

Topic 6. Conditional (Bivariate) Visualization

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Today's Agenda

- ▶ Becoming political pundits: summarizing the 2020 Popular Vote Over Time
- ▶ Conditional data: when a variable varies with respect to some other variable
- ▶ Visualizing conditional data
- ▶ “Smoothing” data
- ▶ (Intro) Looping

What is our question?

How did the support for Biden and Trump vary across the course of the 2020 Election?

- ▶ What should we measure?
- ▶ How do we summarize, visualize, and communicate?

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Give you some tools to do some *amazing* things!

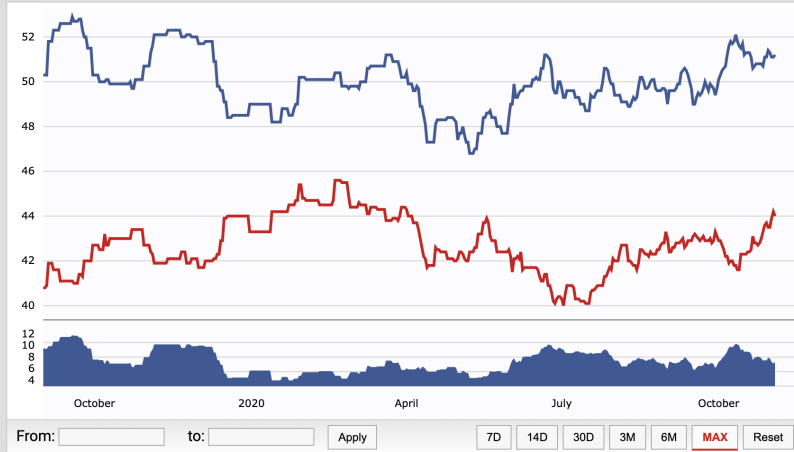
End goal?



RCP POLL AVERAGE

General Election: Trump vs. Biden

51.2 Biden (D) +7.2
44.0 Trump (R)



REALCLEARPOLITICS

End goal?

National overview ▾

FiveThirtyEight **2020**



As the election gets closer - and as we get swamped with new polls - the forecast will get less uncertain. 😊

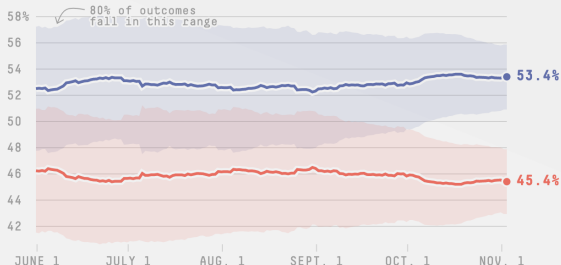
How the forecast has changed

The forecast updates at least once a day and whenever we get a new poll. Click the buttons to see the ways each candidate's outlook has changed over time.

CHANCE OF WINNING

ELECTORAL VOTES

POPULAR VOTE



Telling Time

- ▶ Time is often a critical *descriptive* variable. (Not causal!)
- ▶ Also useful for *prediction* ?

Telling Time

- ▶ Time is often a critical *descriptive* variable. (Not causal!)
- ▶ Also useful for *prediction* ?
- ▶ We want to evaluate the properties of presidential polling as Election Day 2020 approached.
- ▶ Necessary for prediction – we want most recent data to account for last-minute shift.
- ▶ Necessary for identifying when changes occurred (and why?)

Dates in R

- Dates are a special format in R (character with quasi-numeric properties)

```
load(file="data/Pres2020.PV.Rdata")  
election.day <- as.Date("11/3/2020", "%m/%d/%Y")  
election.day16 <- as.Date("11/8/2016", "%m/%d/%Y")
```

Dates in R

- ▶ Dates are a special format in R (character with quasi-numeric properties)

```
load(file="data/Pres2020.PV.Rdata")  
election.day <- as.Date("11/3/2020", "%m/%d/%Y")  
election.day16 <- as.Date("11/8/2016", "%m/%d/%Y")
```

- ▶ Difference in “dates” versus difference in integers?

```
election.day - election.day16
```

```
## Time difference of 1456 days
```

```
as.numeric(election.day - election.day16)
```

```
## [1] 1456
```

Initial Questions

- ▶ How many polls were publicly done and reported in the media about the national popular vote?
- ▶ When did the polling occur? Did most of the polls occur close to Election Day?

Alternative Questions using similar code but different data!

- ▶ How does the pattern in 2020 compare to past patterns?
- ▶ What does the pattern look like in upcoming elections?
(NJ/VA/2022)
- ▶ How has the (per capita?) number of COVID cases/deaths/hospitalizations (in a county/state/country?) changed over time?
- ▶ How does the performance of an NBA Team (or player) vary over the course of a season in terms of Y?

Conditional Relationships

- ▶ How does the value of the outcome of interest vary *depending* on the value of another variable of interest?
- ▶ Outcome of interest (dependent variable, Y)
- ▶ Other variables possibly related to the outcome (independent variable, X)

Conditional Relationships

- ▶ How does the value of the outcome of interest vary *depending* on the value of another variable of interest?
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Y: Number of Polls being reported on X: Proximity to Election Day

Conditional Relationships

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Y: Number of Polls being reported on X: Proximity to Election Day

So, for every day, how many polls were reported by the media?

Let's Wrangle...

```
Pres2020.PV <- Pres2020.PV %>%  
  mutate(EndDate = as.Date(Pres2020.PV$EndDate, "%  
    StartDate = as.Date(Pres2020.PV$StartDate,  
    DaysToED = as.numeric(election.day - EndDa  
    margin = Biden - Trump)
```


What are we plotting?

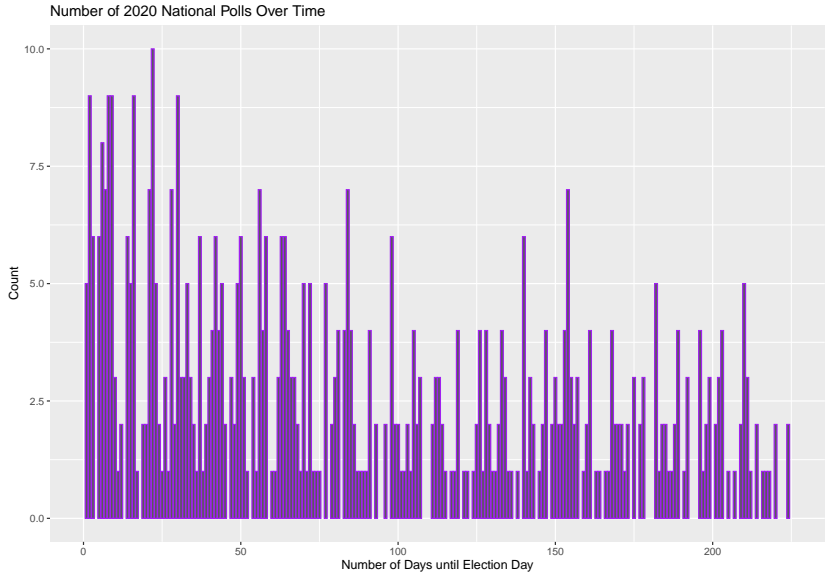
- ▶ Media Question: how does the number of polls change over time?
- ▶ Data Scientist Question: What do we need to plot? `margin` or `DaysToED`?
- ▶ What will each produce?
- ▶ Are they *categorical* (barplot) or *continuous* (histogram)?

Barplot

```
p <- ggplot(data = Pres2020.PV, aes(x = DaysToED)) +  
  labs(title = "Number of 2020 National Polls Over Time") +  
  labs(x = "Number of Days until Election Day") +  
  labs(y = "Count") +  
  geom_bar(color="PURPLE")
```

When did polls occur?

p

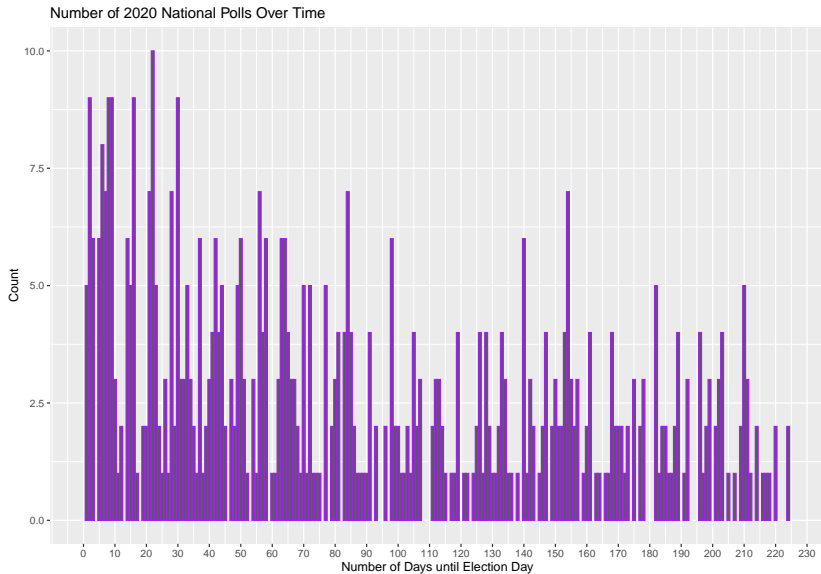


Hmm... Better axis?

```
p <- ggplot(data = Pres2020.PV, aes(x = DaysToED)) +  
  labs(title = "Number of 2020 National Polls Over Time") +  
  labs(x = "Number of Days until Election Day") +  
  labs(y = "Count") +  
  geom_bar(color="PURPLE") +  
  scale_x_continuous(breaks=seq(0,230,by=10))
```

Hmm... Better axis?

p

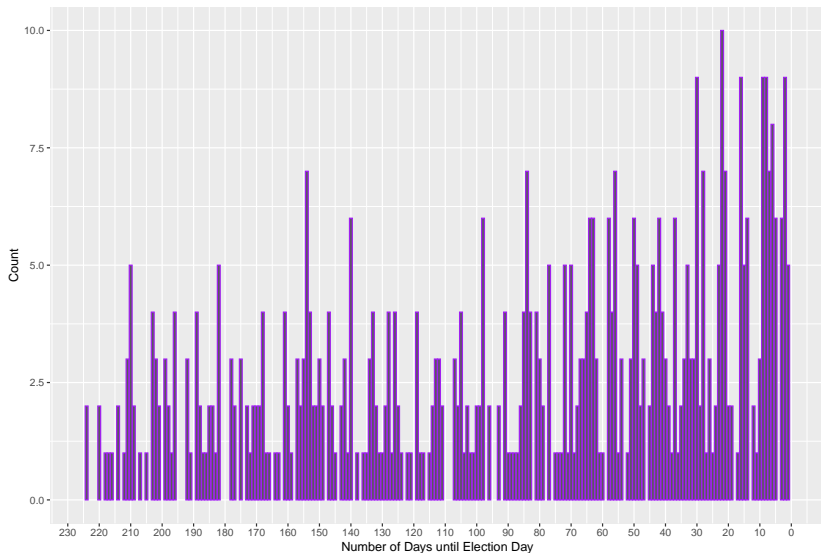


Flipping the scale: November > January

```
p <- ggplot(data = Pres2020.PV, aes(x = DaysToED)) +  
  labs(title = "Number of 2020 National Polls Over Time") +  
  labs(x = "Number of Days until Election Day") +  
  labs(y = "Count") +  
  geom_bar(color="PURPLE") +  
  scale_x_reverse(breaks=seq(0,230,by=10))
```

When did polls occur? November > January

Number of 2020 National Polls Over Time



Histogram

```
p <- ggplot(data = Pres2020.PV, aes(x = DaysToED)) +  
  labs(title = "Number of 2020 National Polls Over Time") +  
  labs(x = "Number of Days until Election Day") +  
  labs(y = "Count") +  
  geom_histogram(color="PURPLE",bins = 30) +  
  scale_x_reverse()
```

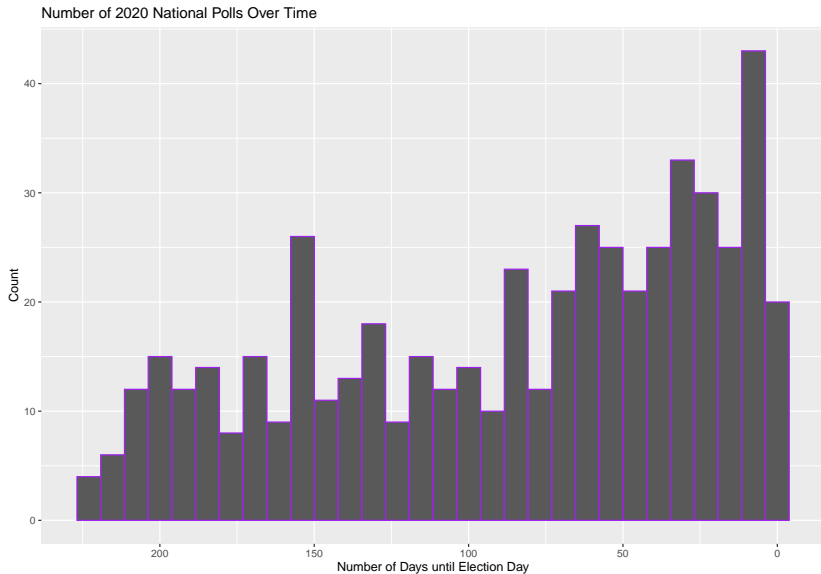

Histogram

```
p <- ggplot(data = Pres2020.PV, aes(x = DaysToED)) +  
  labs(title = "Number of 2020 National Polls Over Time") +  
  labs(x = "Number of Days until Election Day") +  
  labs(y = "Count") +  
  geom_histogram(color="PURPLE",bins = 30) +  
  scale_x_reverse()
```

- What does a bin mean in this context?

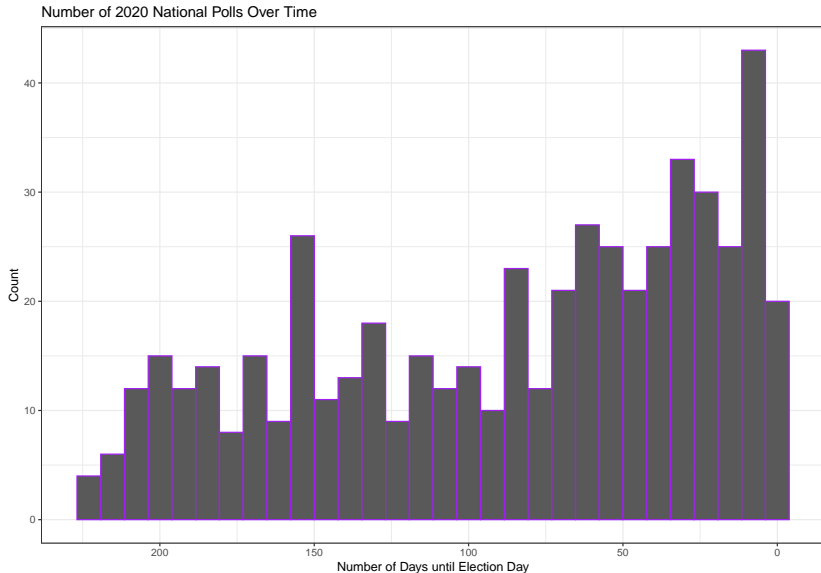
Histogram because nearly continuous?

p



Get rid of background?

```
p + theme_bw()
```



Bivariate/Multivariate relationships

- ▶ Most of what we do is a relationship between (at least) 2 variables.
- ▶ Here we are interested in how the margin varies as Election Day approaches: `margin` by `DaysToED`.
- ▶ Want to plot X (variable that “explains”) vs. Y (variable being “explained”):

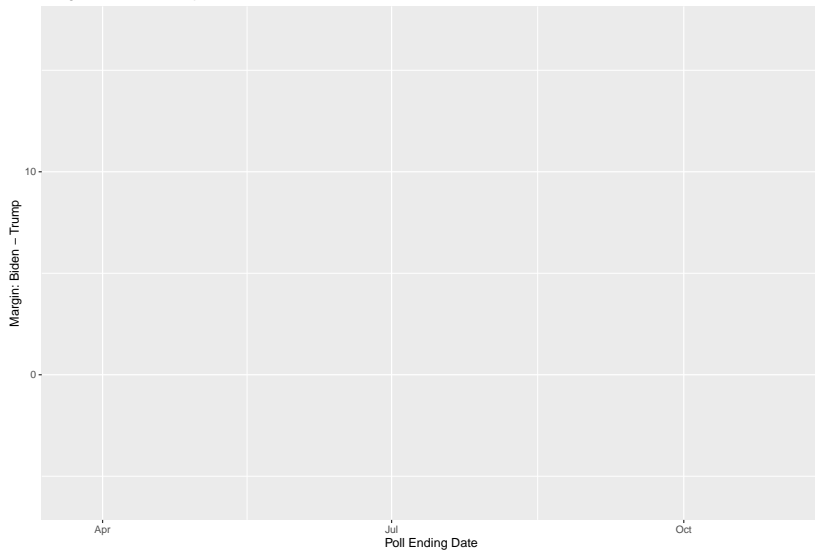
Scatterplot: Relationship between Continuous Variables

```
margin.plot <- ggplot(Pres2020.PV,  
                      aes(x = EndDate, y = margin)) +  
  labs(title="Margin in 2020 Nat. Popular Vote Polls Over Time")  
  labs(y = "Margin: Biden - Trump") +  
  labs(x = "Poll Ending Date")
```

Scatterplot

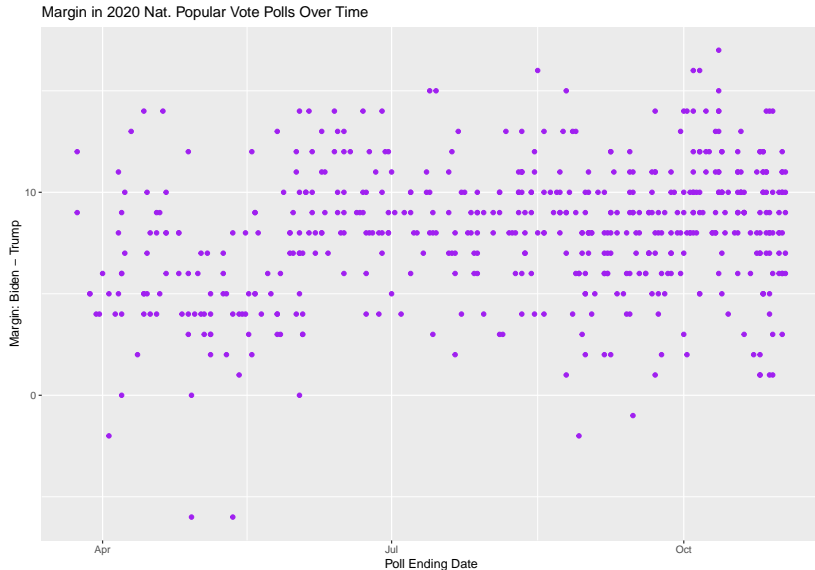
```
margin.plot
```

Margin in 2020 Nat. Popular Vote Polls Over Time



Scatterplot: Add Points!

```
margin.plot + geom_point(color = "PURPLE")
```



Things that make me sad...

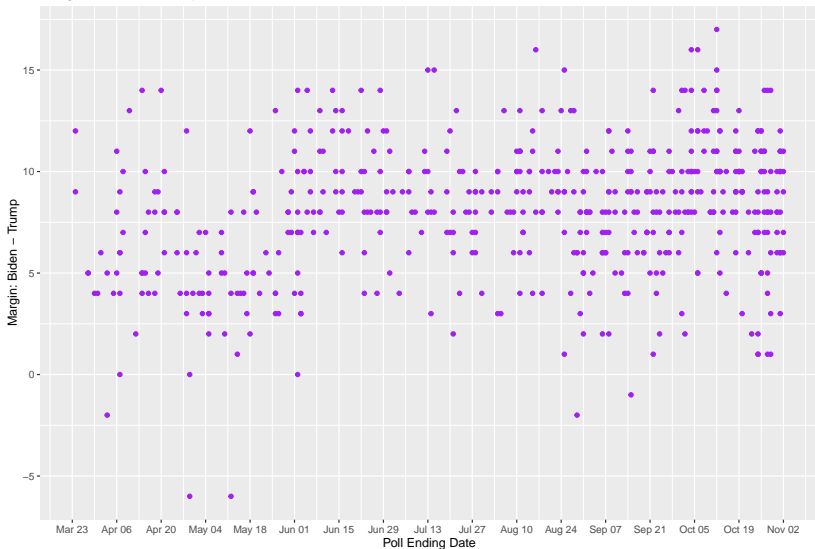
1. Axis looks weird - lots of interpolation required by the consumer.
2. Data looks “chunky”? How many data points are at each point?

Fix Axis Scale!

```
margin.plot +  
  geom_point(color = "PURPLE") +  
  scale_y_continuous(breaks=seq(-10,20,by=5)) +  
  scale_x_date(date_breaks = "2 week", date_labels = "%b %d")
```

Fix Axis Scale!

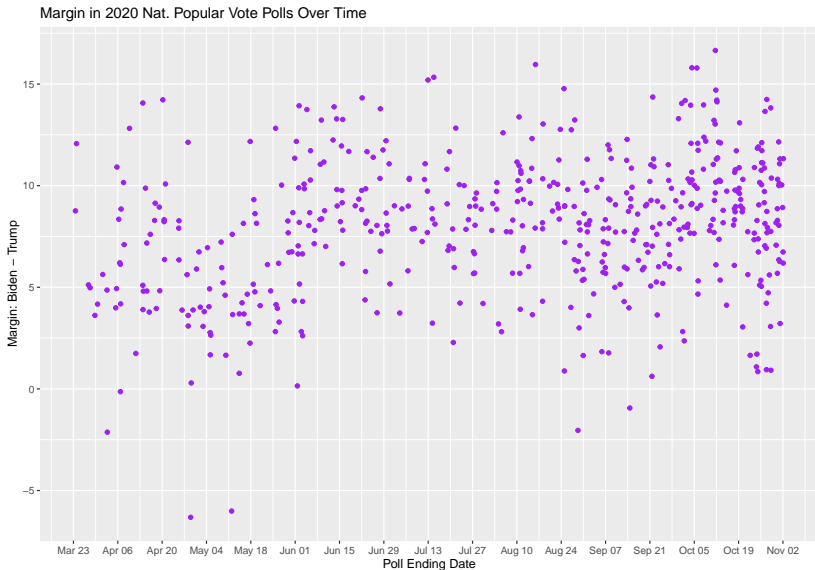
Margin in 2020 Nat. Popular Vote Polls Over Time



Chunky Data? jitter points

```
margin.plot +  
  geom_point(color = "PURPLE", position="jitter") +  
  scale_y_continuous(breaks=seq(-10,20,by=5)) +  
  scale_x_date(date_breaks = "2 week", date_labels = "%b %d")
```

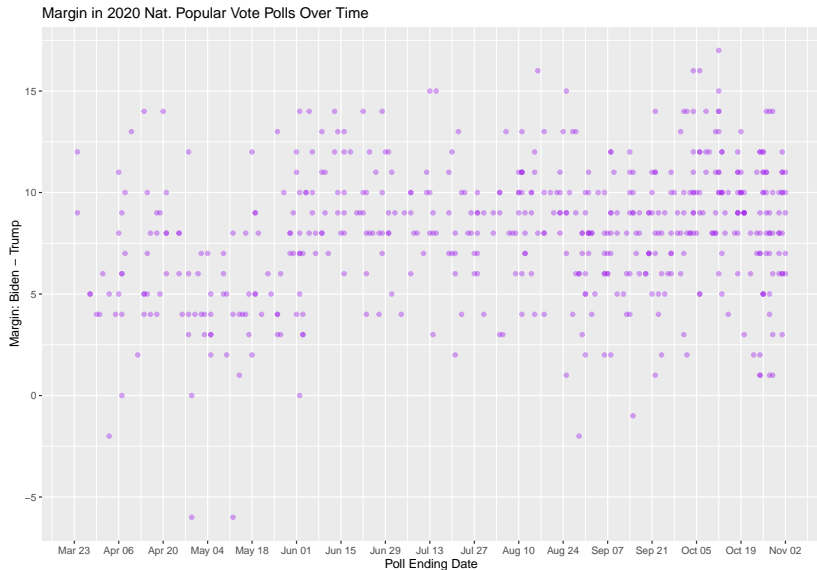
Chunky Data? jitter points



Chunky Data? alpha points

```
margin.plot +  
  geom_point(color = "PURPLE", alpha = .4) +  
  scale_y_continuous(breaks=seq(-10,20,by=5)) +  
  scale_x_date(date_breaks = "2 week", date_labels = "%b %d")
```

Chunky Data? alpha points



Create Object for later

```
margin.plot <- margin.plot +  
  geom_point(color = "PURPLE", alpha = .4) +  
  scale_y_continuous(breaks=seq(-10,20,by=5)) +  
  scale_x_date(date_breaks = "2 week", date_labels = "%b %d")
```

Scatterplot: Add Lines?

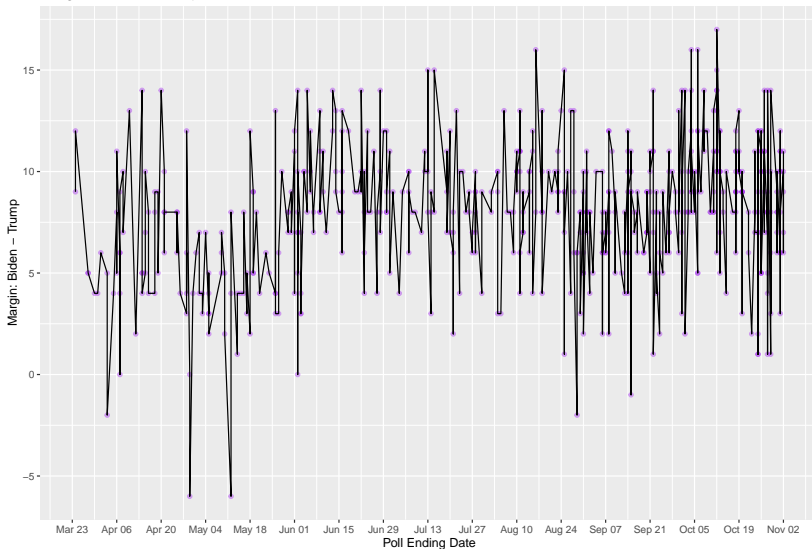
```
margin.plot + geom_line()
```

RECAP:

- ▶ `geom_point` adds a point at the (x,y) point defined in `ggplot` (unless defined in `geom_point`)
- ▶ `geom_line` adds a line connecting the (x,y) points

Scatterplot: Add Lines?

Margin in 2020 Nat. Popular Vote Polls Over Time



Scatterplot: Add “Smoother”?

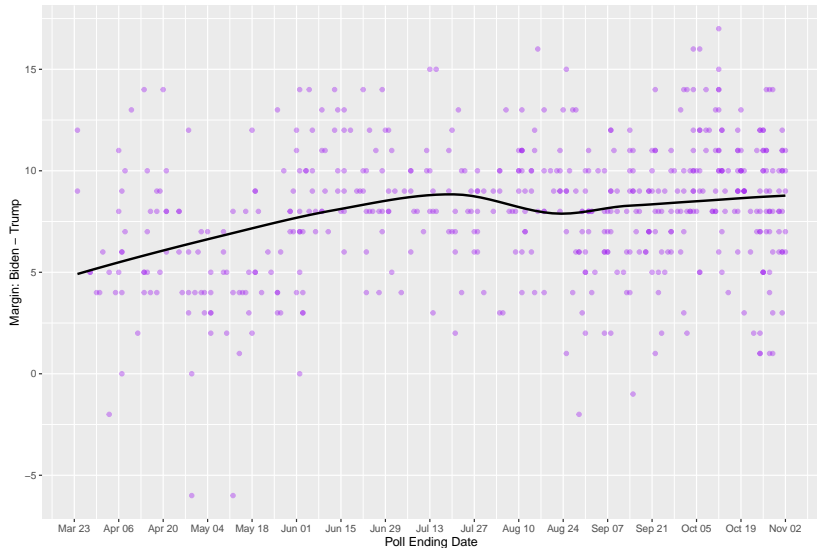
```
margin.plot + geom_smooth(color = "BLACK", se=F)
```

- ▶ `geom_smooth` adds in a weighted (“smoothed”) average
- ▶ BUT: Don’t use what you don’t understand!
- ▶ More on smoothing soon!

Scatterplot: Add Smoother?

```
## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
```

Margin in 2020 Nat. Popular Vote Polls Over Time



Plotting Multiple Variables Over Time (Time-Series)

- ▶ `margin` OK, but limited in what it shows

Plotting Multiple Variables Over Time (Time-Series)

- ▶ `margin` OK, but limited in what it shows
- ▶ Can we plot support for Biden and support for Trump separately over time (on the same plot)?

“Stretch” Extensions

- ▶ Comparing the change in margin over time for multiple election years?
- ▶ Comparing the support for candidates (Biden and Trump) in multiple states?
- ▶ Comparing the support for candidates according to different types of polls?
- ▶ Comparing the support for presidential candidates relative to senatorial and gubernatorial candidates in the same state?

“Stretch” Extensions

- ▶ Comparing the change in margin over time for multiple election years?
- ▶ Comparing the support for candidates (Biden and Trump) in multiple states?
- ▶ Comparing the support for candidates according to different types of polls?
- ▶ Comparing the support for presidential candidates relative to senatorial and gubernatorial candidates in the same state?
- ▶ Comparing the deaths/cases per capita over time (and also by county/state)?
- ▶ Comparing the performance of an NBA team/player in several dimensions over time?

First, define the canvas!

```
BidenTrumpplot <- ggplot(Pres2020.PV) +  
  labs(title="% Biden and Trump in 2020 National Popular Vote Po  
  labs(y = "Pct. Support") +  
  labs(x = "Poll Ending Date")
```


Blank scale!

BidenTrumpplot

% Biden and Trump in 2020 National Popular Vote Polls Over Time

Pct. Support

Poll Ending Date

Now, add the points for Trump

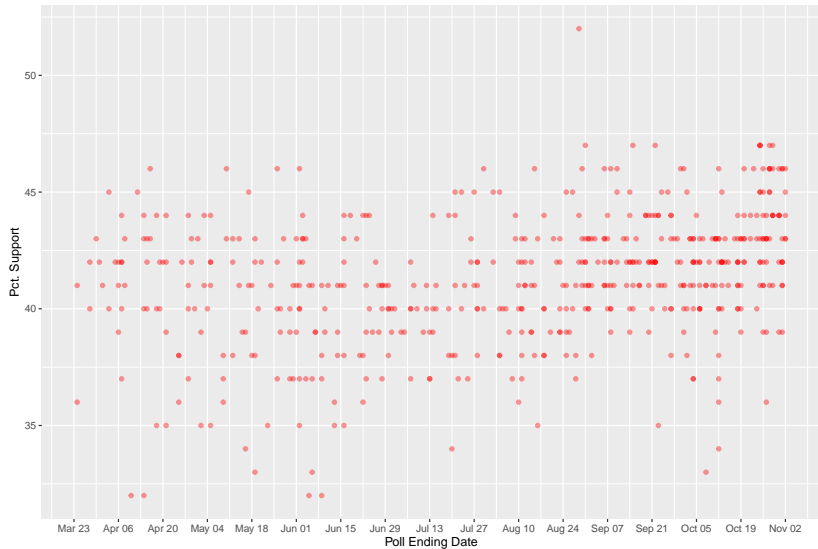
```
BidenTrumpplot <- BidenTrumpplot +  
  geom_point(aes(x = EndDate, y = Trump),  
             color = "red", alpha=.4) +  
  scale_x_date(date_breaks = "2 week", date_labels = "%b %d")
```

- Note the use of aes in geom_point()!

What do you have?

BidenTrumpplot

% Biden and Trump in 2020 National Popular Vote Polls Over Time



Now, add the points for Biden

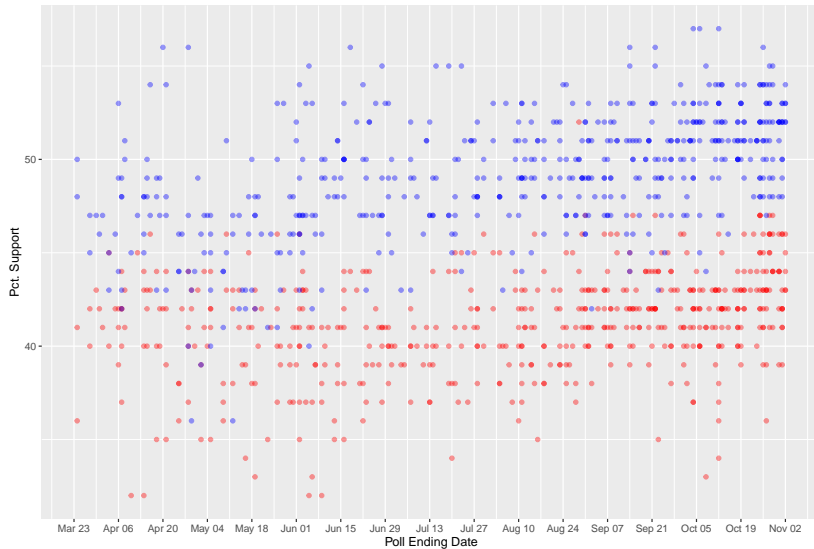
```
BidenTrumpplot <- BidenTrumpplot +  
  geom_point(aes(x = EndDate, y = Biden),  
             color = "blue", alpha=.4)
```

- ▶ ggplot will now rescale y-axis to fit both Trump and Biden

Adding Biden

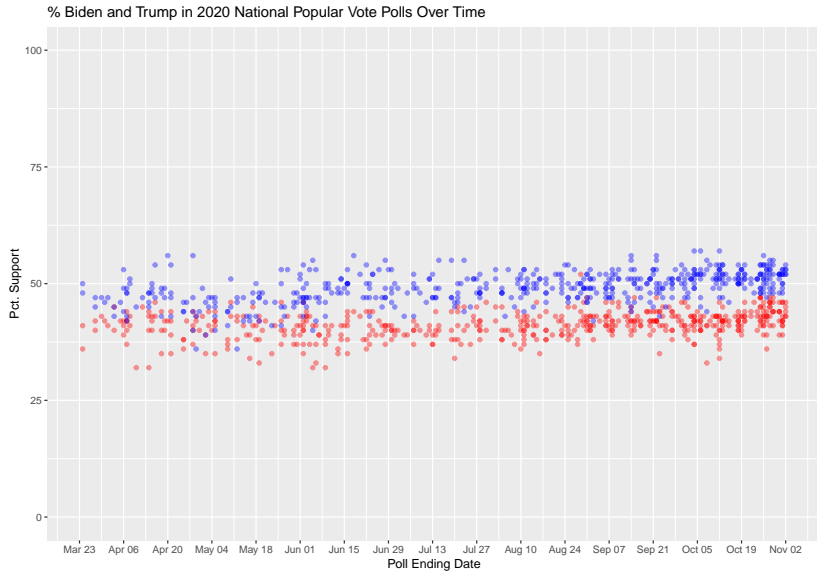
BidenTrumpplot

% Biden and Trump in 2020 National Popular Vote Polls Over Time



Set the Axis?

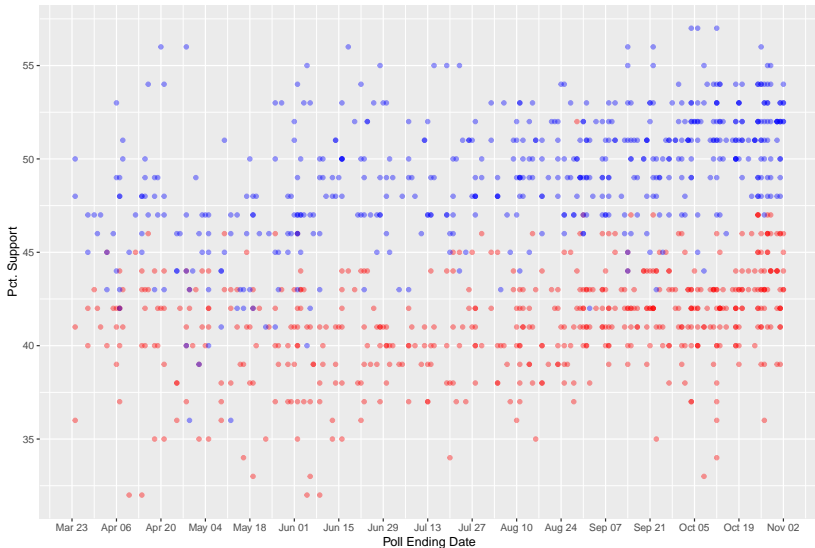
```
BidenTrumpplot + ylim(0,100)
```



For reals

```
BidenTrumpplot + scale_y_continuous(breaks=seq(30,70,by=5))
```

% Biden and Trump in 2020 National Popular Vote Polls Over Time



Adding some lines?

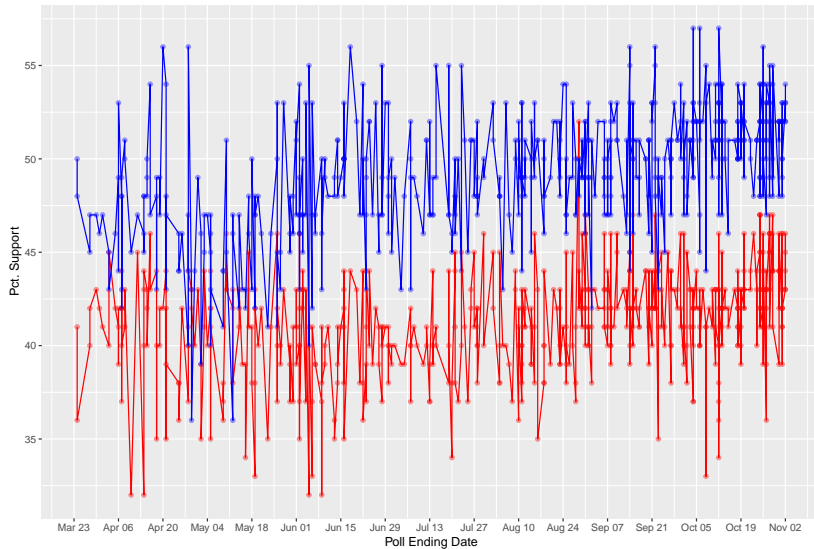
```
BTwithlines <- BidenTrumpplot +  
  scale_y_continuous(breaks=seq(30,70,by=5)) +  
  geom_line(aes(x = EndDate, y = Trump), color = "red") +  
  geom_line(aes(x = EndDate, y = Biden), color = "blue")
```

- We add lines the same way we added points!

But we shouldn't. . .

BTwithlines

% Biden and Trump in 2020 National Popular Vote Polls Over Time



Putting it all together

```
BTNational <- ggplot(Pres2020.PV) +  
  geom_point(aes(x = EndDate, y = Trump),  
             color = "red", alpha = .4) +  
  geom_point(aes(x = EndDate, y = Biden),  
             color = "blue", , alpha = .4) +  
  geom_smooth(aes(x = EndDate, y = Trump),  
              color = "red",se=F) +  
  geom_smooth(aes(x = EndDate, y = Biden),  
              color = "blue",se=F) +  
  labs(title="% Biden and Trump in 2020 Nat. Popular Vote Polls",  
        y = "Pct. Support") +  
  labs(x = "Poll Ending Date") +  
  scale_x_date(date_breaks = "2 week", date_labels = "%b %d") +  
  scale_y_continuous(breaks=seq(30,70,by=5))
```

% Biden and Trump in 2020 Nat. Popular Vote Polls Over Time

