426 0.45966 0.018439
## 12 0.01113299
                   11
                   12
## 13 0.01044189
                       0.35313 0.45659 0.018382
                  13 0.34269 0.44672 0.017959
## 14 0.00876037
## 15 0.00771485
                  14 0.33393 0.44149 0.017727
                      0.32621 0.43854 0.017694
## 16 0.00737522
                   15
                      0.31884 0.43065 0.017486
## 17
     0.00651898
                   16
## 18 0.00609098
                   17
                      0.31232 0.42930 0.017374
## 19 0.00582690
                   18
                      0.30623 0.42894 0.017453
## 20 0.00523612
                   19
                       0.30040 0.42519 0.017205
## 21 0.00482466
                  20 0.29516 0.42208 0.017448
## 22 0.00479629
                  21
                      0.29034 0.42208 0.017423
## 23 0.00455377
                   22 0.28554 0.42148 0.017218
## 24 0.00406023
                   23
                      0.28099 0.41791 0.017051
## 25 0.00390075
                   24 0.27693 0.41531 0.017085
                   25
                      0.27303 0.41387 0.017069
## 26 0.00386309
## 27 0.00373690
                   26
                       0.26916 0.41307 0.017026
## 28
     0.00323021
                   27
                      0.26543 0.40488 0.016657
                  28
                       0.26220 0.40023 0.016537
## 29
     0.00287222
## 30 0.00276227
                   29
                      0.25932 0.40002 0.016745
## 31 0.00273625
                   30
                       0.25656 0.40068 0.016779
                      0.25383 0.39987 0.016776
## 32 0.00269698
                  31
## 33 0.00265792
                  32 0.25113 0.39861 0.016710
## 34 0.00261475
                   33
                      0.24847 0.39750 0.016629
## 35 0.00259402
                   34
                      0.24586 0.39757 0.016639
## 36 0.00242374
                   35
                      0.24326 0.39911 0.016660
## 37 0.00234022
                   36
                        0.24084 0.39906 0.016641
```

```
## 38
      0.00226835
                      37
                           0.23850 0.39822 0.016668
## 39
      0.00217154
                      39
                           0.23396 0.39537 0.016438
## 40
      0.00203158
                      40
                           0.23179 0.39599 0.016448
      0.00200903
                           0.22976 0.39536 0.016518
## 41
                      41
## 42
      0.00197756
                      43
                           0.22574 0.39741 0.016542
      0.00192518
                      44
                          0.22376 0.39693 0.016486
## 43
## 44
      0.00180554
                      45
                           0.22184 0.39619 0.016509
      0.00174488
                      47
                          0.21823 0.39445 0.016470
## 45
      0.00171649
                      48
                          0.21648 0.39210 0.016501
## 46
## 47
      0.00171513
                      49
                          0.21476 0.39146 0.016481
## 48
      0.00163250
                      50
                          0.21305 0.39157 0.016483
## 49
      0.00160365
                      51
                           0.21142 0.39158 0.016488
                          0.20981 0.39137 0.016495
## 50
      0.00154749
                      52
## 51
      0.00145486
                      53
                          0.20827 0.38930 0.016424
     0.00145420
                          0.20681 0.38697 0.016400
## 52
                      54
## 53
      0.00142485
                      55
                          0.20536 0.38676 0.016366
## 54 0.00140643
                      56
                          0.20393 0.38836 0.016482
## 55 0.00139441
                      58
                          0.20112 0.38840 0.016491
## 56
      0.00136615
                      59
                          0.19972 0.38877 0.016493
## 57
      0.00134432
                      62
                          0.19563 0.38698 0.016566
## 58
      0.00132904
                      63
                           0.19428 0.38707 0.016564
## 59
      0.00132240
                      64
                          0.19295 0.38571 0.016541
## 60
      0.00123928
                      65
                          0.19163 0.38519 0.016537
                          0.19039 0.38450 0.016521
## 61
      0.00123217
                      66
## 62 0.00116417
                      67
                          0.18916 0.38225 0.016048
                          0.18799 0.38193 0.016030
## 63 0.00115728
                      68
      0.00111347
                      70
                          0.18568 0.38389 0.016083
## 64
                      71
## 65
      0.00107149
                           0.18457 0.38336 0.016082
      0.00106199
                      72
                          0.18350 0.38242 0.016025
## 66
      0.00099296
                      73
                           0.18243 0.38132 0.016048
## 67
## 68
      0.00097298
                      74
                          0.18144 0.38050 0.015933
## 69
      0.00096571
                      75
                           0.18047 0.38014 0.015936
## 70
      0.00094299
                      76
                          0.17950 0.37968 0.015914
                      77
## 71
      0.00092604
                          0.17856 0.38074 0.015982
                      78
                          0.17763 0.38089 0.015933
## 72
      0.00086791
## 73 0.00086082
                      80
                          0.17590 0.38061 0.015935
## 74
      0.00083882
                      81
                           0.17504 0.37969 0.015925
## 75
      0.00082185
                      82
                          0.17420 0.37975 0.015945
      0.00081999
                      83
                           0.17338 0.37883 0.015935
## 76
## 77
      0.00081510
                      84
                           0.17256 0.37887 0.015925
## 78
      0.00080718
                      85
                           0.17174 0.37873 0.015922
## 79
      0.00080253
                      86
                          0.17093 0.37865 0.015923
## 80
      0.00080214
                      87
                           0.17013 0.37907 0.015930
      0.00079999
                           0.16933 0.37907 0.015930
## 81
                      88
## 82
      0.00077675
                      89
                          0.16853 0.37937 0.015934
## 83
      0.00076692
                      90
                           0.16775 0.37773 0.015890
## 84
      0.00075579
                      91
                           0.16698 0.37758 0.015892
      0.00074858
                      92
                           0.16623 0.37763 0.015844
## 85
## 86
      0.00070380
                      94
                          0.16473 0.37688 0.015894
      0.00069992
                      95
                           0.16403 0.37823 0.015930
## 87
      0.00069223
## 88
                      96
                           0.16333 0.37863 0.015950
## 89
      0.00068902
                      97
                          0.16264 0.37857 0.015947
## 90
       0.00068832
                      98
                           0.16195 0.37870 0.015947
## 91
       0.00066915
                      99
                           0.16126 0.37863 0.016005
```

```
## 92 0.00066580
               100
                     0.16059 0.37868 0.015944
## 93 0.00063716 103 0.15859 0.37921 0.015964
## 94 0.00063355 104 0.15795 0.37897 0.015961
## 95 0.00061813 105 0.15732 0.37864 0.015951
## 96 0.00061596 107 0.15609 0.37803 0.015945
## 97 0.00061410 108 0.15547 0.37762 0.015946
## 98 0.00060509 109 0.15486 0.37812 0.015995
## 99 0.00059366
               110 0.15425 0.37875 0.016016
## 100 0.00057957 111 0.15366 0.38001 0.016037
               112 0.15308 0.37983 0.016036
## 101 0.00057526
## 102 0.00055524 114 0.15193 0.37992 0.016038
## 103 0.00055083
               115
                     0.15137 0.37970 0.016043
## 104 0.00054831 116 0.15082 0.37977 0.016045
## 105 0.00054719 117 0.15027 0.37991 0.016044
## 106 0.00049059
               118 0.14972 0.38077 0.016032
## 107 0.00048324 119 0.14923 0.37922 0.016024
## 108 0.00048039 120 0.14875 0.38015 0.016038
## 109 0.00046824
               121 0.14827 0.38045 0.016036
## 110 0.00046728
               122 0.14780 0.38066 0.016036
## 111 0.00046207 123 0.14733 0.38042 0.016031
               124 0.14687 0.38060 0.016038
## 112 0.00044998
## 115 0.00042858     127     0.14555 0.38048 0.016056
## 117 0.00041219   129   0.14471 0.38001 0.016060
## 118 0.00040882 130 0.14429 0.38042 0.016060
               131 0.14389 0.38031 0.016061
## 119 0.00040711
## 120 0.00040614 132 0.14348 0.38031 0.016061
## 121 0.00040000
               133 0.14307 0.38011 0.016061
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
    method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05 HC03_VC07
                                               HC03_VC09
## [6] HC03_VC10 HC03_VC11 HC03_VC12 HC03_VC129 HC03_VC13.y
## [11] HC03_VC130 HC03_VC132 HC03_VC133 HC03_VC134 HC03_VC15
## [16] HC03_VC156 HC03_VC17 HC03_VC18 HC03_VC75 HC03_VC76
## [21] HC03_VC79 HC03_VC82 HC03_VC83 HC03_VC84 HC03_VC85
## [26] HC03 VC86 HC03 VC87 HC03 VC89 HC03 VC90 HC03 VC91
## [31] Latitude Longitude State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
            CP nsplit rel error xerror
## 1
    0.15300146
## 2
                  1 0.73106 0.74471 0.024177
                  2 0.57806 0.59817 0.022035
## 3 0.04905506
## 4
    0.03483358
                  3 0.52900 0.55347 0.021163
## 5
      0.02575390
                  4 0.49417 0.53739 0.020497
```

```
## 6
       0.02255952
                     5
                          0.46841 0.52245 0.019968
## 7
      0.02195363
                         0.44585 0.51215 0.019193
                      7
## 8
       0.01812404
                         0.42390 0.50232 0.019626
       0.01460201
                         0.40578 0.48120 0.018655
## 9
                     8
## 10
      0.01373019
                     9
                          0.39117 0.46738 0.018491
## 11
      0.01318438
                         0.37744 0.46477 0.018467
                     1.0
## 12
     0.01113299
                     11
                          0.36426 0.45810 0.018225
## 13 0.01044189
                         0.35313 0.45648 0.018662
                     12
      0.00876037
                     13
                         0.34269 0.45102 0.018431
## 14
## 15
      0.00771485
                     14
                          0.33393 0.44553 0.018223
## 16
     0.00737522
                     15
                         0.32621 0.44112 0.018053
## 17
      0.00651898
                     16
                          0.31884 0.44046 0.018052
                     17
                         0.31232 0.43693 0.018007
## 18
      0.00609098
## 19
      0.00582690
                     18
                          0.30623 0.43398 0.017970
## 20
     0.00523612
                     19
                         0.30040 0.42767 0.017756
                         0.29516 0.42320 0.017691
## 21
      0.00482466
                     20
## 22 0.00479629
                     21
                         0.29034 0.42542 0.018165
## 23 0.00455377
                     22
                         0.28554 0.42530 0.018278
                          0.28099 0.42346 0.018193
## 24
      0.00406023
                     23
## 25
      0.00390075
                     24
                         0.27693 0.41815 0.018309
## 26
      0.00386309
                     25
                          0.27303 0.41544 0.018133
## 27
      0.00373690
                     26
                         0.26916 0.41564 0.018160
## 28
      0.00323021
                     27
                          0.26543 0.41017 0.017765
      0.00287222
                         0.26220 0.40285 0.017632
## 29
                     28
## 30
                     29
     0.00276227
                         0.25932 0.40291 0.017623
                         0.25656 0.40119 0.017580
## 31
     0.00273625
                     30
     0.00269698
                         0.25383 0.40509 0.017664
## 32
                     31
                         0.25113 0.40607 0.017714
## 33
      0.00265792
                     32
## 34
     0.00261475
                     33
                         0.24847 0.40566 0.017703
      0.00259402
                     34
                          0.24586 0.40633 0.017795
## 35
## 36
      0.00242374
                     35
                         0.24326 0.40284 0.017698
## 37
      0.00234022
                     36
                          0.24084 0.39962 0.017499
     0.00226835
                     37
                         0.23850 0.39969 0.017484
## 38
## 39
      0.00217154
                     39
                         0.23396 0.39973 0.017535
                         0.23179 0.39977 0.017730
## 40
      0.00203158
                     40
     0.00200903
                         0.22976 0.40165 0.017936
## 41
                     41
## 42
      0.00197756
                     43
                         0.22574 0.39967 0.017864
## 43
      0.00192518
                     44
                         0.22376 0.39591 0.017658
      0.00180554
                     45
                          0.22184 0.39574 0.017656
## 44
## 45
      0.00174488
                     47
                         0.21823 0.39433 0.017645
## 46
      0.00171649
                     48
                         0.21648 0.39450 0.017654
## 47
      0.00171513
                     49
                         0.21476 0.39511 0.017706
## 48
     0.00163250
                     50
                         0.21305 0.39686 0.017864
      0.00160365
                     51
                          0.21142 0.39667 0.017845
## 49
## 50
      0.00154749
                     52
                         0.20981 0.39575 0.017842
## 51
      0.00145486
                     53
                          0.20827 0.39602 0.017705
## 52
     0.00145420
                     54
                          0.20681 0.39728 0.017763
                          0.20536 0.39725 0.017773
## 53
      0.00142485
                     55
## 54
      0.00140643
                     56
                         0.20393 0.39803 0.017861
## 55
      0.00139441
                     58
                          0.20112 0.39777 0.017861
## 56 0.00136615
                     59
                         0.19972 0.39826 0.017895
## 57
      0.00134432
                     62
                         0.19563 0.39686 0.017877
## 58
      0.00132904
                     63
                         0.19428 0.39724 0.017879
                          0.19295 0.39686 0.017880
## 59
      0.00132240
                     64
```

```
## 60 0.00123928
                   65
                       0.19163 0.39762 0.017953
## 61
     0.00123217
                   66
                       0.19039 0.39781 0.017957
## 62 0.00116417
                  67
                       0.18916 0.39929 0.018061
## 63 0.00115728
                      0.18799 0.40038 0.018107
                   68
                       0.18568 0.39982 0.018115
## 64 0.00111347
                   70
## 65 0.00107149
                   71
                       0.18457 0.40152 0.018165
## 66 0.00106199
                   72 0.18350 0.40123 0.018132
                   73
                       0.18243 0.40071 0.018125
## 67 0.00099296
## 68 0.00097298
                   74
                       0.18144 0.39981 0.018078
## 69
     0.00096571
                   75
                       0.18047 0.39959 0.018080
                       0.17950 0.39942 0.018022
## 70 0.00094299
                   76
## 71 0.00092604
                   77
                       0.17856 0.39930 0.018022
## 72 0.00086791
                   78
                      0.17763 0.39867 0.018002
                       0.17590 0.39793 0.017982
## 73 0.00086082
                  80
## 74 0.00083882
                   81
                       0.17504 0.39704 0.017972
## 75 0.00082185
                  82
                       0.17420 0.39636 0.017954
## 76 0.00081999
                  83
                       0.17338 0.39633 0.017944
## 77 0.00081510
                   84
                       0.17256 0.39621 0.017944
     0.00080718
                   85
                       0.17174 0.39645 0.017926
## 78
## 79 0.00080253
                   86
                       0.17093 0.39622 0.017922
## 80 0.00080214
                  87
                       0.17013 0.39596 0.017922
## 81 0.00079999
                       0.16933 0.39603 0.017922
                  88
                  89
## 82 0.00077675
                       0.16853 0.39615 0.017919
## 83 0.00076692
                  90 0.16775 0.39681 0.017932
## 84 0.00075579
                  91
                      0.16698 0.39492 0.017810
## 85 0.00074858
                   92
                       0.16623 0.39438 0.017804
## 86
     0.00070380
                  94
                      0.16473 0.39464 0.017789
     0.00069992
                  95
                       0.16403 0.39574 0.017848
## 87
## 88 0.00069223
                  96
                      0.16333 0.39565 0.017847
## 89 0.00068902
                   97
                       0.16264 0.39645 0.017849
## 90 0.00068832
                  98 0.16195 0.39645 0.017849
## 91 0.00066915
                  99
                       0.16126 0.39752 0.017841
                 100
## 92 0.00066580
                      0.16059 0.39770 0.017851
## 93 0.00063716 103 0.15859 0.39786 0.017869
                104
## 94 0.00063355
                       0.15795 0.40026 0.017895
## 95 0.00061813
                105
                       0.15732 0.40030 0.017878
## 96 0.00061596
                107
                       0.15609 0.40010 0.017837
## 97 0.00061410 108 0.15547 0.40010 0.017834
                109
## 98 0.00060509
                      0.15486 0.40023 0.017838
## 99 0.00059366 110 0.15425 0.40011 0.017909
## 100 0.00057957 111 0.15366 0.40046 0.017909
## 102 0.00055524 114 0.15193 0.40051 0.017914
                115
## 103 0.00055083
                      0.15137 0.40082 0.017923
## 104 0.00054831 116 0.15082 0.40078 0.017923
                117
                       0.15027 0.40080 0.017923
## 105 0.00054719
## 106 0.00050000
                118 0.14972 0.40046 0.017892
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
      method = "anova", control = rpart.control(cp = cps[j]))
##
##
## Variables actually used in tree construction:
  [1] HC01 VC85.y HC03 VC04 HC03 VC05
                                      HC03_VC07
                                                  HC03 VC09
```

```
## [6] HC03_VC10 HC03_VC11
                             HC03_VC12
                                       HC03_VC129 HC03_VC13.y
## [11] HC03_VC130 HC03_VC132 HC03_VC133 HC03_VC134 HC03_VC15
## [16] HC03 VC156 HC03 VC17
                             HC03 VC18
                                       HC03 VC75
                                                   HC03 VC76
## [21] HC03_VC79 HC03_VC82 HC03_VC83 HC03_VC84 HC03_VC85
## [26] HC03 VC86
                  HC03 VC87 HC03 VC89
                                       HC03 VC90
                                                   HC03_VC91
## [31] Latitude Longitude State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
            CP nsplit rel error xerror
                                         xstd
## 1 0.26894188 0 1.00000 1.00047 0.031320
## 2 0.15300146
                   1 0.73106 0.74013 0.023771
                   2 0.57806 0.59665 0.021569
## 3 0.04905506
                   3 0.52900 0.55348 0.020697
## 4 0.03483358
                   4 0.49417 0.52405 0.020313
## 5 0.02575390
                  5 0.46841 0.51486 0.019362
## 6 0.02255952
                      0.44585 0.50738 0.019098
## 7 0.02195363
                   6
                   7 0.42390 0.49945 0.018709
## 8 0.01812404
## 9 0.01460201
                   8
                      0.40578 0.48887 0.018613
## 10 0.01373019
                   9
                      0.39117 0.46961 0.018232
## 11 0.01318438
                  10
                      0.37744 0.46865 0.018194
## 12 0.01113299
                  11 0.36426 0.45803 0.017965
                  12 0.35313 0.46251 0.018727
## 13 0.01044189
                  13 0.34269 0.44983 0.018298
## 14 0.00876037
## 15 0.00771485
                  14 0.33393 0.44494 0.017849
                  15 0.32621 0.43564 0.017258
## 16 0.00737522
## 17 0.00651898
                  16 0.31884 0.42600 0.016849
## 18 0.00609098
                  17
                      0.31232 0.42382 0.017003
                  18 0.30623 0.42050 0.016961
## 19 0.00582690
## 20 0.00523612
                  19
                      0.30040 0.41970 0.016912
## 21 0.00482466
                  20 0.29516 0.41688 0.016875
## 22 0.00479629
                  21 0.29034 0.41248 0.016885
                  22 0.28554 0.41247 0.016904
## 23 0.00455377
## 24 0.00406023
                  23 0.28099 0.41249 0.017295
## 25 0.00390075
                  24
                      0.27693 0.40967 0.017266
## 26 0.00386309
                  25 0.27303 0.40992 0.017289
## 27 0.00373690
                  26
                      0.26916 0.40910 0.017200
## 28 0.00323021
                  27
                      0.26543 0.40527 0.017192
## 29 0.00287222
                  28
                      0.26220 0.39842 0.016849
## 30 0.00276227
                  29 0.25932 0.39799 0.016730
## 31 0.00273625
                  30 0.25656 0.39782 0.016730
## 32 0.00269698
                  31
                      0.25383 0.39921 0.016756
## 33 0.00265792
                  32 0.25113 0.39844 0.016742
                  33 0.24847 0.39895 0.016761
## 34 0.00261475
## 35 0.00259402
                  34 0.24586 0.39830 0.016723
## 36 0.00242374
                  35
                      0.24326 0.39868 0.016718
## 37 0.00234022
                  36 0.24084 0.39910 0.016722
## 38 0.00226835
                  37
                      0.23850 0.39886 0.016721
                  39 0.23396 0.39758 0.016833
## 39 0.00217154
## 40 0.00203158
                  40 0.23179 0.39824 0.017126
## 41 0.00200903
                  41 0.22976 0.39626 0.016920
## 42 0.00197756
                   43 0.22574 0.39644 0.016996
```

```
## 43 0.00192518
                 44 0.22376 0.39632 0.017015
## 44 0.00180554
                 45 0.22184 0.39756 0.017079
## 45 0.00174488
                 47 0.21823 0.39760 0.017065
                 48 0.21648 0.39825 0.017088
## 46 0.00171649
## 47 0.00171513
                 49 0.21476 0.39788 0.017087
## 48 0.00163250
                 50 0.21305 0.39734 0.016994
## 49 0.00160365
                 51 0.21142 0.39752 0.017133
                  52 0.20981 0.39611 0.017128
## 50 0.00154749
## 51 0.00145486
                 53 0.20827 0.39399 0.017001
                 54 0.20681 0.39350 0.017032
## 52 0.00145420
## 53 0.00142485
                 55 0.20536 0.39297 0.017054
## 54 0.00140643
                 56 0.20393 0.39253 0.017043
## 55 0.00139441
                 58 0.20112 0.39270 0.017008
## 56 0.00136615
                 59 0.19972 0.39284 0.017006
## 57 0.00134432
                 62 0.19563 0.39354 0.017032
## 58 0.00132904
                 63 0.19428 0.39373 0.017037
## 59 0.00132240
                 64 0.19295 0.39398 0.017029
## 60 0.00123928
                 65 0.19163 0.39138 0.016974
                      0.19039 0.38979 0.017015
## 61 0.00123217
                 66
## 62 0.00116417
                 67 0.18916 0.39093 0.017014
## 63 0.00115728 68 0.18799 0.39083 0.017000
                  70 0.18568 0.39119 0.017003
## 64 0.00111347
## 65 0.00107149
                 71 0.18457 0.39112 0.017076
                 72 0.18350 0.39064 0.017099
## 66 0.00106199
## 67 0.00099296
                 73 0.18243 0.39098 0.017126
                 74 0.18144 0.39147 0.017090
## 68 0.00097298
## 69 0.00096571
                 75 0.18047 0.39161 0.017090
               76 0.17950 0.39171 0.017078
## 70 0.00094299
## 71 0.00092604
                  77 0.17856 0.39195 0.017094
## 72 0.00086791
                 78
                      0.17763 0.39282 0.017070
## 73 0.00086082
                 80 0.17590 0.39267 0.017008
## 74 0.00083882
                 81 0.17504 0.39232 0.016992
                 82 0.17420 0.39184 0.016976
## 75 0.00082185
## 76 0.00081999
                 83 0.17338 0.39192 0.016980
                 84
## 77 0.00081510
                      0.17256 0.39209 0.016981
## 78 0.00080718
                 85 0.17174 0.39180 0.016981
                 86
## 79 0.00080253
                      0.17093 0.39116 0.016979
## 80 0.00080214
                 87 0.17013 0.39100 0.016977
## 81 0.00079999 88 0.16933 0.39124 0.016993
## 82 0.00077675
                 89 0.16853 0.39105 0.016991
## 83 0.00076692
                 90 0.16775 0.39027 0.016986
## 84 0.00075579
                 91 0.16698 0.39057 0.016981
                 92 0.16623 0.39074 0.017005
## 85 0.00074858
                      0.16473 0.39101 0.017032
## 86 0.00070380
                  94
## 87 0.00069992
                 95 0.16403 0.39300 0.017071
## 88 0.00069223 96
                      0.16333 0.39263 0.017068
## 89 0.00068902
                 97 0.16264 0.39304 0.017115
## 90 0.00068832
                      0.16195 0.39146 0.016902
                  98
## 91 0.00066915
                  99 0.16126 0.39170 0.016896
## 92 0.00066580   100   0.16059 0.39147 0.016900
                 103
                      0.15859 0.39135 0.016905
## 93 0.00063716
## 94 0.00063355
                 104 0.15795 0.39004 0.016892
## 95 0.00061813 105 0.15732 0.38989 0.016891
## 96 0.00061596
                 107
                      0.15609 0.39049 0.016899
```

```
## 97 0.00061410 108 0.15547 0.39066 0.016901
## 98 0.00060509 109 0.15486 0.39141 0.016936
## 99 0.00060000 110 0.15425 0.39181 0.016941
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
##
    method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05 HC03_VC07
                                                HC03_VC09
## [6] HC03_VC10 HC03_VC11 HC03_VC12 HC03_VC129 HC03_VC13.y
## [11] HC03_VC130 HC03_VC132 HC03_VC133 HC03_VC134 HC03_VC156
## [16] HC03_VC17 HC03_VC18 HC03_VC76 HC03_VC79 HC03_VC82
HC03_VC87
## [31] State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
           CP nsplit rel error xerror
## 1 0.26894188 0 1.00000 1.00064 0.031325
## 2 0.15300146
                 1 0.73106 0.73655 0.023601
                 2 0.57806 0.59150 0.020925
## 3 0.04905506
                  3 0.52900 0.54281 0.019910
## 4 0.03483358
## 5 0.02575390
                 4 0.49417 0.53638 0.020117
                 5 0.46841 0.51865 0.019716
## 6 0.02255952
## 7 0.02195363
                 6 0.44585 0.50125 0.019247
## 8 0.01812404
                  7
                     0.42390 0.50099 0.019246
                 8 0.40578 0.47829 0.017816
## 9 0.01460201
## 10 0.01373019
                 9 0.39117 0.46712 0.017787
## 11 0.01318438
                 10 0.37744 0.46386 0.017784
## 12 0.01113299
                 11 0.36426 0.45116 0.017541
## 13 0.01044189
                12 0.35313 0.43514 0.016980
## 14 0.00876037
                13 0.34269 0.43011 0.016827
## 15 0.00771485
                 14
                     0.33393 0.41994 0.016148
## 16 0.00737522
                15 0.32621 0.41875 0.016145
## 17 0.00651898
                16 0.31884 0.41454 0.016195
                17 0.31232 0.41463 0.016275
## 18 0.00609098
                18 0.30623 0.41215 0.016283
## 19 0.00582690
## 20 0.00523612
                19 0.30040 0.41206 0.016301
                20 0.29516 0.40275 0.015851
## 21 0.00482466
## 22 0.00479629
                 21 0.29034 0.40041 0.015860
## 23 0.00455377
                 22 0.28554 0.39867 0.015808
                23 0.28099 0.39651 0.015952
## 24 0.00406023
## 25 0.00390075
                 24 0.27693 0.39687 0.015969
## 26 0.00386309
                 25
                     0.27303 0.39347 0.015355
## 27 0.00373690
                26 0.26916 0.38738 0.015234
## 28 0.00323021
                27 0.26543 0.38517 0.015090
                 28 0.26220 0.37835 0.014959
## 29 0.00287222
## 30 0.00276227
                 29 0.25932 0.38077 0.015346
                30 0.25656 0.38020 0.015350
## 31 0.00273625
## 32 0.00269698
                 31 0.25383 0.38200 0.015390
```

```
## 33 0.00265792
                  32 0.25113 0.38158 0.015381
## 34 0.00261475
                  33 0.24847 0.38158 0.015391
## 35 0.00259402
                  34 0.24586 0.37999 0.015343
## 36 0.00242374
                  35 0.24326 0.37913 0.015449
                  36 0.24084 0.37843 0.015447
## 37 0.00234022
## 38 0.00226835 37 0.23850 0.37805 0.015450
## 39 0.00217154 39 0.23396 0.37808 0.015462
                  40 0.23179 0.37788 0.015590
## 40 0.00203158
## 41 0.00200903
                  41 0.22976 0.37617 0.015570
## 42 0.00197756 43 0.22574 0.37638 0.015607
## 43 0.00192518
                  44 0.22376 0.37388 0.015477
## 44 0.00180554
                  45 0.22184 0.37546 0.015513
## 45 0.00174488
                  47 0.21823 0.37486 0.015494
                 48 0.21648 0.37355 0.015485
## 46 0.00171649
## 47 0.00171513
                  49 0.21476 0.37252 0.015465
## 48 0.00163250
                  50 0.21305 0.37293 0.015563
## 49 0.00160365 51 0.21142 0.36837 0.014834
## 50 0.00154749
                  52 0.20981 0.36801 0.014812
                  53
                       0.20827 0.36542 0.014696
## 51 0.00145486
## 52 0.00145420
                  54 0.20681 0.36515 0.014666
## 53 0.00142485 55 0.20536 0.36553 0.014679
                  56 0.20393 0.36393 0.014606
## 54 0.00140643
## 55 0.00139441
                  58 0.20112 0.36347 0.014605
## 56 0.00136615 59 0.19972 0.36277 0.014626
## 57 0.00134432
                  62 0.19563 0.36227 0.014626
                  63 0.19428 0.36286 0.014644
## 58 0.00132904
## 59 0.00132240
                  64 0.19295 0.36251 0.014573
## 60 0.00123928 65 0.19163 0.36086 0.014444
## 61 0.00123217
                  66 0.19039 0.35771 0.014364
                  67 0.18916 0.35646 0.014366
## 62 0.00116417
## 63 0.00115728 68 0.18799 0.35542 0.014336
## 64 0.00111347 70 0.18568 0.35600 0.014390
                  71 0.18457 0.35394 0.014319
## 65 0.00107149
                  72 0.18350 0.35420 0.014319
## 66 0.00106199
## 67 0.00099296 73 0.18243 0.35554 0.014367
## 68 0.00097298
                  74 0.18144 0.35523 0.014382
                  75
                      0.18047 0.35512 0.014382
## 69 0.00096571
## 70 0.00094299
                  76 0.17950 0.35500 0.014394
## 71 0.00092604
                  77 0.17856 0.35488 0.014404
## 72 0.00086791
                  78 0.17763 0.35459 0.014378
## 73 0.00086082
                  80 0.17590 0.35391 0.014407
## 74 0.00083882
                  81 0.17504 0.35327 0.014361
## 75 0.00082185
                  82 0.17420 0.35324 0.014444
## 76 0.00081999
                  83
                       0.17338 0.35308 0.014445
## 77 0.00081510
                  84 0.17256 0.35324 0.014441
                85
## 78 0.00080718
                       0.17174 0.35424 0.014482
## 79 0.00080253
                  86 0.17093 0.35433 0.014487
## 80 0.00080214
                  87
                       0.17013 0.35389 0.014462
## 81 0.00079999
                  88 0.16933 0.35349 0.014447
## 82 0.00077675
                  89 0.16853 0.35294 0.014440
                  90 0.16775 0.35440 0.014533
## 83 0.00076692
## 84 0.00075579
                  91 0.16698 0.35437 0.014539
## 85 0.00074858
                  92 0.16623 0.35446 0.014543
## 86 0.00070380
                  94 0.16473 0.35518 0.014558
```

```
## 87 0.00070000 95 0.16403 0.35524 0.014553
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
##
     method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05
                                     HC03_VC07 HC03_VC10
## [6] HC03 VC11 HC03 VC12 HC03 VC129 HC03 VC13.y HC03 VC130
## [11] HC03_VC133 HC03_VC134 HC03_VC156 HC03_VC17 HC03_VC18
## [26] Latitude Longitude State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
           CP nsplit rel error xerror
## 1 0.26894188 0 1.00000 1.00069 0.031342
## 2 0.15300146
                  1 0.73106 0.74520 0.024259
## 3 0.04905506
                  2 0.57806 0.59680 0.022070
## 4 0.03483358
                  3 0.52900 0.54997 0.021172
## 5 0.02575390
                 4 0.49417 0.53233 0.020738
                 5 0.46841 0.51746 0.019652
## 6 0.02255952
                 6 0.44585 0.50673 0.019104
## 7 0.02195363
## 8 0.01812404
                  7 0.42390 0.49817 0.018487
                 8 0.40578 0.49166 0.018312
## 9 0.01460201
## 10 0.01373019
                 9 0.39117 0.47992 0.018319
## 11 0.01318438
                 10
                     0.37744 0.46696 0.018013
                11 0.36426 0.45942 0.018058
## 12 0.01113299
## 13 0.01044189
                12 0.35313 0.44518 0.018120
## 14 0.00876037
                 13 0.34269 0.43926 0.017916
## 15 0.00771485
                14 0.33393 0.43474 0.017703
## 16 0.00737522
                15 0.32621 0.43186 0.017597
## 17 0.00651898
                16 0.31884 0.42905 0.017726
## 18 0.00609098
                 17 0.31232 0.42659 0.017760
## 19 0.00582690
                18 0.30623 0.42527 0.017781
## 20 0.00523612
                19 0.30040 0.41941 0.017763
## 21 0.00482466
                 20 0.29516 0.41733 0.017481
## 22 0.00479629
                 21
                     0.29034 0.41496 0.017415
## 23 0.00455377
                22 0.28554 0.41342 0.017322
## 24 0.00406023
                23 0.28099 0.40965 0.016860
                 24 0.27693 0.40755 0.016925
## 25 0.00390075
## 26 0.00386309
                25 0.27303 0.40415 0.016249
                26 0.26916 0.40185 0.016141
## 27 0.00373690
## 28 0.00323021
                 27 0.26543 0.40039 0.016142
## 29 0.00287222
                     0.26220 0.40222 0.016234
                 28
## 30 0.00276227
                 29 0.25932 0.40408 0.016271
## 31 0.00273625
                30 0.25656 0.40312 0.016057
                 31 0.25383 0.40185 0.016009
## 32 0.00269698
## 33 0.00265792
                32 0.25113 0.40301 0.016015
                33 0.24847 0.40242 0.016005
## 34 0.00261475
## 35 0.00259402
                 34 0.24586 0.40339 0.016049
```

```
## 36 0.00242374
                  35 0.24326 0.40262 0.016030
## 37 0.00234022
                  36 0.24084 0.40037 0.016073
## 38 0.00226835
                 37 0.23850 0.39812 0.016042
## 39 0.00217154
                  39 0.23396 0.39751 0.016083
## 40 0.00203158
                 40 0.23179 0.39745 0.016188
## 41 0.00200903
                 41 0.22976 0.39378 0.015957
## 42 0.00197756
                 43 0.22574 0.39144 0.015876
                  44
                      0.22376 0.39222 0.016035
## 43 0.00192518
## 44 0.00180554
                 45 0.22184 0.38858 0.015680
                 47 0.21823 0.39021 0.015813
## 45 0.00174488
                  48 0.21648 0.38979 0.015808
## 46 0.00171649
## 47 0.00171513
                  49
                      0.21476 0.38996 0.015821
## 48 0.00163250
                 50 0.21305 0.38989 0.015797
## 49 0.00160365
                 51 0.21142 0.39023 0.015849
## 50 0.00154749
                  52 0.20981 0.38843 0.015776
                 53 0.20827 0.38978 0.015789
## 51 0.00145486
## 52 0.00145420
                 54 0.20681 0.38791 0.015747
## 53 0.00142485
                 55 0.20536 0.38847 0.015760
                  56
                      0.20393 0.38713 0.015744
## 54 0.00140643
## 55 0.00139441
                 58 0.20112 0.38878 0.015793
## 56 0.00136615
                 59 0.19972 0.38831 0.015800
                  62 0.19563 0.38853 0.015798
## 57 0.00134432
## 58 0.00132904
                 63 0.19428 0.38819 0.015794
## 59 0.00132240
                 64 0.19295 0.38826 0.015793
## 60 0.00123928
                 65 0.19163 0.38879 0.015870
                      0.19039 0.38655 0.015883
## 61 0.00123217
                  66
## 62 0.00116417
                 67 0.18916 0.38758 0.015918
## 63 0.00115728
                 68
                      0.18799 0.38729 0.015902
## 64 0.00111347
                  70 0.18568 0.38667 0.015869
## 65 0.00107149
                  71 0.18457 0.38625 0.015867
                 72 0.18350 0.38530 0.015865
## 66 0.00106199
## 67 0.00099296
                 73 0.18243 0.38403 0.015815
                  74 0.18144 0.38438 0.015825
## 68 0.00097298
                  75 0.18047 0.38550 0.015859
## 69 0.00096571
                 76 0.17950 0.38525 0.015861
## 70 0.00094299
## 71 0.00092604
                  77 0.17856 0.38417 0.015833
## 72 0.00086791
                  78
                      0.17763 0.38617 0.015891
## 73 0.00086082
                 80 0.17590 0.38563 0.015861
                 81 0.17504 0.38502 0.015861
## 74 0.00083882
## 75 0.00082185
                  82 0.17420 0.38460 0.015855
## 76 0.00081999
                 83 0.17338 0.38535 0.015855
## 77 0.00081510
                 84 0.17256 0.38535 0.015855
## 78 0.00080718
                 85 0.17174 0.38569 0.015856
## 79 0.00080253
                  86
                      0.17093 0.38531 0.015831
## 80 0.00080214
                  87 0.17013 0.38565 0.015837
## 81 0.00080000
                      0.16933 0.38555 0.015841
                  88
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
##
      method = "anova", control = rpart.control(cp = cps[j]))
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05
                                       HC03 VC07
                                                   HC03_VC10
## [6] HC03 VC11
                 HC03_VC12 HC03_VC13.y HC03_VC130 HC03_VC133
```

```
## [11] HC03_VC134 HC03_VC156 HC03_VC17
                                      HC03_VC18 HC03_VC79
## [21] HC03 VC89
                 HC03 VC90 HC03 VC91
                                      Latitude
                                                  Longitude
## [26] State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
            CP nsplit rel error xerror
## 1 0.26894188 0 1.00000 1.00154 0.031375
## 2 0.15300146
                     0.73106 0.74193 0.024006
                  2 0.57806 0.60040 0.021839
## 3 0.04905506
## 4 0.03483358
                  3 0.52900 0.54919 0.020811
## 5 0.02575390
                  4 0.49417 0.52523 0.019844
                  5 0.46841 0.50853 0.019085
## 6 0.02255952
                  6 0.44585 0.49695 0.018337
## 7 0.02195363
                  7 0.42390 0.48408 0.017791
## 8 0.01812404
                      0.40578 0.47081 0.017293
## 9 0.01460201
                  8
## 10 0.01373019
                  9 0.39117 0.45858 0.017087
                 10
## 11 0.01318438
                      0.37744 0.45375 0.017034
## 12 0.01113299
                 11 0.36426 0.43844 0.016856
## 13 0.01044189
                 12
                      0.35313 0.43220 0.016854
## 14 0.00876037
                 13 0.34269 0.42338 0.016625
                 14 0.33393 0.40997 0.015717
## 15 0.00771485
## 16 0.00737522
                 15 0.32621 0.40938 0.015710
## 17 0.00651898
                 16 0.31884 0.40591 0.015716
                 17 0.31232 0.39755 0.015128
## 18 0.00609098
## 19 0.00582690
                 18 0.30623 0.39372 0.015127
## 20 0.00523612
                 19
                      0.30040 0.39383 0.015146
                 20 0.29516 0.39214 0.015549
## 21 0.00482466
## 22 0.00479629
                 21
                     0.29034 0.38968 0.015459
## 23 0.00455377
                 22 0.28554 0.38978 0.015523
## 24 0.00406023
                 23 0.28099 0.38136 0.015446
## 25 0.00390075
                 24 0.27693 0.37640 0.015343
## 26 0.00386309
                 25 0.27303 0.37738 0.015384
## 27 0.00373690
                 26
                      0.26916 0.37563 0.015264
## 28 0.00323021
                 27 0.26543 0.37798 0.015334
## 29 0.00287222
                 28
                      0.26220 0.37637 0.015318
## 30 0.00276227
                 29 0.25932 0.37129 0.014928
                 30
## 31 0.00273625
                      0.25656 0.37000 0.015139
## 32 0.00269698
                 31 0.25383 0.37002 0.015194
## 33 0.00265792
                 32 0.25113 0.37031 0.015215
                 33 0.24847 0.37041 0.015214
## 34 0.00261475
## 35 0.00259402
                 34 0.24586 0.37255 0.015257
                 35 0.24326 0.36919 0.015186
## 36 0.00242374
## 37 0.00234022
                 36 0.24084 0.36562 0.015092
## 38 0.00226835
                 37
                      0.23850 0.36872 0.015219
## 39 0.00217154
                 39 0.23396 0.36698 0.015176
## 40 0.00203158
                 40 0.23179 0.36836 0.015277
## 41 0.00200903
                 41 0.22976 0.37012 0.015306
## 42 0.00197756
                 43 0.22574 0.36879 0.015283
                 44 0.22376 0.36848 0.015262
## 43 0.00192518
## 44 0.00180554
                  45 0.22184 0.36692 0.015273
```

```
## 45 0.00174488
                 47 0.21823 0.36560 0.015152
## 46 0.00171649
                 48 0.21648 0.36524 0.015004
## 47 0.00171513
                 49 0.21476 0.36565 0.015005
## 48 0.00163250
                 50 0.21305 0.36711 0.015028
## 49 0.00160365
                 51 0.21142 0.36630 0.015027
## 50 0.00154749
                 52 0.20981 0.36669 0.015057
                 53 0.20827 0.36473 0.015007
## 51 0.00145486
                 54
                     0.20681 0.36607 0.015037
## 52 0.00145420
## 53 0.00142485
                 55 0.20536 0.36517 0.015017
                 56 0.20393 0.36588 0.015101
## 54 0.00140643
                 58 0.20112 0.36597 0.015103
## 55 0.00139441
## 56 0.00136615
                 59
                     0.19972 0.36578 0.015101
## 57 0.00134432
                 62 0.19563 0.36615 0.015117
## 58 0.00132904
                 63 0.19428 0.36606 0.015112
                 64 0.19295 0.36608 0.015129
## 59 0.00132240
## 60 0.00123928
                 65 0.19163 0.36528 0.015209
## 61 0.00123217
                 66 0.19039 0.36369 0.015246
## 62 0.00116417
                 67 0.18916 0.36574 0.015433
## 63 0.00115728
                      0.18799 0.36582 0.015474
                 68
## 64 0.00111347
                 70 0.18568 0.36530 0.015459
                71 0.18457 0.36557 0.015480
## 65 0.00107149
## 66 0.00106199
                 72 0.18350 0.36576 0.015503
## 67 0.00099296
                 73 0.18243 0.36563 0.015522
                 74 0.18144 0.36382 0.015525
## 68 0.00097298
## 69 0.00096571
                 75 0.18047 0.36360 0.015532
                 76 0.17950 0.36442 0.015583
## 70 0.00094299
## 71 0.00092604
                 77 0.17856 0.36396 0.015583
## 72 0.00090000 78 0.17763 0.36409 0.015564
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[buildfold, -(3)],
     method = "anova", control = rpart.control(cp = cps[j]))
##
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC05 HC03_VC07 HC03_VC10
                                                  HC03_VC11
## [6] HC03 VC12 HC03 VC13.y HC03 VC130 HC03 VC133 HC03 VC134
## [11] HC03_VC156 HC03_VC17 HC03_VC18
                                     HC03_VC79
                                                  HC03_VC82
## [21] HC03_VC90 HC03_VC91 Latitude Longitude
                                                  State
##
## Root node error: 67.293/2547 = 0.02642
##
## n= 2547
##
##
           CP nsplit rel error xerror
## 1 0.2689419 0 1.00000 1.00064 0.031322
## 2 0.1530015
                 1 0.73106 0.73863 0.023592
## 3 0.0490551
                 2 0.57806 0.58950 0.020964
## 4 0.0348336
                 3 0.52900 0.54224 0.020035
                 4 0.49417 0.51936 0.019720
## 5 0.0257539
## 6 0.0225595
                 5 0.46841 0.51707 0.019653
## 7 0.0219536
## 8 0.0181240
                 6 0.44585 0.50743 0.019300
                 7 0.42390 0.49991 0.019205
## 9 0.0146020
                 8 0.40578 0.47303 0.018059
```

```
## 10 0.0137302
                       9 0.39117 0.46348 0.017931
## 11 0.0131844 10 0.37744 0.45089 0.017739
## 12 0.0111330 11 0.36426 0.44466 0.017458
## 13 0.0104419
                      12 0.35313 0.44596 0.018508
## 14 0.0087604 13 0.34269 0.43305 0.018025
## 15 0.0077149 14 0.33393 0.42625 0.017800
## 16 0.0073752 15 0.32621 0.42354 0.017647
## 17 0.0065190
                      16 0.31884 0.41906 0.017394
## 18 0.0060910 17 0.31232 0.41402 0.017202
## 19 0.0058269 18 0.30623 0.41519 0.017600
## 20 0.0052361 19 0.30040 0.40711 0.017151
## 21 0.0048247
                      20 0.29516 0.39833 0.016984
## 22 0.0047963 21 0.29034 0.39845 0.016968
## 23 0.0045538 22 0.28554 0.40120 0.017034
## 24 0.0040602
                      23 0.28099 0.40489 0.017190
## 25 0.0039007 24 0.27693 0.40299 0.017150
## 26 0.0038631 25 0.27303 0.40329 0.017153
## 27 0.0037369 26 0.26916 0.40324 0.017165
## 28 0.0032302
                      27 0.26543 0.39544 0.016663
## 29 0.0028722 28 0.26220 0.39411 0.016679
## 30 0.0027623 29 0.25932 0.39026 0.016677
## 31 0.0027362
                      30 0.25656 0.39184 0.016750
## 32 0.0026970
                      31 0.25383 0.39184 0.016750
## 33 0.0026579 32 0.25113 0.38949 0.016636
## 34 0.0026147 33 0.24847 0.39036 0.016674
                      34 0.24586 0.39115 0.016634
## 35 0.0025940
## 36 0.0024237 35 0.24326 0.39163 0.016642
## 37 0.0023402 36 0.24084 0.38540 0.016184
## 38 0.0022683 37 0.23850 0.38439 0.016180
## 39 0.0021715
                      39 0.23396 0.38440 0.016174
## 40 0.0020316 40 0.23179 0.38257 0.016150
## 41 0.0020090 41 0.22976 0.38144 0.016116
## 42 0.0019776
                      43 0.22574 0.38044 0.016109
## 43 0.0019252 44 0.22376 0.38073 0.016112
## 44 0.0018055 45 0.22184 0.38247 0.016279
## 45 0.0017449 47 0.21823 0.38144 0.016274
## 46 0.0017165 48 0.21648 0.38122 0.016274
## 47 0.0017151 49 0.21476 0.38152 0.016301
## 48 0.0016325 50 0.21305 0.38260 0.016358
## 49 0.0016037
                      51 0.21142 0.38293 0.016395
## 50 0.0015475
                      52 0.20981 0.37954 0.015717
## 51 0.0014549 53 0.20827 0.37950 0.015705
## 52 0.0014542 54 0.20681 0.38034 0.015640
## 53 0.0014249
                      55 0.20536 0.38077 0.015664
## 54 0.0014064 56 0.20393 0.38094 0.015666
## 55 0.0013944 58 0.20112 0.38098 0.015661
## 56 0.0013662
                      59 0.19972 0.38007 0.015639
## 57 0.0013443 62 0.19563 0.37934 0.015632
## 58 0.0013290 63 0.19428 0.37934 0.015632
## 59 0.0013224 64 0.19295 0.37959 0.015661
                      65 0.19163 0.37752 0.015883
## 60 0.0012393
## 61 0.0012322 66 0.19039 0.37645 0.015845
## 62 0.0011642 67 0.18916 0.37770 0.015933
## 63 0.0011573
                      68 0.18799 0.37729 0.015928
```

```
## 64 0.0011135 70 0.18568 0.37734 0.015937

## 65 0.0010715 71 0.18457 0.37756 0.016005

## 66 0.0010620 72 0.18350 0.37587 0.016010

## 67 0.0010000 73 0.18243 0.37560 0.016026
```

```
##
## Regression tree:
## rpart(formula = repvotes ~ ., data = buildset[, -3], method = "anova",
    control = rpart.control(cp = 8e-04))
##
##
## Variables actually used in tree construction:
## [1] HC01_VC85.y HC03_VC04 HC03_VC05
                                     HC03_VC07 HC03_VC10
## [6] HC03 VC11 HC03 VC12 HC03 VC129 HC03 VC13.y HC03 VC130
## [11] HC03_VC131 HC03_VC133 HC03_VC134 HC03_VC14 HC03_VC15
## [16] HC03_VC18 HC03_VC76 HC03_VC77 HC03_VC79 HC03_VC81
## [26] HC03_VC90 HC03_VC91 Latitude Longitude State
## Root node error: 75.157/2830 = 0.026557
##
## n= 2830
##
           CP nsplit rel error xerror
##
## 1 0.27103707 0 1.00000 1.00085 0.029715
## 2 0.15006942
                  1 0.72896 0.73571 0.022044
## 3 0.06140401
                  2 0.57889 0.59609 0.019936
## 4 0.03531472
                  3 0.51749 0.55164 0.019189
                  4 0.48217 0.52686 0.018826
## 5 0.03203458
## 6 0.02692045
                  5 0.45014 0.50838 0.018486
                     0.42322 0.47044 0.016550
## 7 0.01707621
                  6
## 8 0.01637915
                  7 0.40614 0.45766 0.015741
## 9 0.01455037
                  8
                     0.38976 0.44766 0.015553
## 10 0.01263077
                  9 0.37521 0.43359 0.015315
## 11 0.01174684
                 10 0.36258 0.42270 0.015032
                 11 0.35084 0.41280 0.014932
## 12 0.01123131
## 13 0.00775256
                 12 0.33961 0.40408 0.014654
## 14 0.00771592
                 13 0.33185 0.39684 0.014547
## 15 0.00745246
                 14 0.32414 0.39642 0.014654
```

```
## 16 0.00725216
                 15 0.31668 0.39542 0.014631
## 17 0.00461573
                 16 0.30943 0.38024 0.014560
                 18 0.30020 0.37771 0.014534
## 18 0.00456156
                 19 0.29564 0.37447 0.014402
## 19 0.00425267
                20 0.29139 0.37480 0.014399
## 20 0.00420336
## 21 0.00363156
                 21 0.28718 0.37612 0.014519
                      0.27992 0.37222 0.014227
## 22 0.00360496
                 23
## 23 0.00358421
                 24 0.27631 0.37157 0.014218
                 25 0.27273 0.37100 0.014216
## 24 0.00348820
## 25 0.00325680
                 26 0.26924 0.37027 0.014102
                 27 0.26599 0.36778 0.014044
## 26 0.00322808
               28 0.26276 0.36797 0.014074
## 27 0.00312031
## 28 0.00301376
                 29 0.25964 0.36651 0.013651
## 29 0.00290753
                 30
                      0.25662 0.36583 0.013621
## 30 0.00285765
                 31 0.25372 0.36519 0.013687
                32 0.25086 0.36584 0.013670
## 31 0.00275150
## 32 0.00259130
                 33 0.24811 0.36553 0.013638
                 34 0.24552 0.36417 0.013668
## 33 0.00245805
                 35 0.24306 0.36194 0.013607
## 34 0.00240691
## 35 0.00222514
                 36 0.24065 0.35827 0.013489
                  38 0.23620 0.35628 0.013439
## 36 0.00222113
## 37 0.00222038
                 39 0.23398 0.35627 0.013439
                 40 0.23176 0.35616 0.013446
## 38 0.00217296
## 39 0.00207740
                 41 0.22959 0.35633 0.013469
## 40 0.00204385
                 42
                      0.22751 0.35582 0.013468
## 41 0.00204384
                 43 0.22546 0.35684 0.013483
## 42 0.00201100
                 44 0.22342 0.35643 0.013503
## 43 0.00195237
                 45 0.22141 0.35406 0.013283
## 44 0.00194676
                 46 0.21946 0.35485 0.013398
## 45 0.00187613 47 0.21751 0.35412 0.013377
## 46 0.00183986
                 49 0.21376 0.35262 0.013201
## 47 0.00178331
                  50
                      0.21192 0.35182 0.013158
                 51 0.21014 0.35142 0.013252
## 48 0.00164002
                52 0.20850 0.35202 0.013315
## 49 0.00163768
## 50 0.00158772
                 53 0.20686 0.35220 0.013316
## 51 0.00154858
                 55 0.20368 0.35031 0.013218
## 52 0.00154194
                 56 0.20213 0.35118 0.013236
## 53 0.00153562
                 57 0.20059 0.35118 0.013236
                 58
                      0.19906 0.34832 0.013258
## 54 0.00127384
## 55 0.00122809
                 59 0.19778 0.35157 0.013500
               60
## 56 0.00122657
                      0.19655 0.35279 0.013577
                 61 0.19533 0.35279 0.013577
## 57 0.00122284
                 63
## 58 0.00120959
                      0.19288 0.35286 0.013577
## 59 0.00119443
                 64 0.19167 0.35350 0.013577
                 65 0.19048 0.35542 0.013614
## 60 0.00115202
                  66 0.18933 0.35655 0.013637
## 61 0.00114033
## 62 0.00113546
                 67 0.18819 0.35667 0.013688
                 68
                      0.18705 0.35704 0.013724
## 63 0.00112381
## 64 0.00109711
                 69 0.18593 0.35734 0.013727
## 65 0.00109699
                  70
                      0.18483 0.35661 0.013725
## 66 0.00109626
                 71 0.18373 0.35661 0.013725
                 72 0.18264 0.35594 0.013655
## 67 0.00102859
                  73 0.18161 0.35842 0.013901
## 68 0.00101004
                   74
## 69 0.00099825
                      0.18060 0.35848 0.013902
```

```
## 70 0.00095738
                     75
                          0.17960 0.35681 0.013865
## 71 0.00093630
                     76
                          0.17864 0.35700 0.013872
## 72 0.00090111
                     77
                          0.17771 0.35619 0.013850
## 73 0.00086940
                     78
                          0.17680 0.35345 0.013784
## 74 0.00085289
                     79
                          0.17593 0.35215 0.013744
                          0.17508 0.35225 0.013709
## 75 0.00084852
                     8.0
## 76 0.00083866
                     81
                          0.17423 0.35351 0.013717
## 77 0.00082664
                     82
                          0.17339 0.35330 0.013707
## 78 0.00080198
                     83
                          0.17257 0.35232 0.013688
## 79 0.00080000
                     84
                          0.17177 0.35260 0.013693
```

5. Predicting the change from 2012 to 2016 (Made by Judiel Salandanan and Rick Chen)

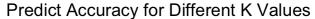
Method Use KNN method to predict 2016 election data from 2012 election data. First our team make a new dataframe "knnDF" by subsetting ""State", "County", "2016 Clinton Votes", "2016 Trump Votes", "2012 Democrat Votes", "2012 Republican Votes","Longitude","Latitude","HC01 VC90","HC01 VC08","HC01 VC83"" from our primary dataframe "bigDF". "HC01_VC90", "HC01_VC08", "HC01_VC83" each stands for number of bachelor degree voters, unemployed voters and rich voters. Later we organize our training set and test set. We make a training set dataframe called "trainingDF" by subseting longitude, latitude, employment, bachelor degree and wealth(rich) information of year 2012 from the "knnDF". In contrast, our testset is made with the exact same information of year 2016. Later on, we use knn function of knn package to execute prediction. The result we get from prediction is a categorical vector with "republican" or "democrat" Moreover. We run with multiple values of k and plot accuracy for plotting part 5. The way to test accuracy of different k value is to compare the accuracy percent. From the youtube video where we learned how to use knn, it suggested us to take the value of squareroot of number of rows of our dataframe as the value of K. However, when we arbitrary choose different K values, some K values actually predict better than the K value youtube suggested. Futhermore, the prediction percentage we saw might not as good as it looks. There is a problem in machine learning called overfitting. Our team believe there is a reason on all the sources that suggest us to use the value of squareroot of number of rows of our dataframe as the value of K. The K value might not looks as fancy as other overfitting K values, but at least it is more precise. For K is the value of squareroot of number of rows of our dataframe, which in our case is 56, we have our accuracy percentage 0.8397702.

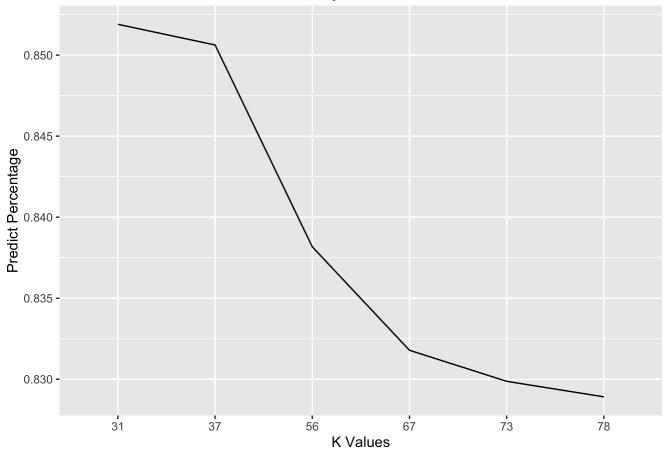
By comparing our to predictions, we have 0.82823 for using 2016 results to predict 2016 election and 0.8397702 for using 2012 election results to predict 2016 election.

```
#KNN
library(class)
normalize <- function(x) {
num <- x - min(x)
denom <- max(x) - min(x)
return (num/denom)
}
knnDF = bigDF[, c("State", "County", "2016 Clinton Votes", "2016 Trump Votes", "2012 Democrat Votes", "2012 Republican Votes", "Longit
ude", "Latitude", "HC01_VC90", "HC01_VC08", "HC01_VC83")]
knnDF=na.omit(knnDF)
names(knnDF) = c("State", "County", "dem.2016", "rep.2016", "dem.2012", "rep.2012", "lon", "lat", "bachelor", "unemployed", "rich")
knnDF$winner.2012 = factor(ifelse(knnDF$dem.2012 > knnDF$rep.2012, 1, 2), levels = c(1,2), labels = c("Democrat", "Republican"))
knnDF$winner.2016 = factor(ifelse(knnDF$dem.2016 > knnDF$rep.2016, 1, 2), levels = c(1,2), labels = c("Democrat", "Republican"))
knnDF[,7] = as.numeric(knnDF[,7])
knnDF[,8] = as.numeric(knnDF[,8])
knnDF[,9] = as.numeric(knnDF[,9])
```

```
knnDF[,10] = as.numeric(knnDF[,10])
knnDF[,11] = as.numeric(knnDF[,11])
# training and test data do not have the labels of who won
# training data is 2012
trainingDF = knnDF[,c(7,8,9,10,11)]
# testing data is 2016
testDF = knnDF[,c(7,8,9,10,11)]
train_target = knnDF[,12]
test_target = knnDF[,13]
k = round(sqrt(nrow(knnDF)))
election.predictor.2016 = knn(train = trainingDF, test = testDF, cl = train_target, k = k)
# run with multiple values of k and plot accuracy for plotting part 5
# test different k values, 31, 37, 56, 67, 73, 78
election.predictor.2016.k31 = knn(train = trainingDF, test = testDF, cl = train_target, k = 31)
election.predictor.2016.k37 = knn(train = trainingDF, test = testDF, cl = train_target, k = 37)
election.predictor.2016.k56 = knn(train = trainingDF, test = testDF, cl = train_target, k = 56)
election.predictor.2016.k67 = knn(train = trainingDF, test = testDF, cl = train_target, k = 67)
election.predictor.2016.k73 = knn(train = trainingDF, test = testDF, cl = train target, k = 73)
election.predictor.2016.k78 = knn(train = trainingDF, test = testDF, cl = train_target, k = 78)
#see the difference of the accuracy of different k values.
accuracy.table.k31 = table(test_target, election.predictor.2016.k31)
accuracy.percent.k31 = (accuracy.table.k31[1,1] + accuracy.table.k31[2,2])/sum(accuracy.table.k31)
accuracy.table.k37 = table(test_target, election.predictor.2016.k37)
accuracy.percent.k37 = ( accuracy.table.k37[1,1] + accuracy.table.k37[2,2] ) / sum(accuracy.table.k37)
accuracy.table.k56 = table(test_target, election.predictor.2016.k56)
accuracy.percent.k56 = (accuracy.table.k56[1,1] + accuracy.table.k56[2,2])/sum(accuracy.table.k56)
accuracy.table.k67 = table(test_target, election.predictor.2016.k67)
accuracy.percent.k67 = ( accuracy.table.k67[1,1] + accuracy.table.k67[2,2] ) / sum(accuracy.table.k67)
accuracy.table.k73 = table(test_target, election.predictor.2016.k73)
accuracy.percent.k73 = ( accuracy.table.k73[1,1] + accuracy.table.k73[2,2] ) / sum(accuracy.table.k73)
accuracy.table.k78 = table(test_target, election.predictor.2016.k78)
accuracy.percent.k78 = ( accuracy.table.k78[1,1] + accuracy.table.k78[2,2] ) / sum(accuracy.table.k78)
# Put all the accuracy of different K values into a data frame for plotting purpose.
accuframe1=data.frame(c(accuracy.percent.k31,accuracy.percent.k37,accuracy.percent.k56,accuracy.percent.k67,accuracy.percent.k73,accuracy.percent.k56,accuracy.percent.k56,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accuracy.percent.k67,accura
acy.percent.k78))
accuframe2=data.frame(c("31","37","56","67","73","78"))
accuframe=cbind(accuframe1,accuframe2)
names(accuframe)= c("Precentages", "K Values")
```

ggplot(data=accuframe,aes(group=1))+geom_line(aes(x= accuframe\$`K Values`, y= accuframe\$Precentages))+labs(x= "K Values", y= "Predict Percentage", title= "Predict Accuracy for Different K Values")





```
# verifying accuracy
accuracy.table = table(test_target, election.predictor.2016)
accuracy.percent = ( accuracy.table[1,1] + accuracy.table[2,2] ) / sum(accuracy.table)
```

6 Discussion

After adjusting the radius of each circle, the map suggested that most votes are distributed on the west and east coast. There are more portion of vote for Clinton on west coast, and there are more blue for west coast and middle. And most dots are evenly distributed. When we look at our predictor from step 4, there are a lot of counties that are having close percentage distribution for Clinton and Trump. And from the map, most of the dots in the middle and east coast are having same portion of area in pie. The predictor suggested Trump will have about 80 percent rate to win, and the pies on map also shows that Trump will have more portion for vote in each county. Therefore, we believe our predictors did well.

7 References

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This notes is for our team to see the coresponding catagory in the original file for convenience purpose. DP02:

HC01_VC84,Estimate; EDUCATIONAL ATTAINMENT - Population 25 years and over

HC01_VC85, Estimate; EDUCATIONAL ATTAINMENT - Less than 9th grade

HC01_VC86, "Estimate; EDUCATIONAL ATTAINMENT - 9th to 12th grade, no diploma"

HC01_VC87,Estimate; EDUCATIONAL ATTAINMENT - High school graduate (includes equivalency)

HC01_VC88, "Estimate; EDUCATIONAL ATTAINMENT - Some college, no degree"

HC01_VC89, Estimate; EDUCATIONAL ATTAINMENT - Associate's degree

HC01_VC90, Estimate; EDUCATIONAL ATTAINMENT - Bachelor's degree

HC01_VC91,Estimate; EDUCATIONAL ATTAINMENT - Graduate or professional degree

HC01_VC128,Estimate; PLACE OF BIRTH - Total population

HC01_VC129,Estimate; PLACE OF BIRTH - Native

HC01 VC130, Estimate; PLACE OF BIRTH - Native - Born in United States

HC01_VC131,Estimadte; PLACE OF BIRTH - Native - Born in United States - State of residence

HC01 VC132, Estimate; PLACE OF BIRTH - Native - Born in United States - Different state

HC01_VC133, "Estimate; PLACE OF BIRTH - Native - Born in Puerto Rico, U.S. Island areas, or born abroad to American parent(s)"

HC02_VC134,Estimate Margin of Error; PLACE OF BIRTH - Foreign born

DPO3:

HC01_VC04,Estimate; EMPLOYMENT STATUS - Population 16 years and over

HC01_VC05,Estimate; EMPLOYMENT STATUS - In labor force

HC01 VC06, Estimate; EMPLOYMENT STATUS - In labor force - Civilian labor force

HC01_VC07,Estimate; EMPLOYMENT STATUS - In labor force - Civilian labor force - Employed

HC01_VC08,Estimate; EMPLOYMENT STATUS - In labor force - Civilian labor force - Unemployed

HC01 VC10, Estimate; EMPLOYMENT STATUS - Not in labor force

HC01_VC74, Estimate; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - Total households

HC01 VC75, "Estimate; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - Less than \$10,000"

HC01_VC76, "Estimate; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - \$10,000 to \$14,999"

HC01 VC77, "Estimate; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - \$15,000 to \$24,999"

HC01_VC78, "Estimate; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - \$25,000 to \$34,999"

HC01 VC79, "Estimate; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - \$35,000 to \$49,999"

HC01_VC80, "Estimate; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - \$50,000 to \$74,999"

HC02_VC81, "Estimate Margin of Error; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - \$75,000 to \$99,999"

HC01_VC82, "Estimate; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - \$100,000 to \$149,999"

HC01_VC83, "Estimate; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - \$150,000 to \$199,999"

HC01 VC84, "Estimate; INCOME AND BENEFITS (IN 2010 INFLATION-ADJUSTED DOLLARS) - \$200,000 or more"