

# From Charted to Uncharted Territory

## Accessibility and Interactive Data Experiences



Frank Elavsky



Human-  
Computer  
Interaction  
Institute

[hcii.cmu.edu](http://hcii.cmu.edu), [axle-lab.com](http://axle-lab.com), [dig.cmu.edu](http://dig.cmu.edu)



# Understanding perception of language

RED	GREEN	BLUE	YELLOW	PINK
ORANGE	BLUE	GREEN	BLUE	WHITE
GREEN	YELLOW	ORANGE	BLUE	WHITE
BROWN	RED	BLUE	YELLOW	GREEN
PINK	YELLOW	GREEN	BLUE	RED

**Set 1**

X	Y
10	8.04
8	6.95
13	7.58
9	8.81
11	8.33
14	9.96
6	7.24
4	4.26
12	10.84
7	4.82
5	5.68

**Set 2**

X	Y
10	9.14
8	8.14
13	8.74
9	8.77
11	9.26
14	8.1
6	6.13
4	3.1
12	9.11
7	7.26
5	4.74

**Set 3**

X	Y
10	7.46
8	6.77
13	12.74
9	7.11
11	7.81
14	8.84
6	6.08
4	5.39
12	8.15
7	6.42
5	5.73

**Set 4**

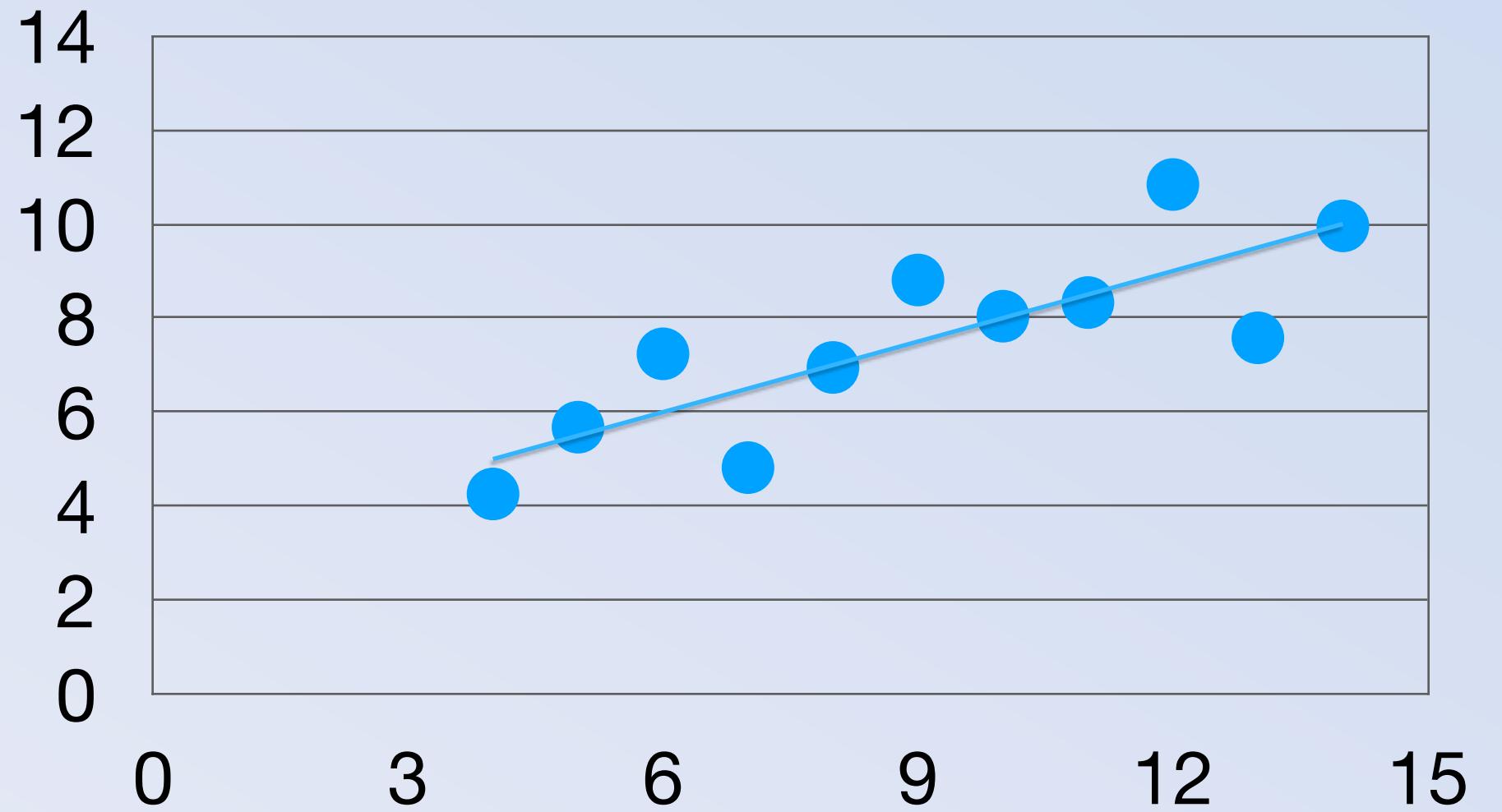
X	Y
8	6.58
8	5.76
8	7.71
8	8.84
8	8.47
8	7.04
8	5.25
19	12.5
8	5.56
8	7.91
8	6.89

**Summary Statistics      Linear Regression**

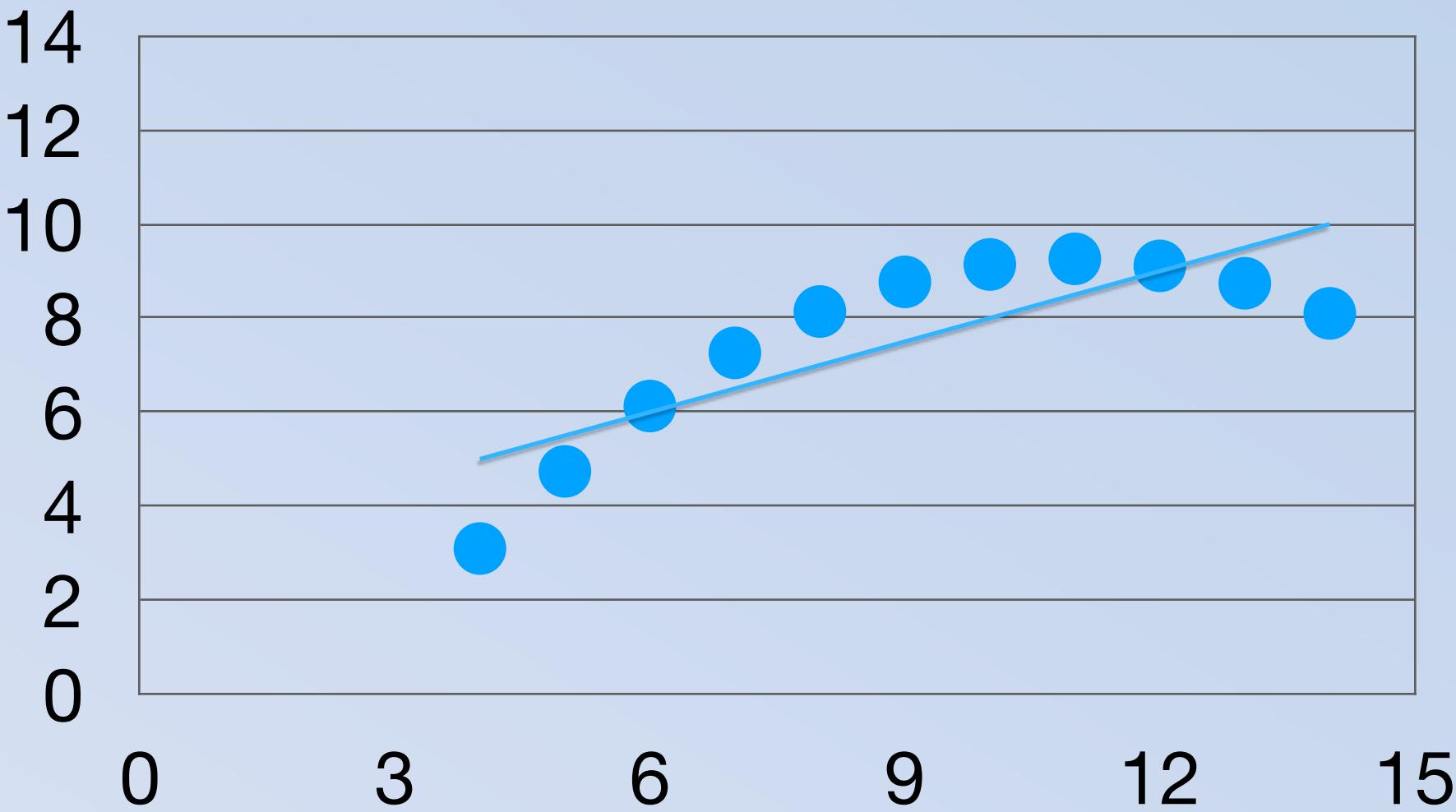
$$\begin{aligned} u_X &= 9.0 & \sigma_X &= 3.317 & Y^2 &= 3 + 0.5 X \\ u_Y &= 7.5 & \sigma_Y &= 2.03 & R^2 &= 0.67 \end{aligned}$$

[Anscombe 1973]

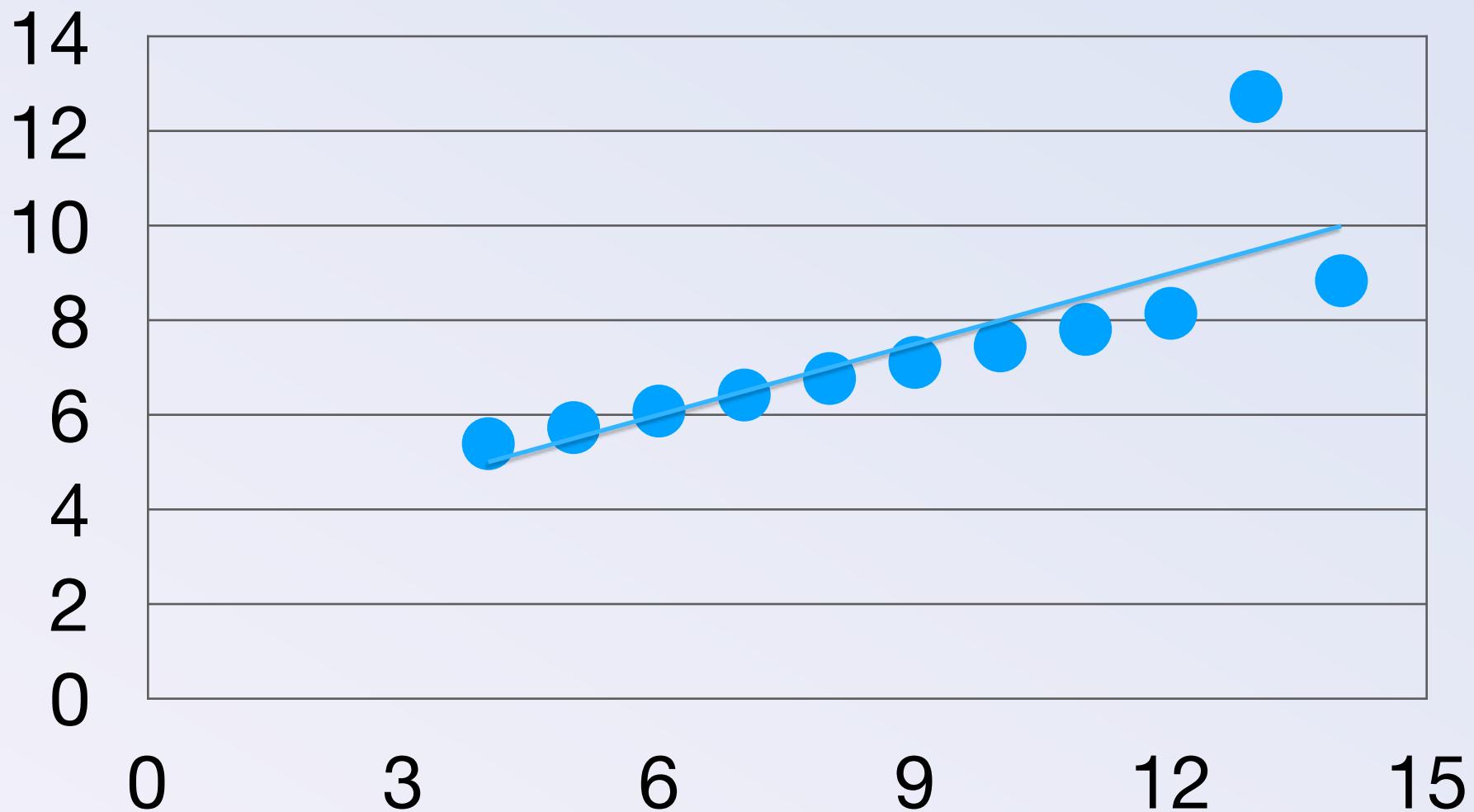
### Set 1



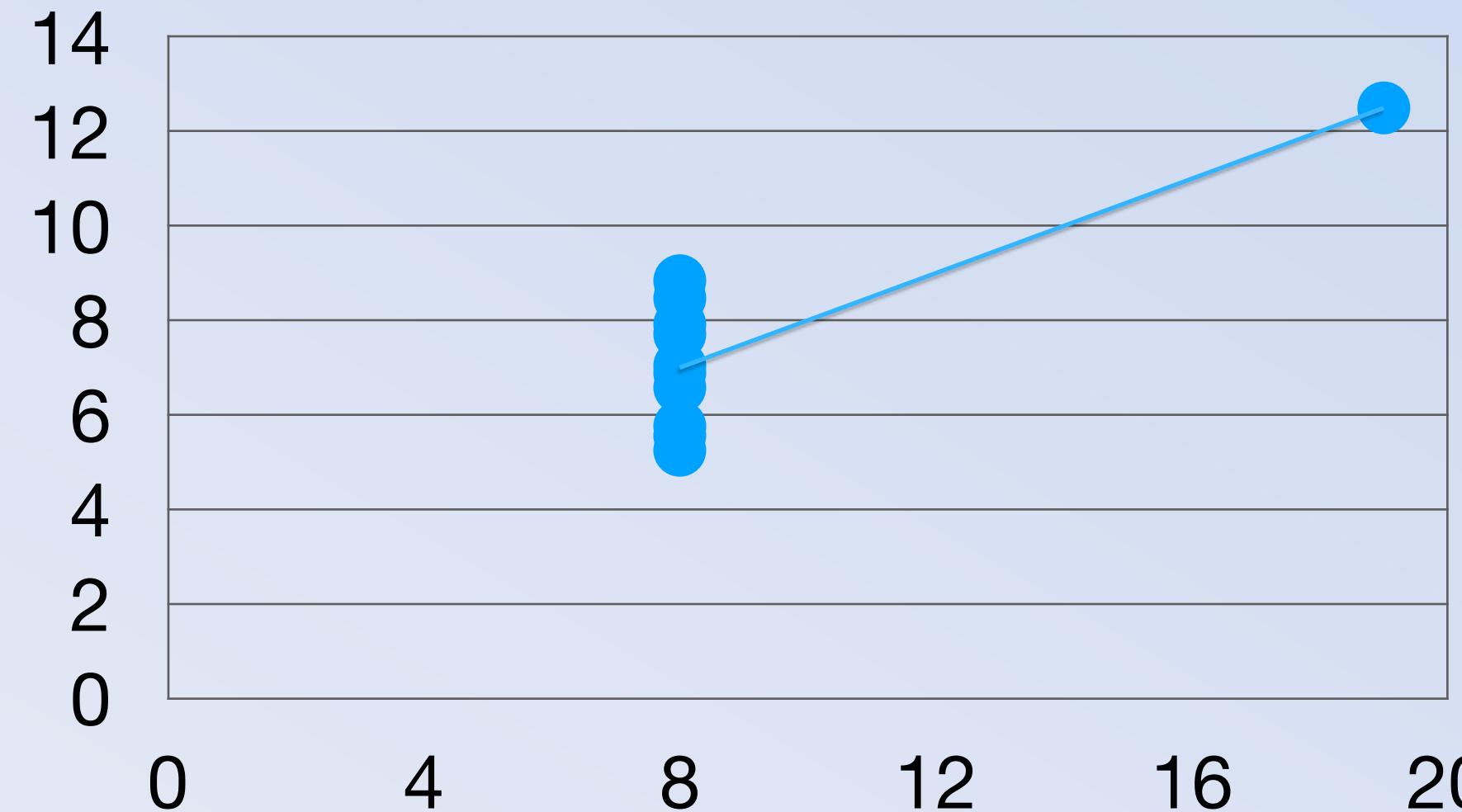
### Set 2

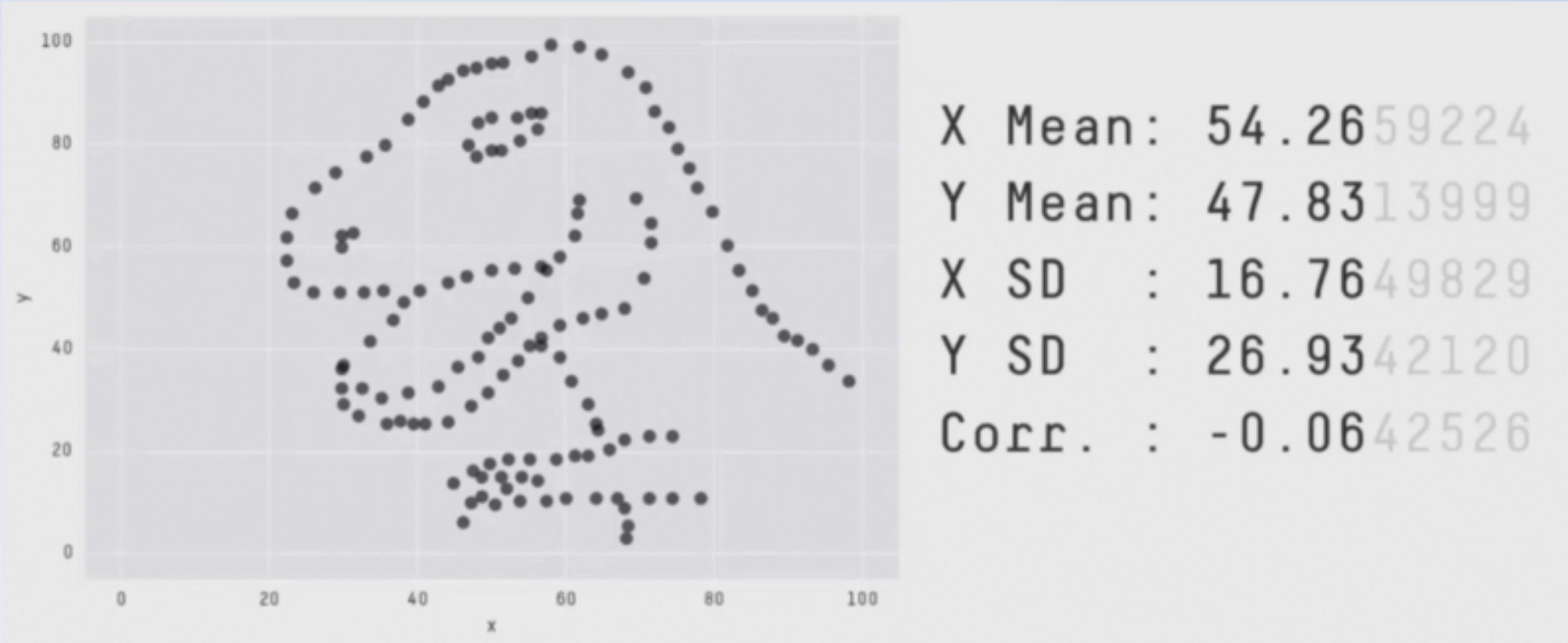


### Set 3



### Set 4





Animation inspired by Alberto Cairo's "[Datasaurus Dozen](#)" dataset

# Agenda

1. Why (20%)
2. What (30%)
3. How (50%)

# Agenda

1. Why (0%)
2. What (0%)
3. How (100%)

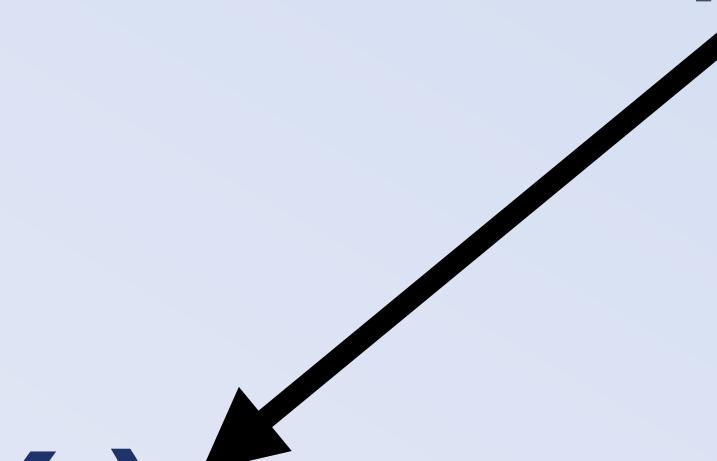
# Agenda

1. Why (0%)

2. What (0%)

3. How (100%)

By the end of this talk,  
You'll be ready for this



# Agenda

1. Why (20%)

2. What (30%)

---

3. How (50%)

Accessibility 101



# Agenda

1. Why (20%)

Accessibility 101



2. What (30%)

3. How (50%)

Vis+Accessibility 801

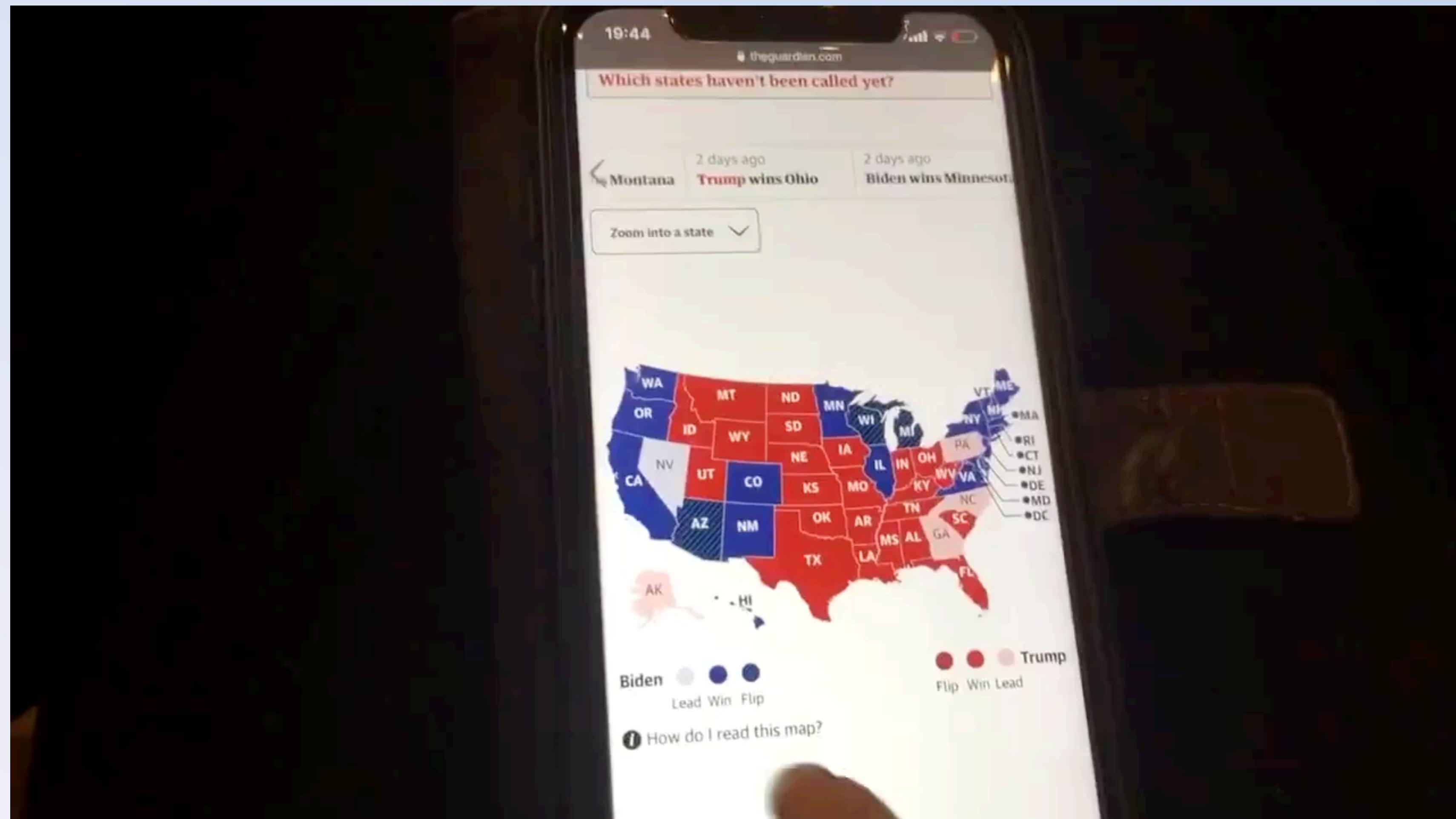


# Why?

(Why do accessibility work? Why care?)

# What is an inaccessible experience like?

Credit: Sarah Fossheim [on twitter](#)



# So “accessibility:” What is it?

# **Accessibility:**

1. The qualities that make an experience open or usable to all.

# **Accessibility:**

1. The qualities that make an experience open or usable to all.
2. **The qualities that make an experience open or usable specifically for people with disabilities.**

# Access is a human right

Accessibility is an internationally recognized human right.

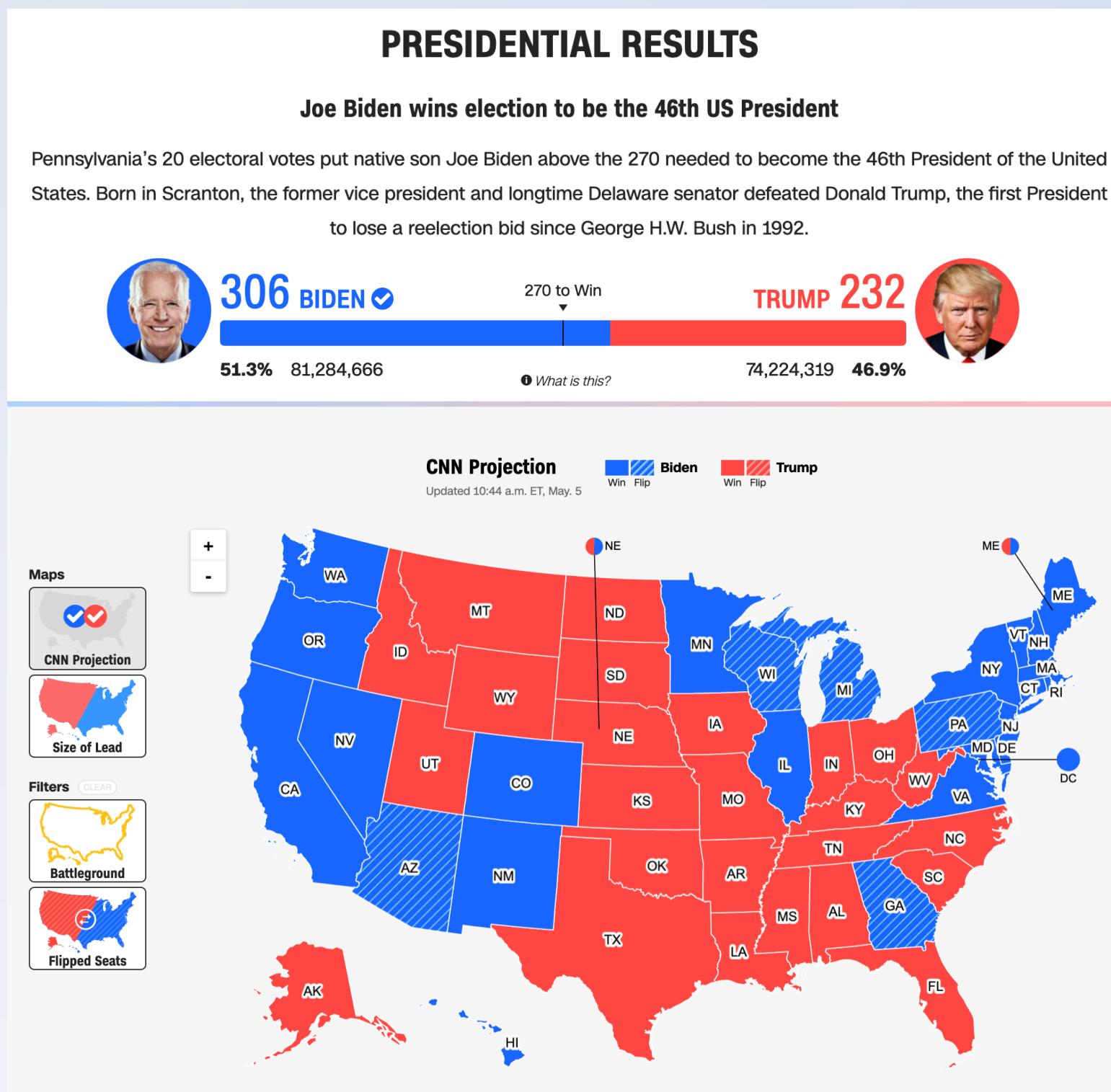
It is the morally and ethically correct thing to do.



UN CRPD Article 9: Accessibility, UN CRPD Article 10: Right to Life

# People with disabilities deserve to:

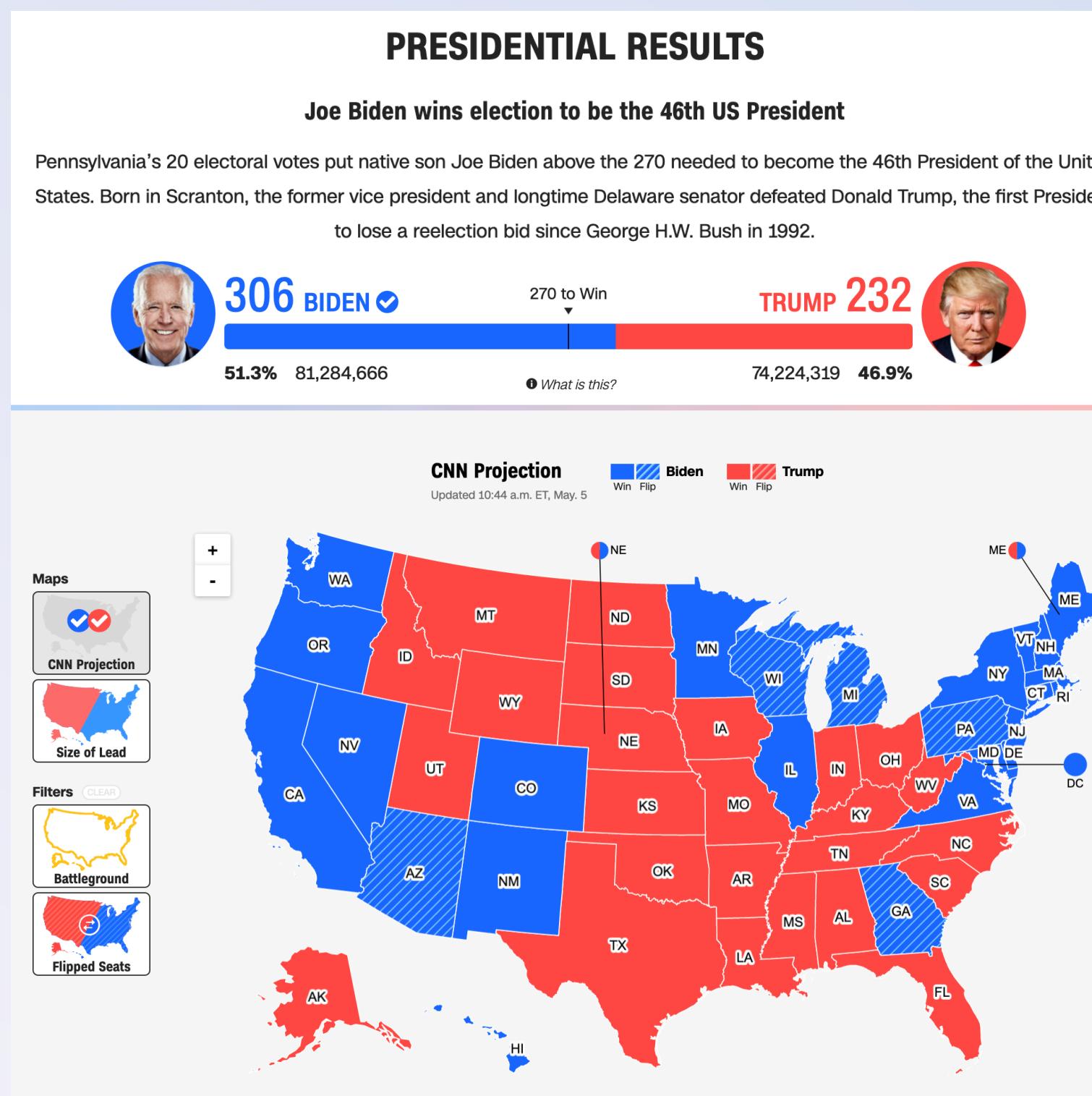
## Participate in politics



Credit: [CNN](#)

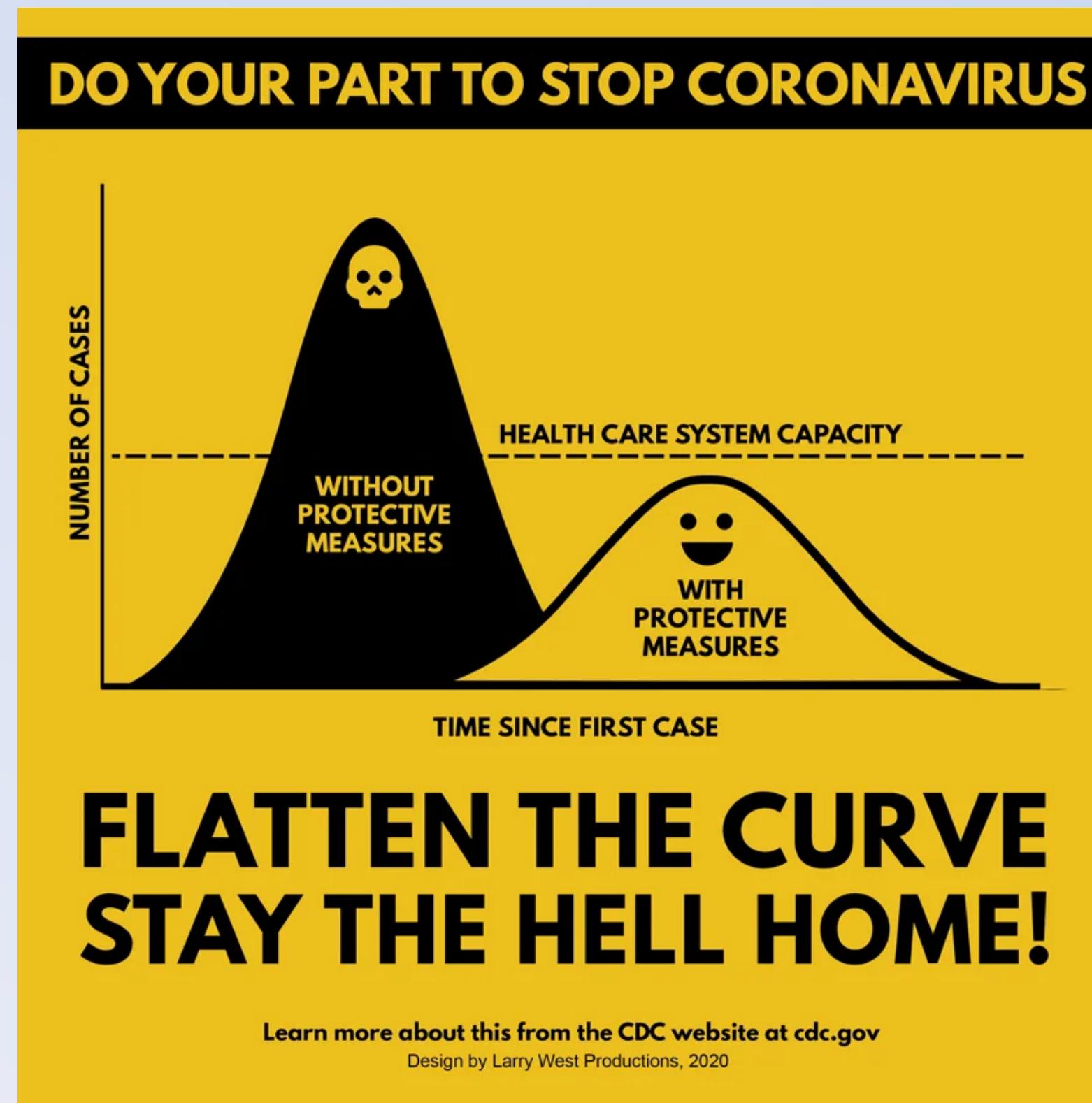
# People with disabilities deserve to:

## Participate in politics



Credit: [CNN](#)

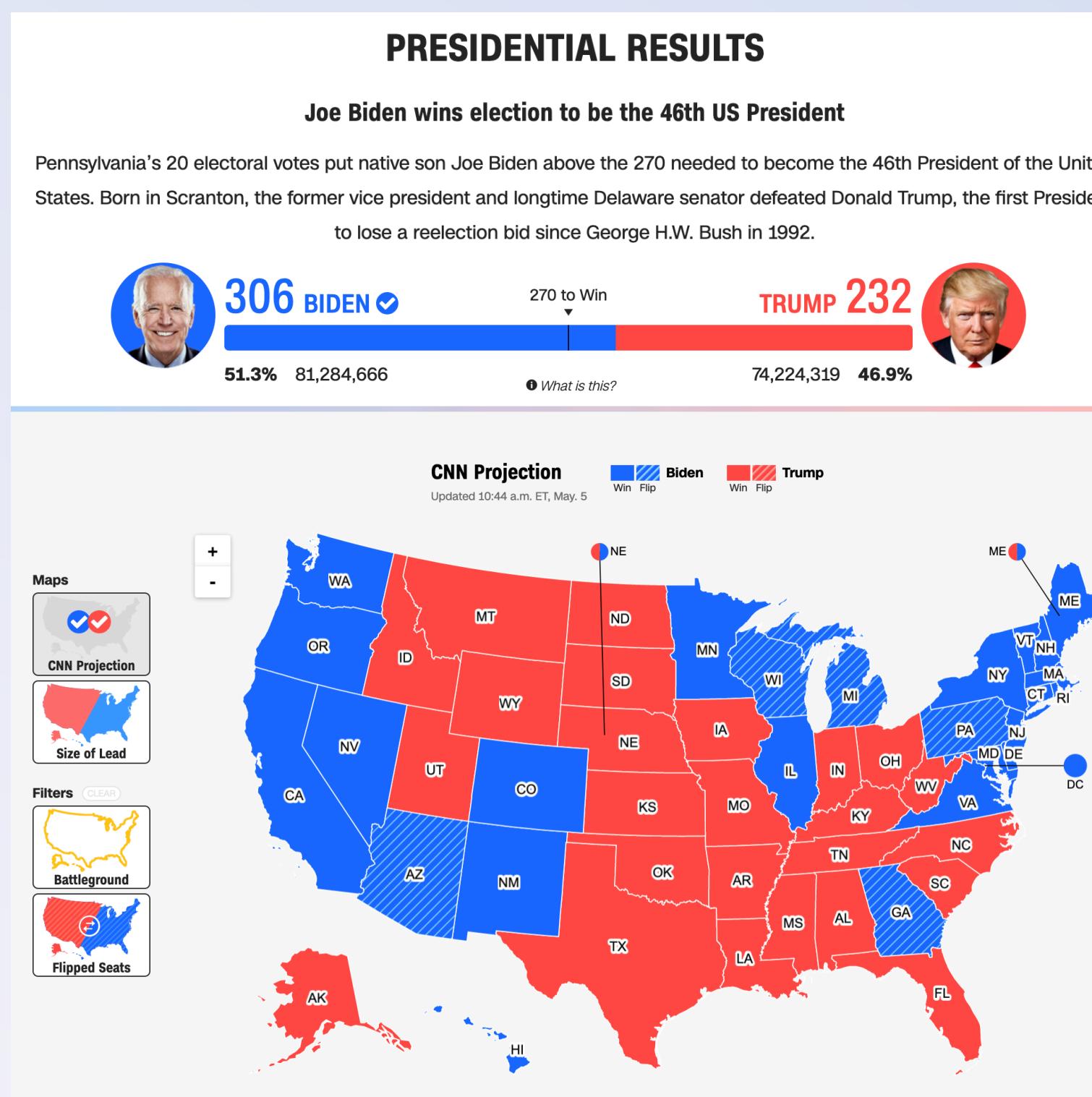
## Make informed decisions



Credit: [Reddit](#)

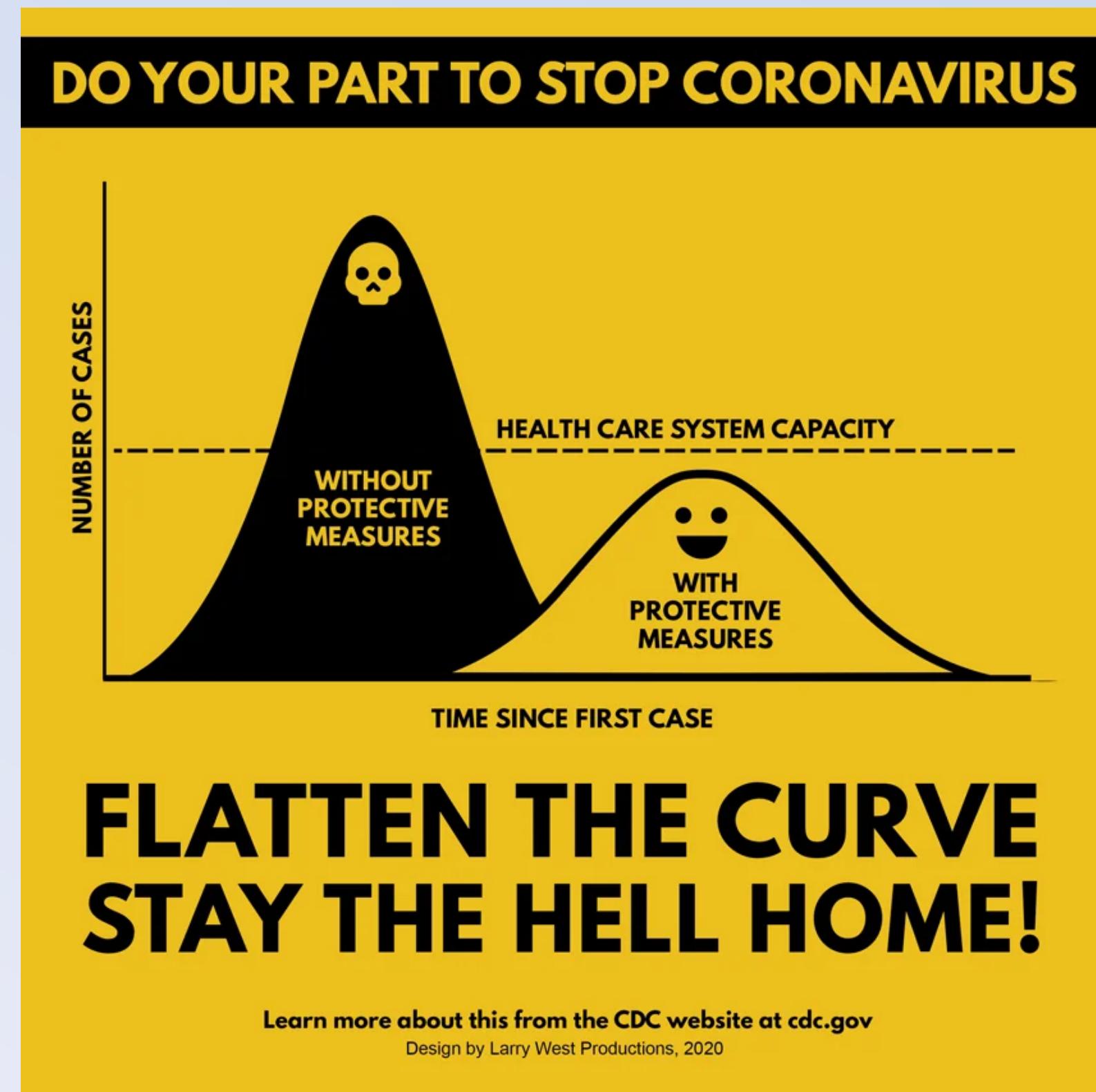
# People with disabilities deserve to:

Participate in politics



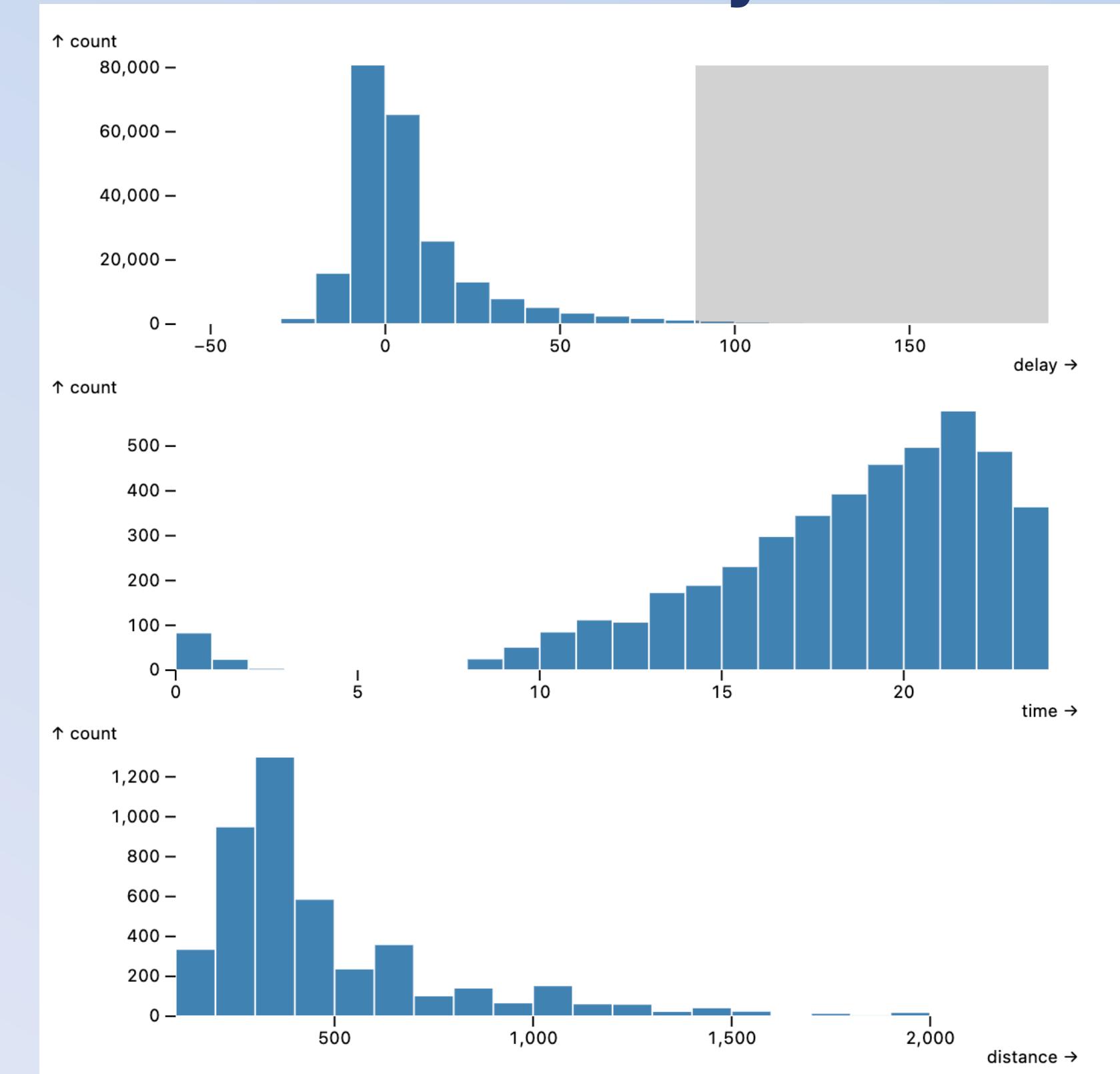
Credit: [CNN](#)

Make informed decisions



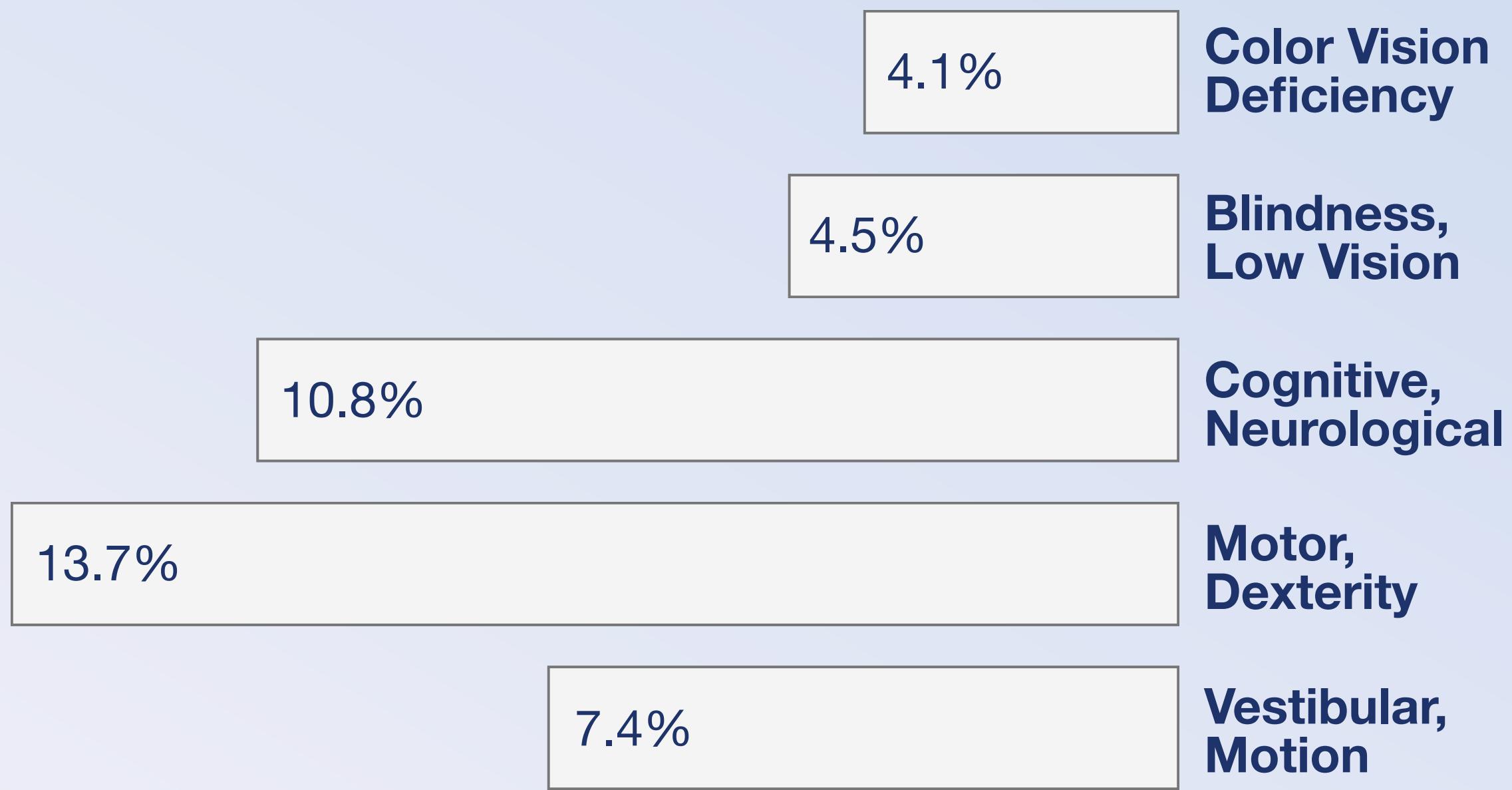
Credit: [Reddit](#)

Analyze data quickly and efficiently



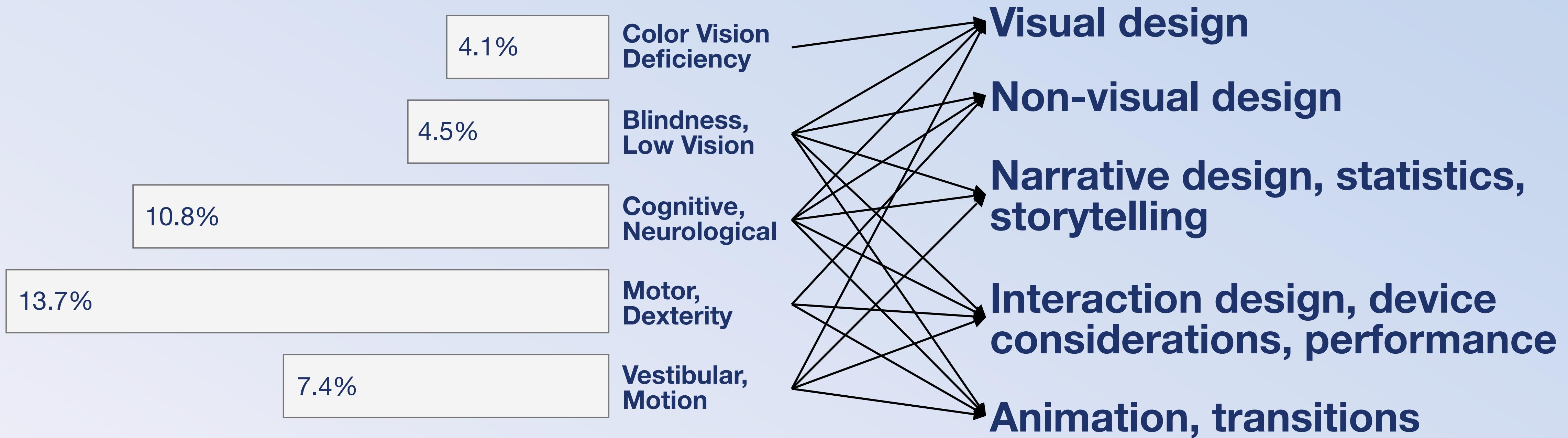
Credit: [Our research](#)

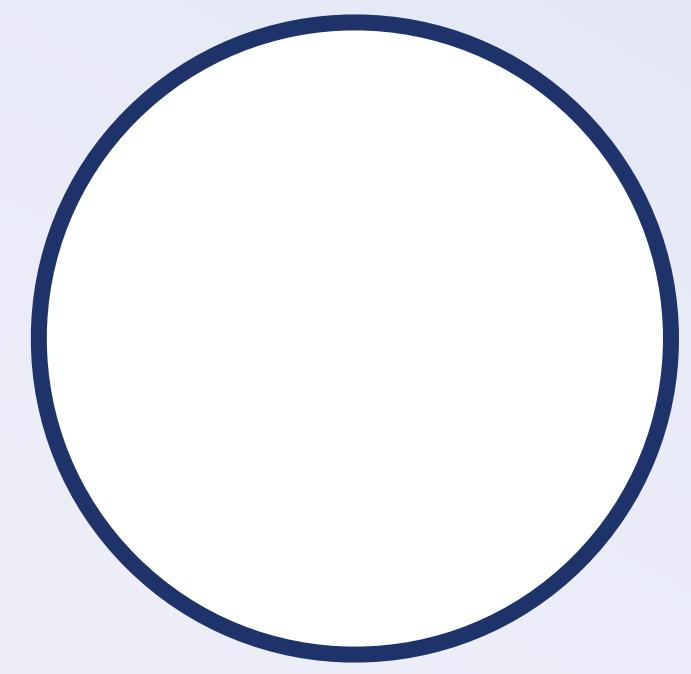
**~27% of people living in the United States self-report living with a disability that affects their daily life.**



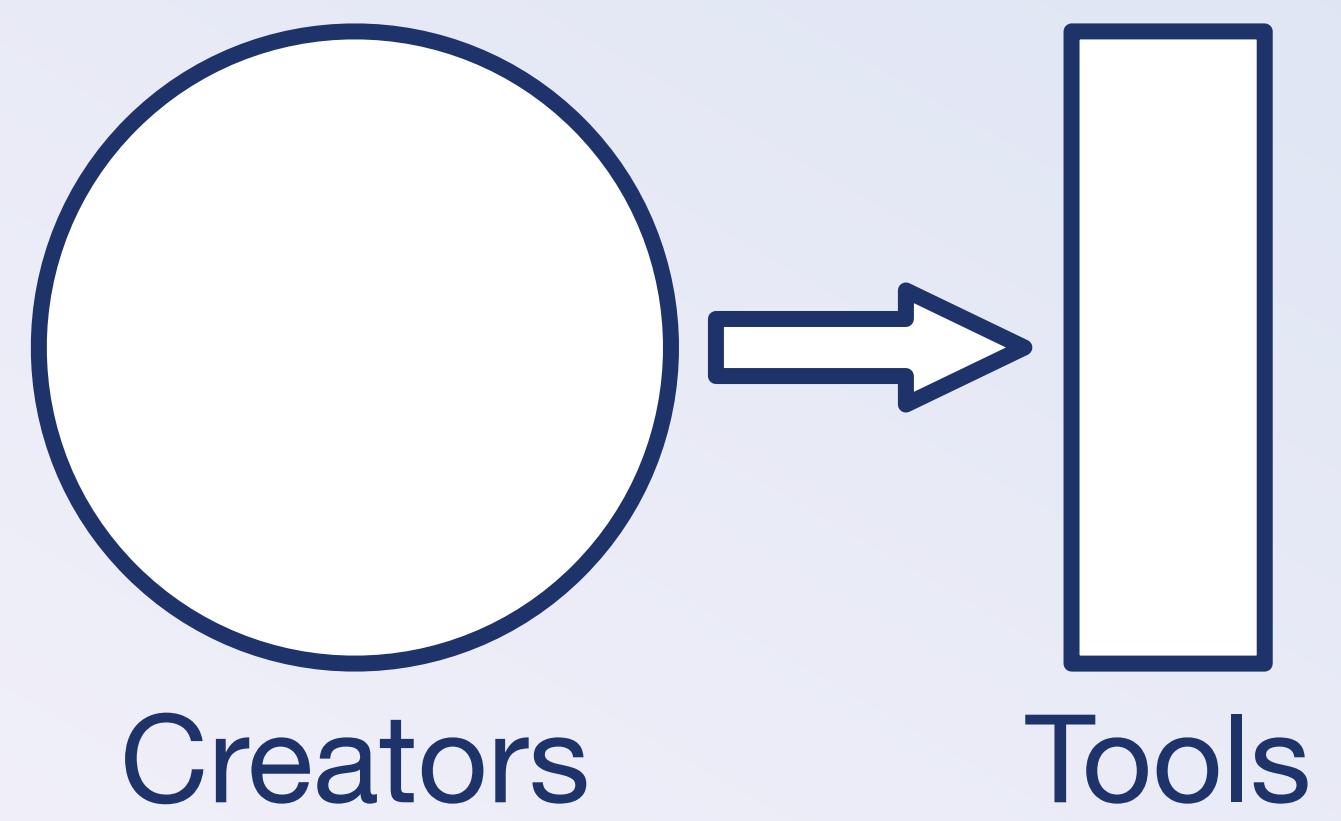
Source: Okoro et al. "Prevalence of Disabilities and Health Care Access by Disability Status and Type Among Adults"

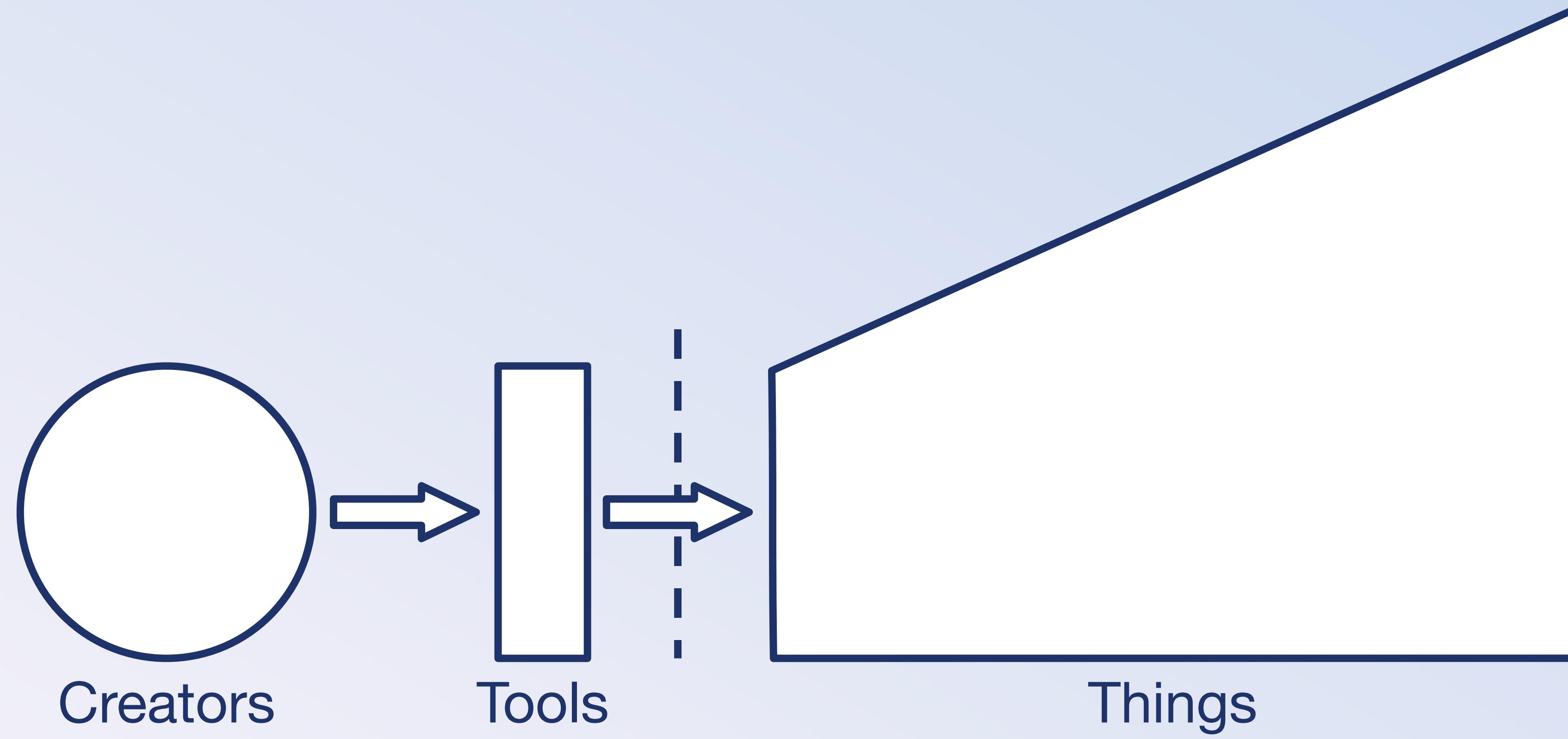
# Accessibility affects every aspect of visualization work

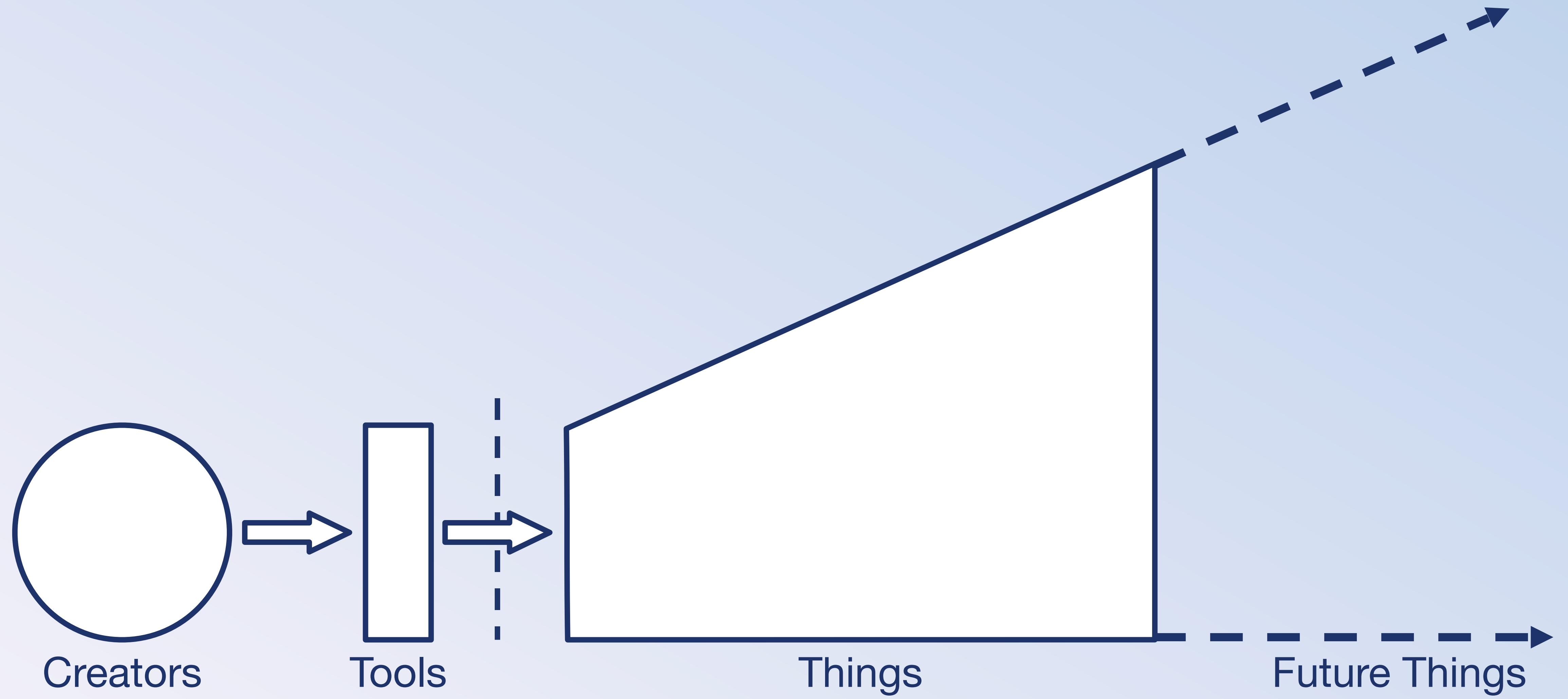




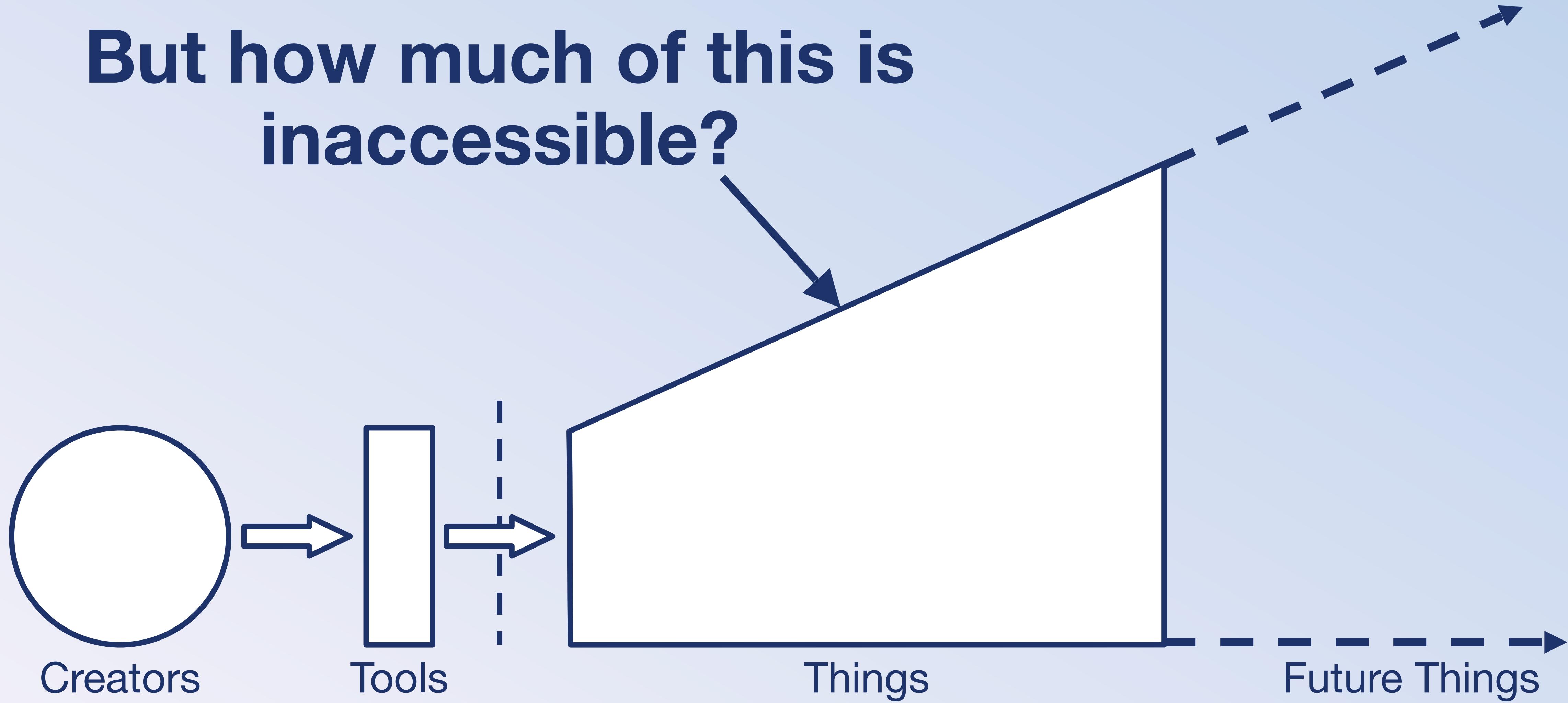
Creators







# But how much of this is inaccessible?



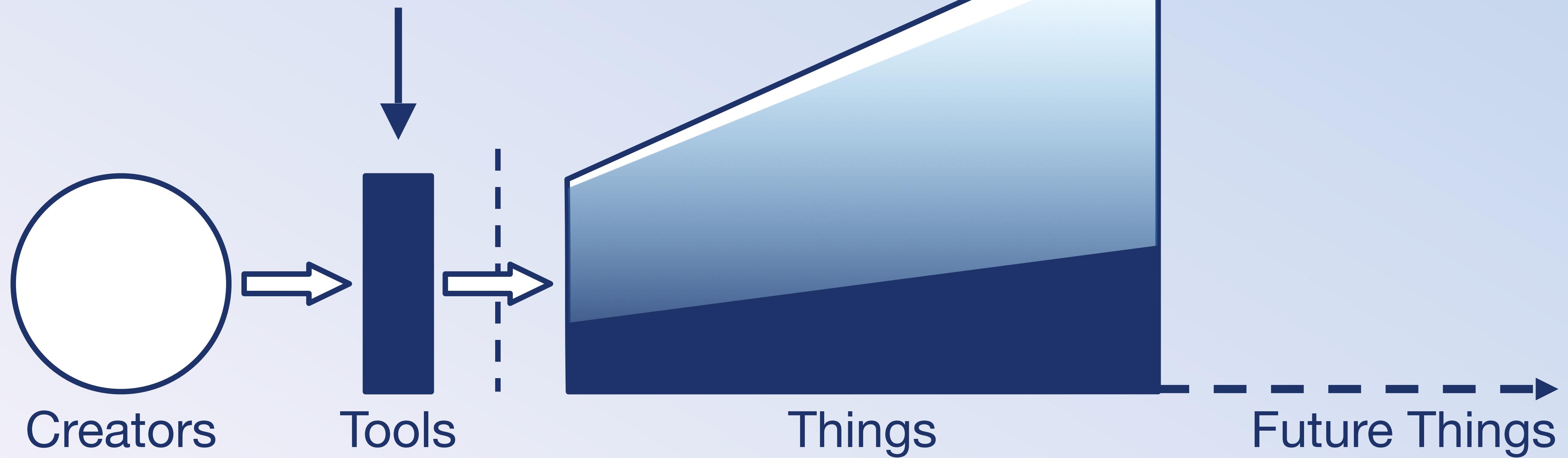
# 97-99%

Source: World Wide Web Consortium. "The WebAIM Million Report." 2019-2022



The builders and the makers (*that's us*) are responsible for access.

# Can better tools reduce inaccessibility?



# **What**

**(What is “disability?” What are the ways we should think about disability?)**

# Concept(s): social vs medical models of disability

a “curb”



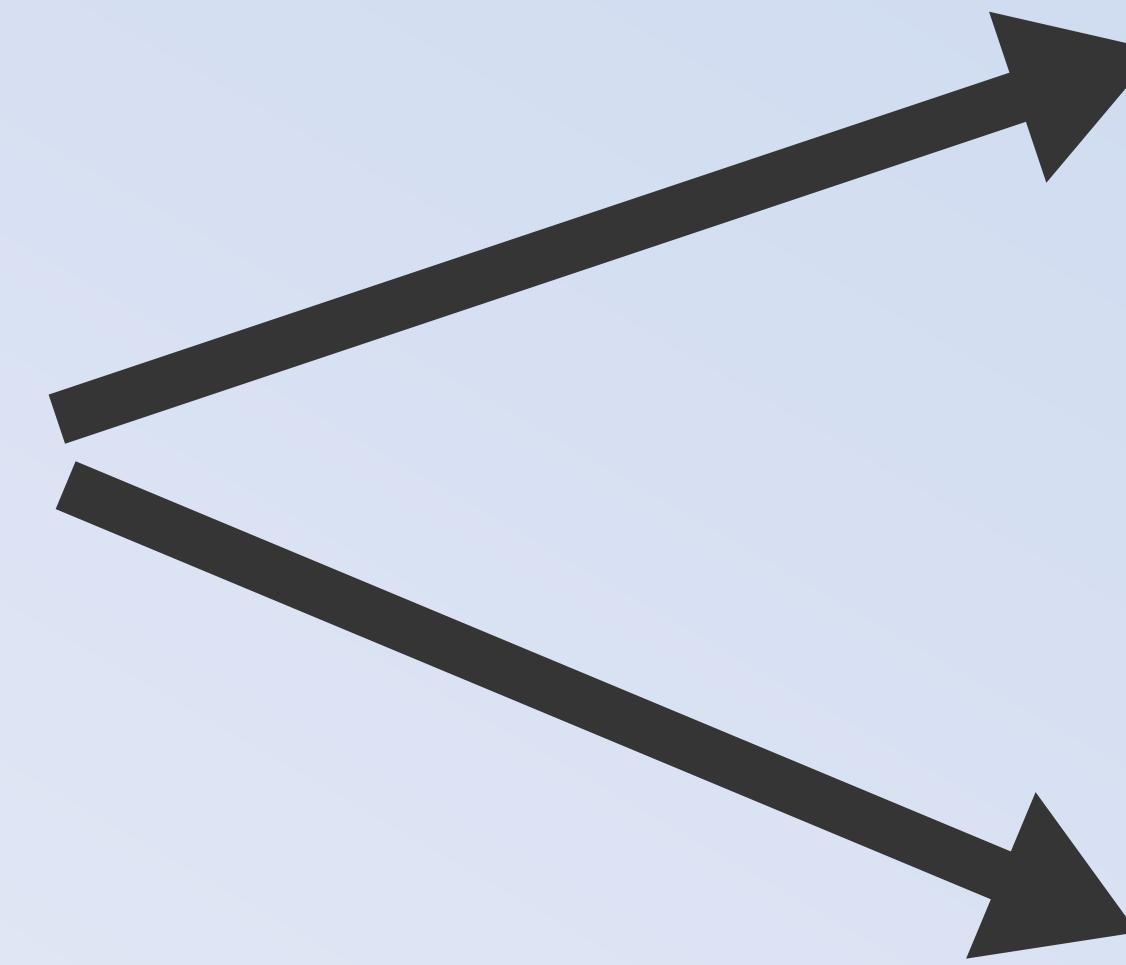
# What do we do about curbs in our cities?



# Medical model: the body is the cause of disability (according to normative standards).



# Medical model: augment or “cure” the body.



**Social model:** The *curb* is the source of disability (a “barrier” to access).



# Social model: Cut the curb and standardize.



# Concept: **Situational Impairment**

**Permanent**

---

**Touch**



**One arm**

---

**Permanent      Temporary**

---

**Touch**



**One arm**



**Arm injury**

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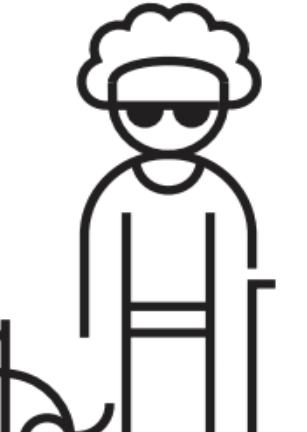
	<b>Permanent</b>	<b>Temporary</b>	<b>Situational</b>
<b>Touch</b>			
			
	<b>One arm</b>	<b>Arm injury</b>	<b>New parent</b>

We all experience situational impairment in our daily lives. **Accessibility benefits everyone!**

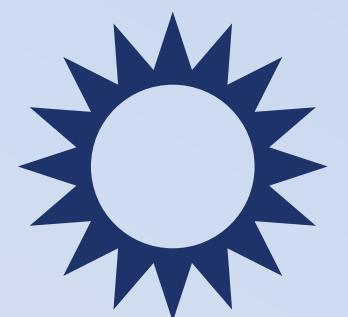
	Permanent	Temporary	Situational
<b>Touch</b>			
			
	One arm	Arm injury	New parent

# “Design for One, Extend to All”

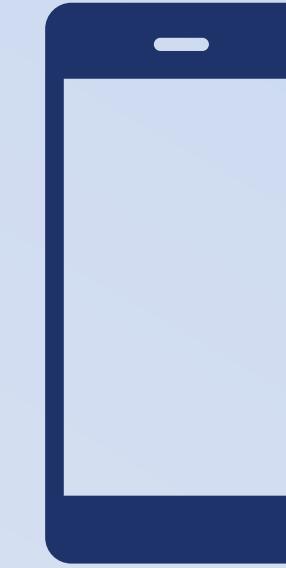
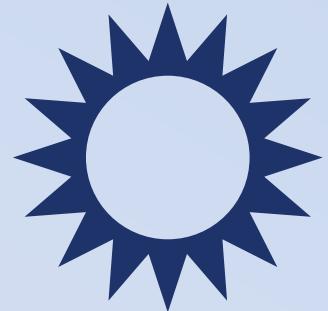
Microsoft’s Inclusive Design 101 Toolkit: [https://download.microsoft.com/download/b/0/d/b0d4bf87-09ce-4417-8f28-d60703d672ed/inclusive\\_toolkit\\_manual\\_final.pdf](https://download.microsoft.com/download/b/0/d/b0d4bf87-09ce-4417-8f28-d60703d672ed/inclusive_toolkit_manual_final.pdf)

	Permanent	Temporary	Situational
Touch			
	One arm	Arm injury	New parent
See			
	Blind	Cataract	Distracted driver
Hear			
	Deaf	Ear infection	Bartender
Speak			
	Non-verbal	Laryngitis	Heavy accent

**Consider:** an example where you face a barrier in some way and how accessible technology or infrastructure helps you.



**Consider:** an example where you face a barrier in some way and how accessible technology or infrastructure helps you.



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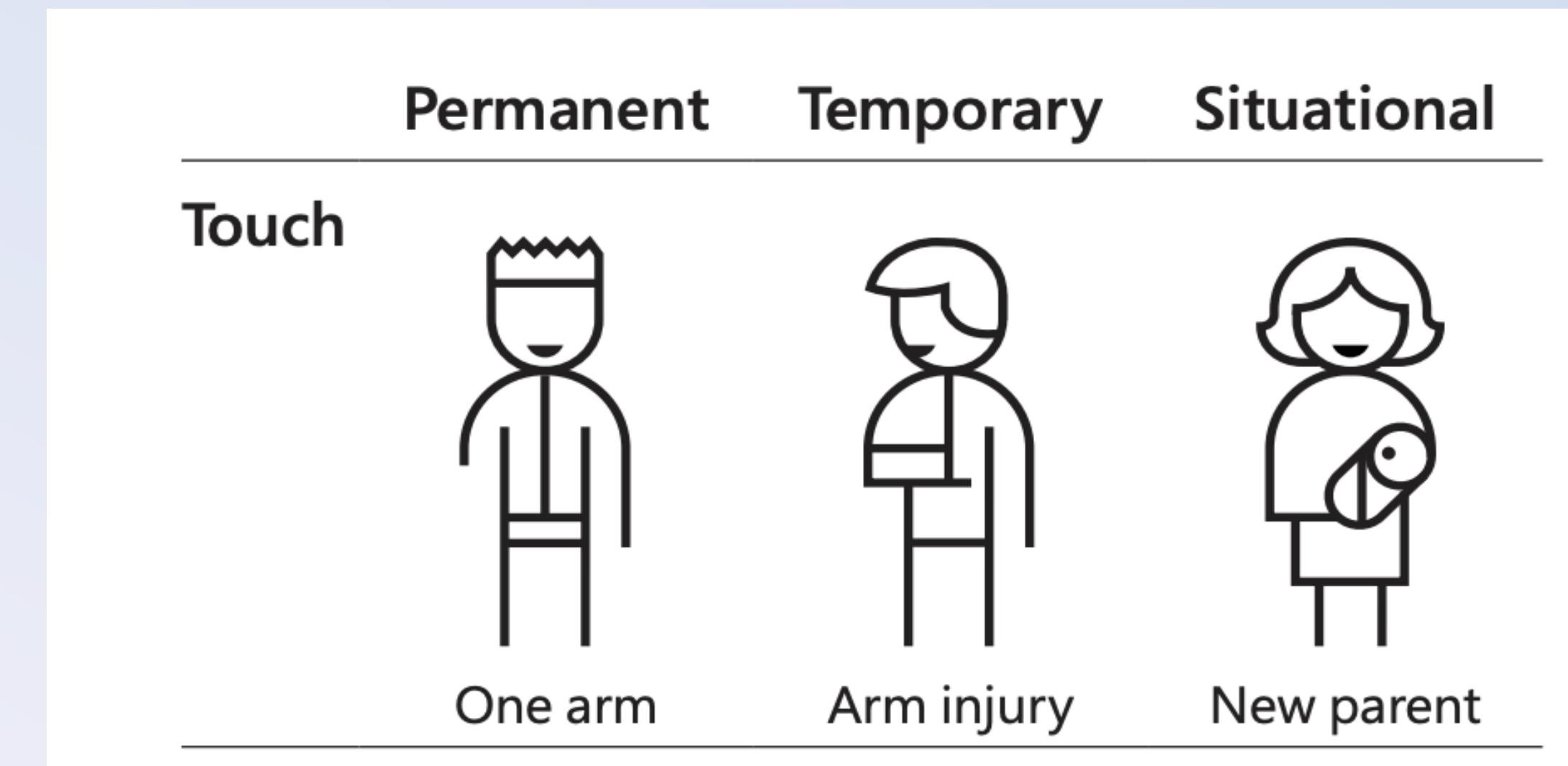
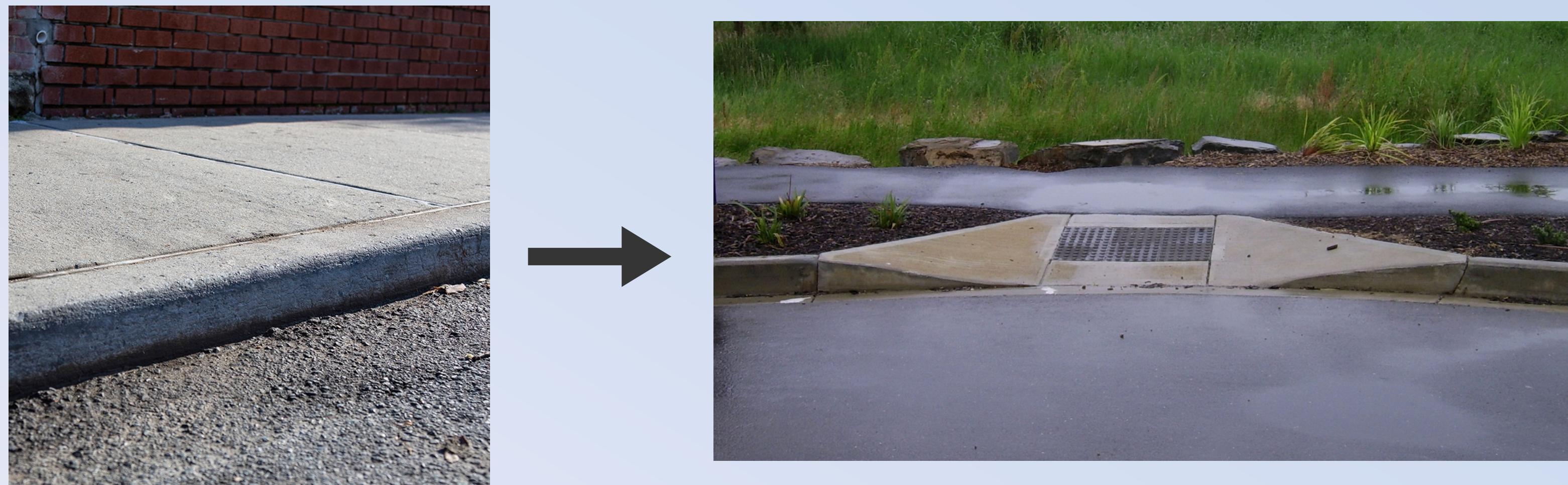
**Does “design for one, extend to all”  
have limits? Problems?**

# Final Concept: Disability-Centered Design

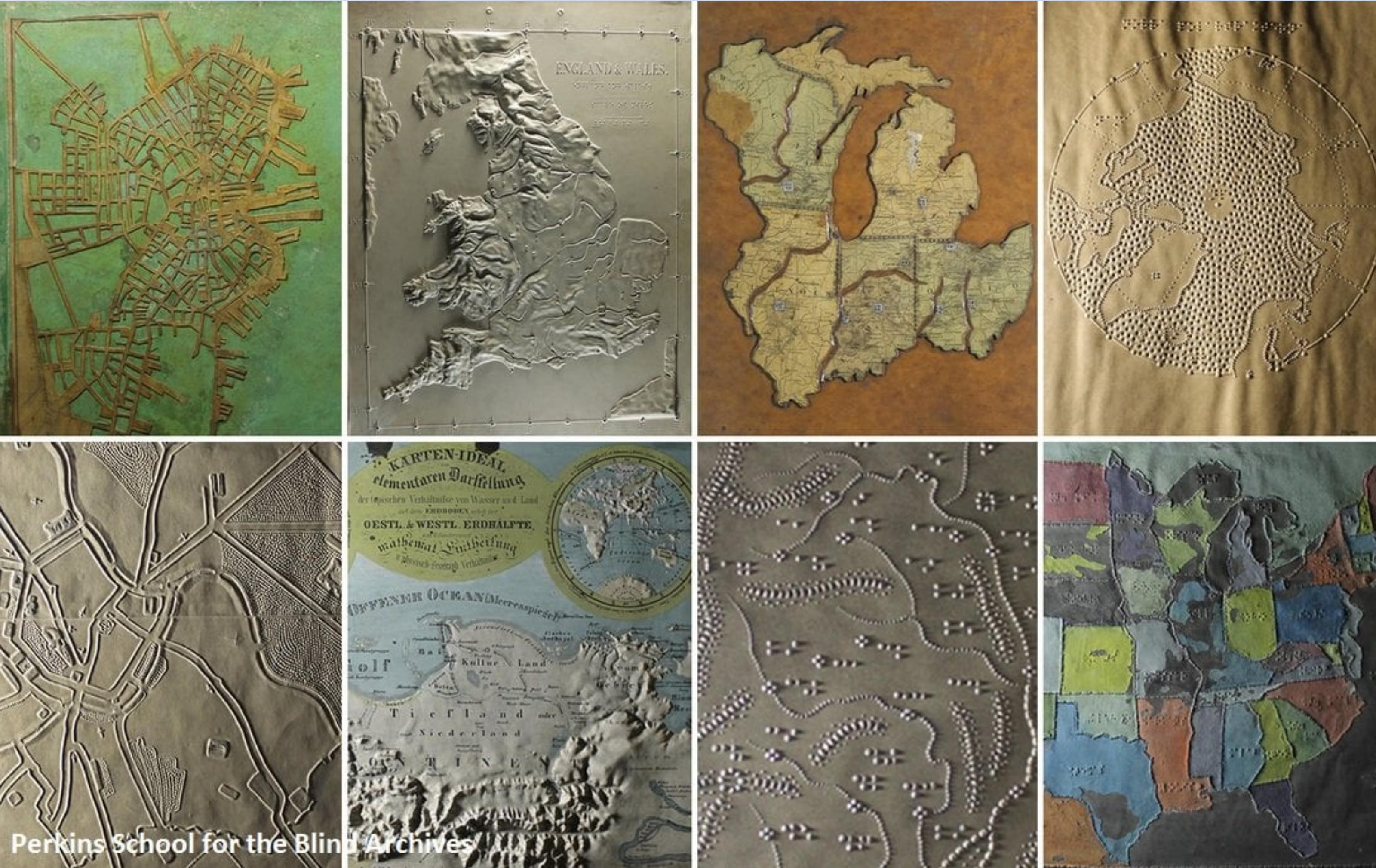
**“Nothing about us  
without us”**  
And the 1977 504 sit-in.



# In practice, “curb cut” work has been *prioritized*

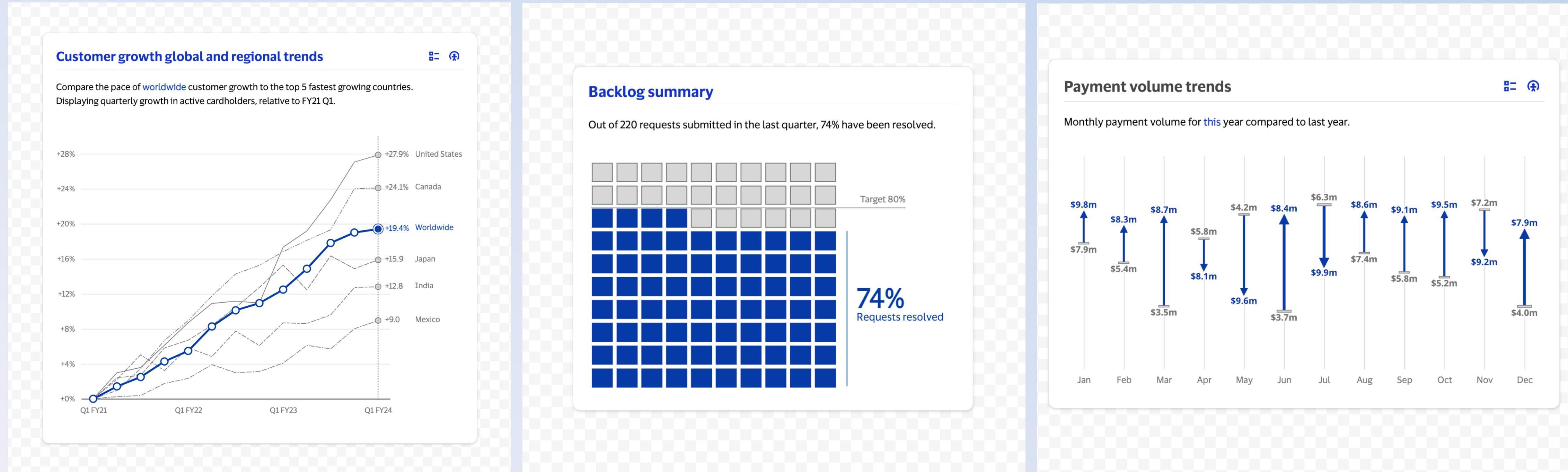


# The best work centers on people with disabilities



Perkins School for the Blind Archives, with tactile maps dating back to the early 1800s

# Prior work: Staff-level engineer making a visualization library



# “Five 9s” of speed and scale

## Better for merchants



**2.97%**

### higher approval rate

Merchants leveraging the Visa Acceptance Platform saw 2.97% higher approval rate.<sup>1</sup>



**70bps**

### in lower fraud

Merchants leveraging the Visa Acceptance Platform saw 70 bps in lower fraud.<sup>1</sup>



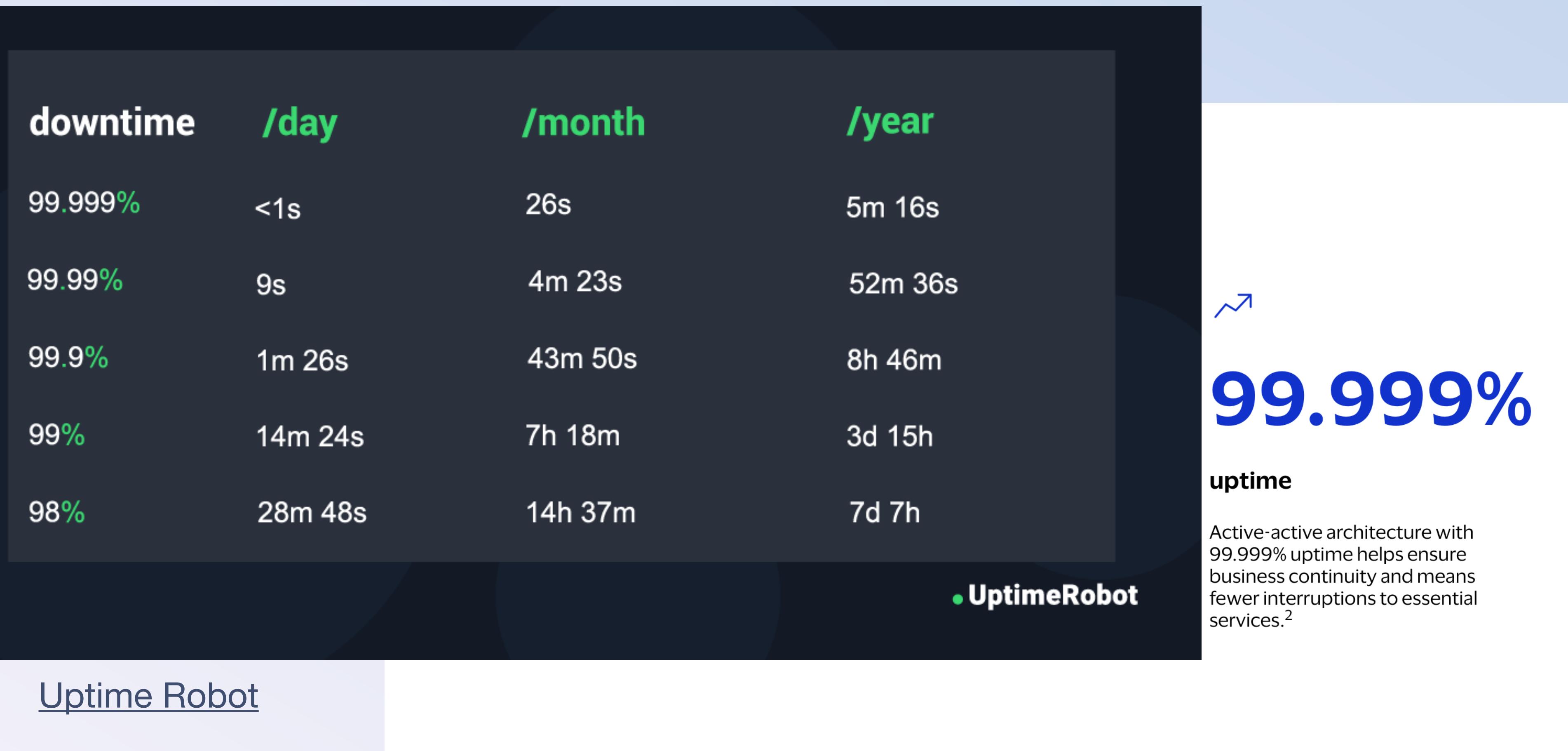
**99.999%**

### uptime

Active-active architecture with 99.999% uptime helps ensure business continuity and means fewer interruptions to essential services.<sup>2</sup>

Visa's Acceptance Platform Uptime

# “Five 9s” of speed and scale



Visa's Acceptance Platform Uptime

# “Five 9s” of speed and scale



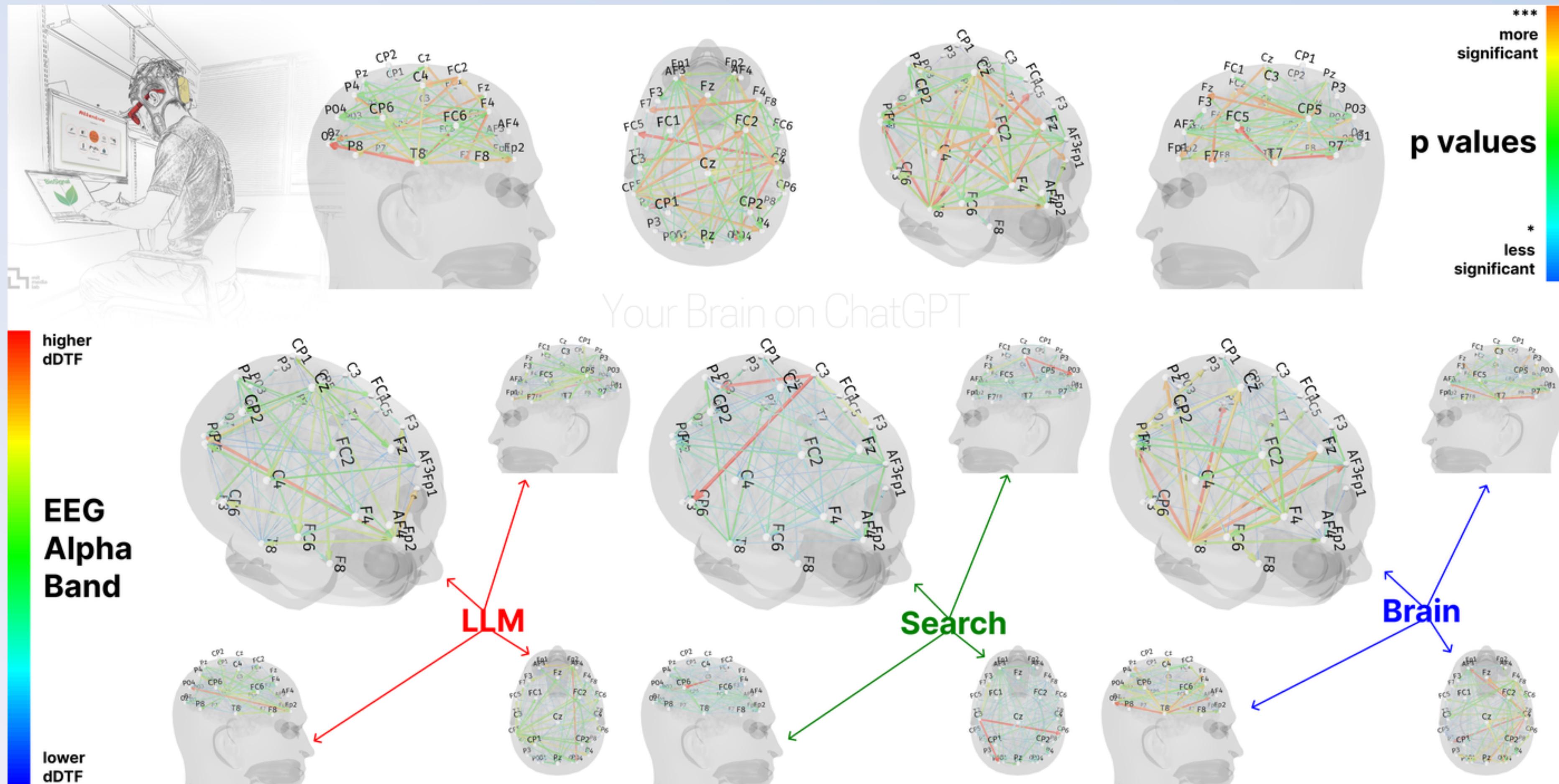
Visa's Acceptance Platform Uptime

**233b**

transactions/year  
Visa's 2024 Report

**One of my big gripes with any  
tech focused on speed?**

# Automation changes our brain



"Your Brain on ChatGPT: Accumulation of Cognitive Debt when Using an AI Assistant for Essay Writing Task"

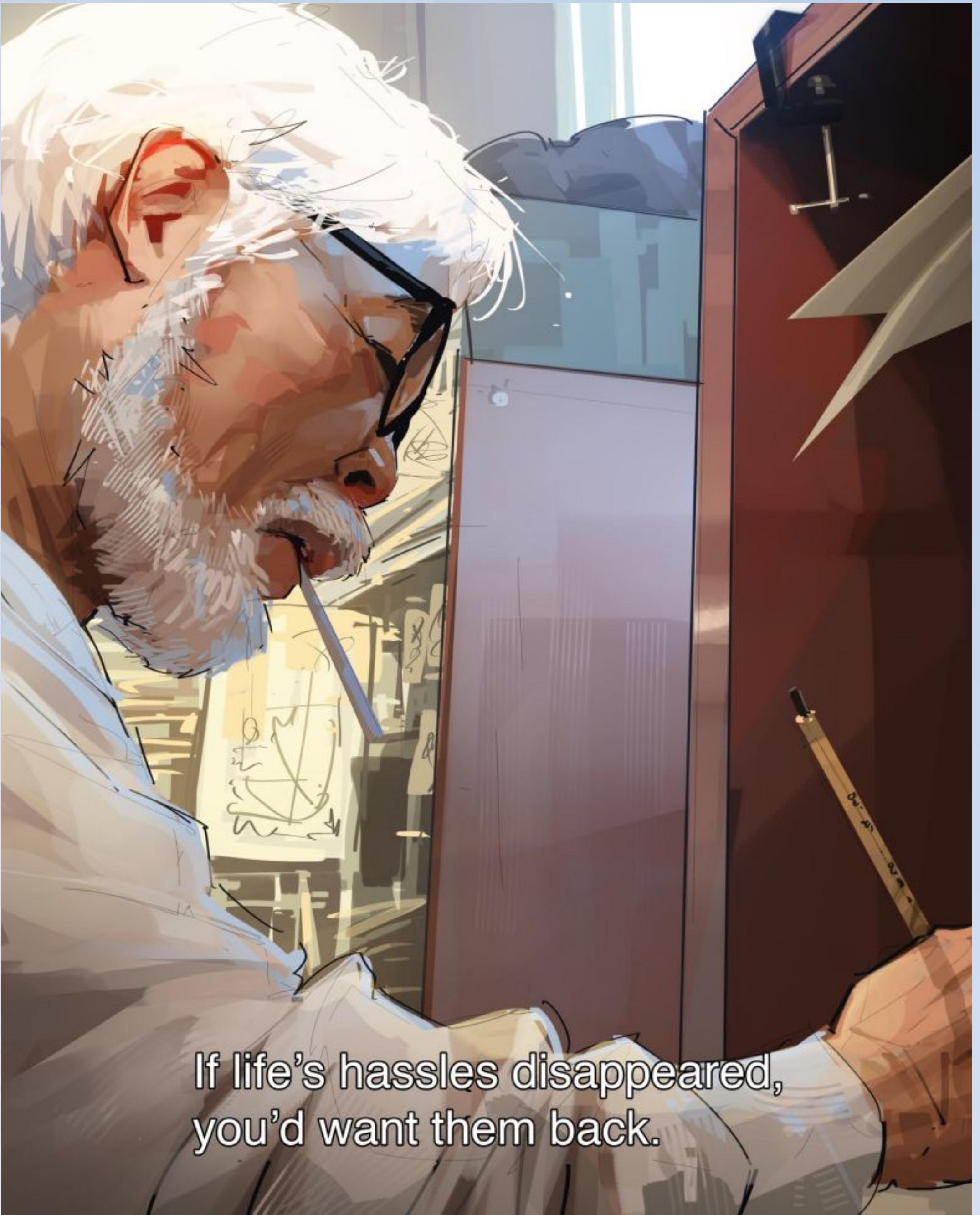
# Automatic accessibility validation

▶ bar-chart-1 has strong accessibility recommendations	<a href="#">bar-chart.entry.js:49478</a>
▼ bar-chart-2 has accessibility warnings and other messages	<a href="#">bar-chart.entry.js:49497</a>
⚠ ▶ longDescription: Either accessibility.longDescription or accessibility.contextExplanation is required	<a href="#">bar-chart.entry.js:49499</a>
⚠ ▶ executiveSummary: Either accessibility.purpose or accessibility.executiveSummary is required	<a href="#">bar-chart.entry.js:49499</a>
⚠ ▶ elementsAreInterface: elementsAreInterface must be a `boolean` type, but the final value was: `null`. If "null" is intended as an empty value be sure to mark the schema as `nullable()`	<a href="#">bar-chart.entry.js:49499</a>
longDescription: Either accessibility.longDescription or accessibility.contextExplanation should have minimum 40 characters and a combined length between 40 and 500 characters	<a href="#">bar-chart.entry.js:49481</a>
executiveSummary: Either accessibility.purpose or accessibility.executiveSummary should have minimum 40 characters and a combined length between 40 and 250 characters	<a href="#">bar-chart.entry.js:49481</a>
statisticalNotes: accessibility.statisticalNotes should have length between 40 and 250 characters	<a href="#">bar-chart.entry.js:49481</a>
structureNotes: accessibility.structureNotes should have length between 40 and 250 characters	<a href="#">bar-chart.entry.js:49481</a>

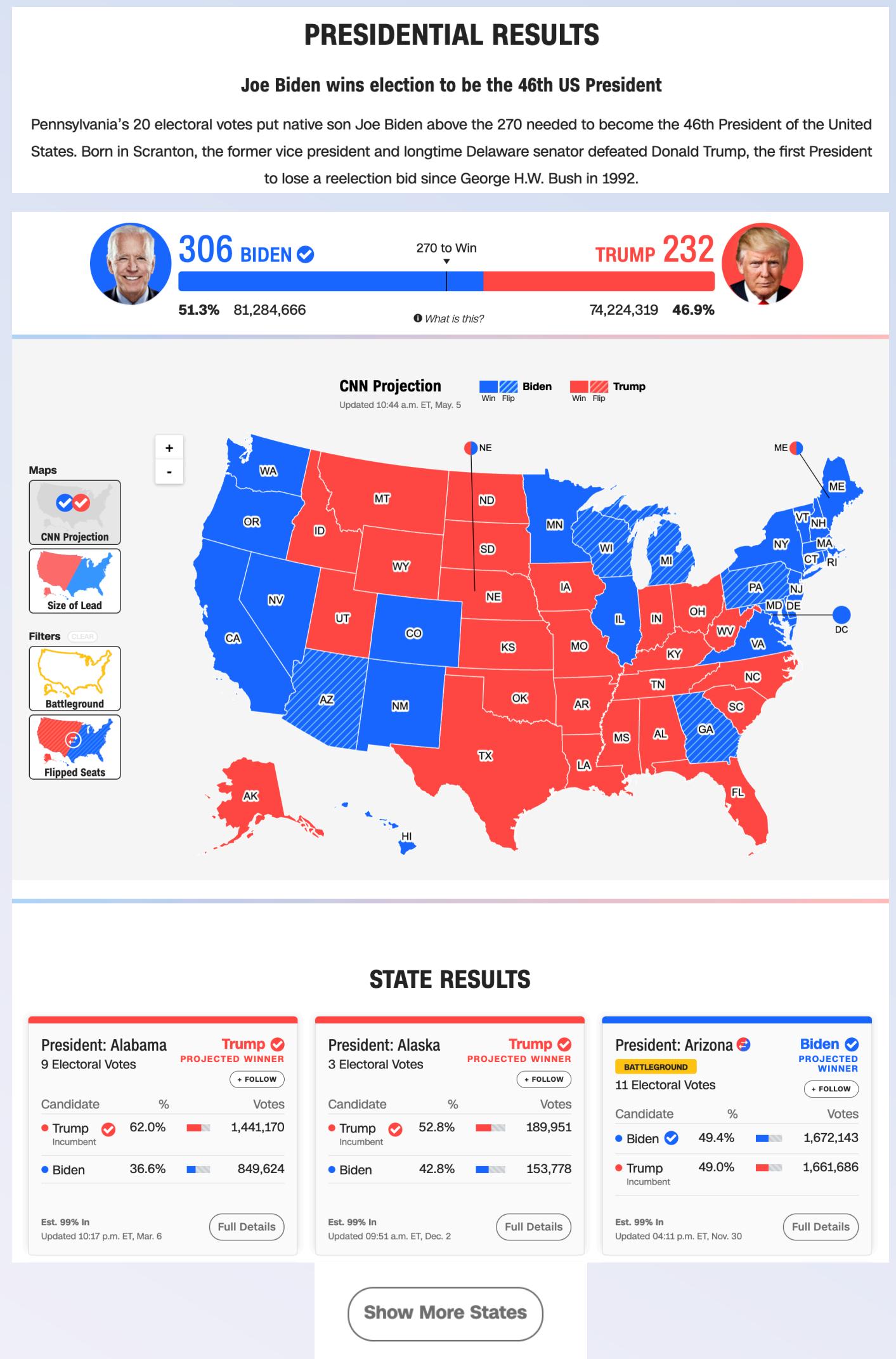
**“If life’s hassles  
disappeared, you’d  
want them back”**

- Hiyao Miyazaki

Art credit: [Sam Yang](#)

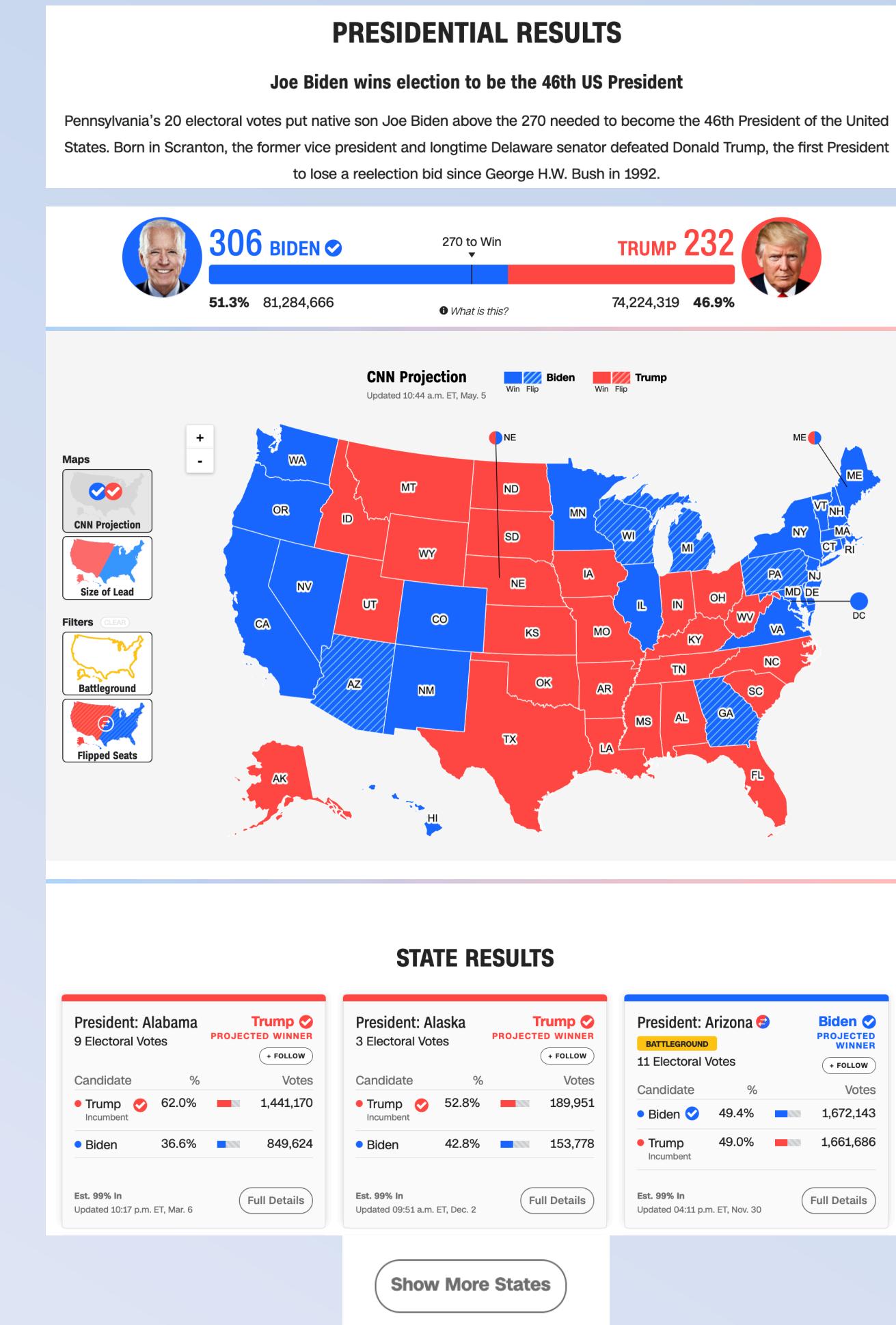


# How (Or, how to hassle yourself and expand your neurons for a good reason.)



# How do you find and evaluate access barriers in interactive visualizations?

# Chartability is a workbook of tests, tools, and principles

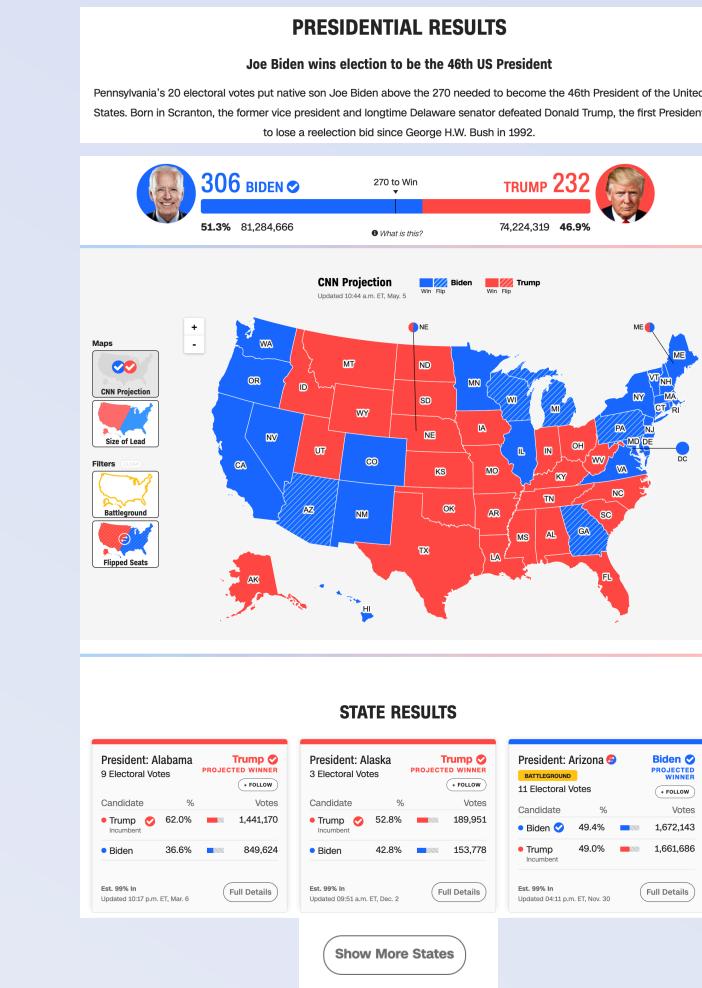
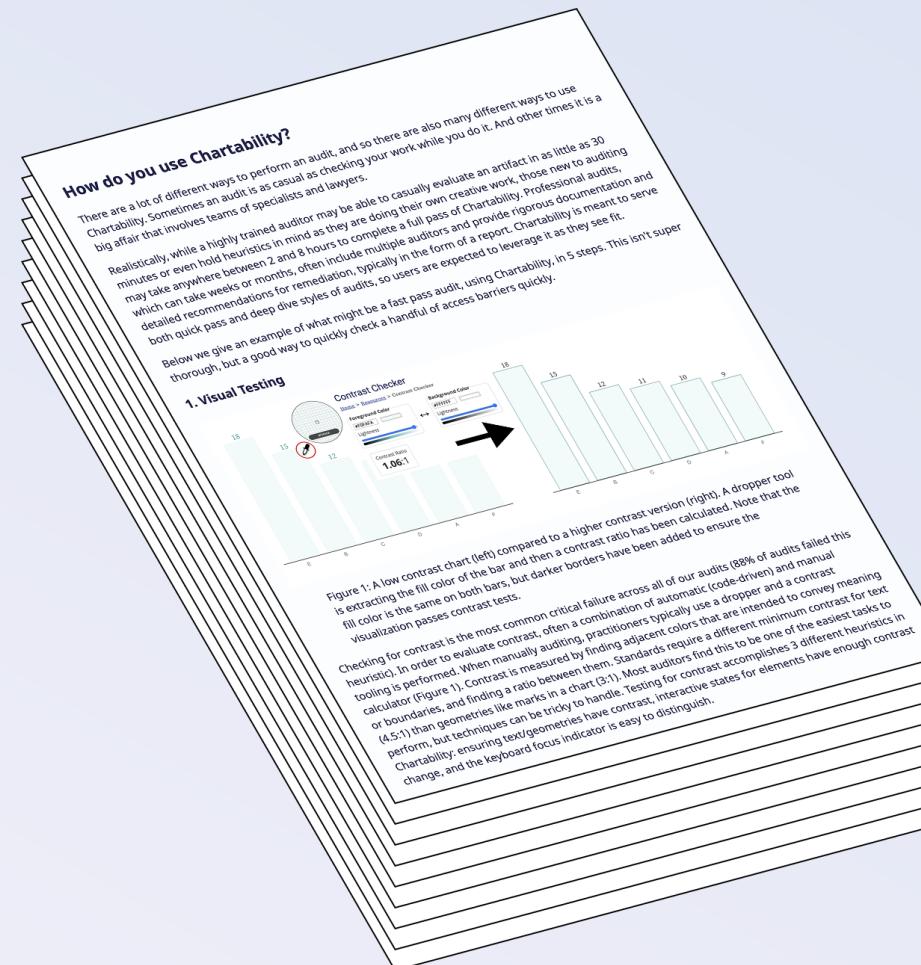


F. Elavsky, C. Bennett, and D. Moritz, “How accessible is my visualization? Evaluating visualization accessibility with Chartability,” Computer Graphics Forum, 2022.

# Chartability is a free, online resource

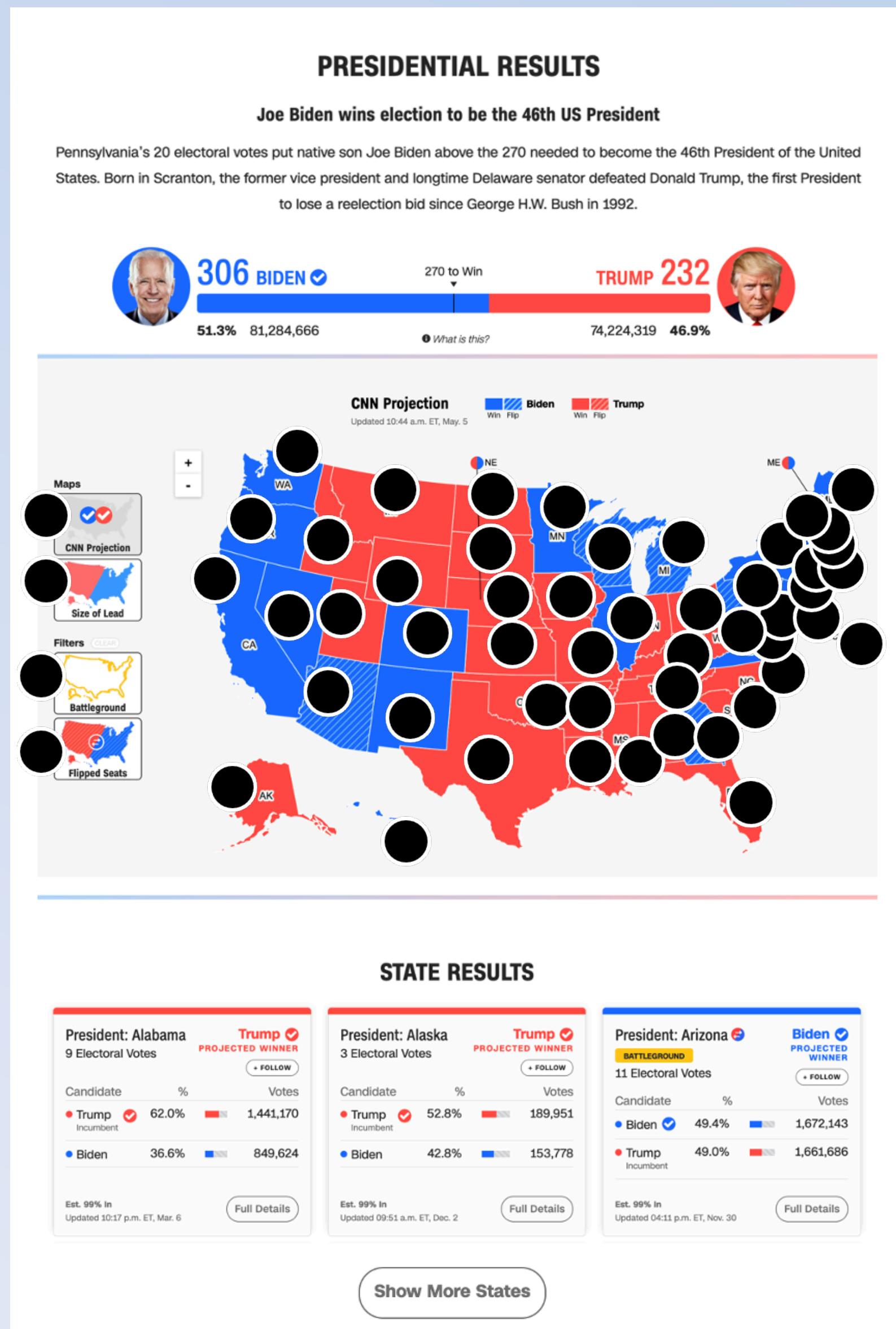
# chartability.github.io/

# workbook



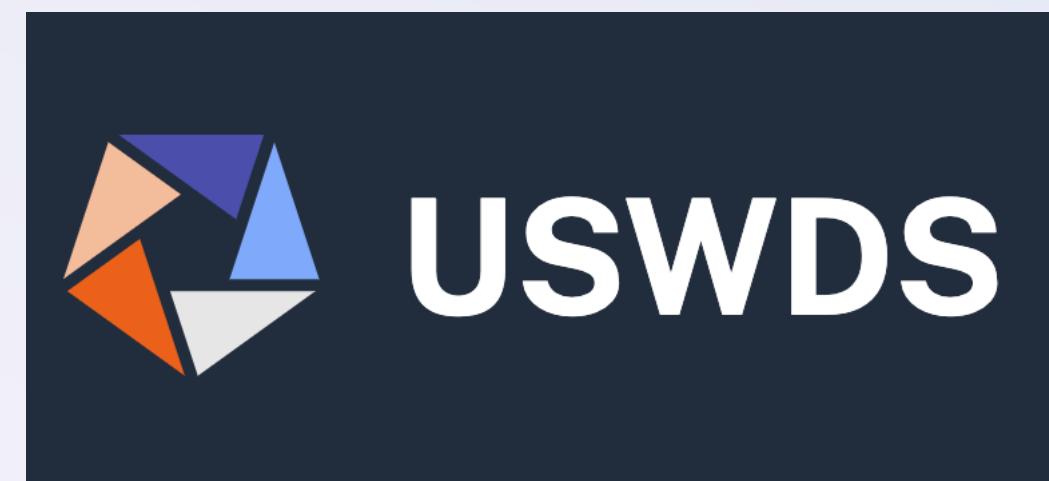
# 978 access barriers

Found in about an hour.



# Chartability is used in:

**15+** Policy orgs and governments worldwide



**110+** Tech, news, and non-profit companies/orgs



**20+** Undergraduate and graduate courses

Carnegie Mellon University



UNIVERSITY *of* WASHINGTON



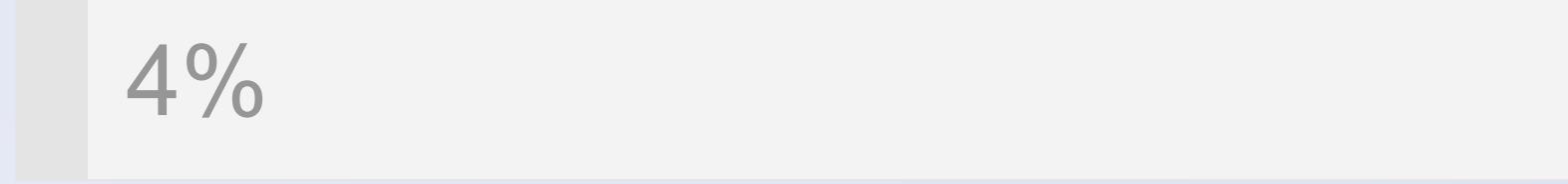
# Perceivable

Can someone perceive this in multiple ways? Is each way easy?

# Design with high contrast

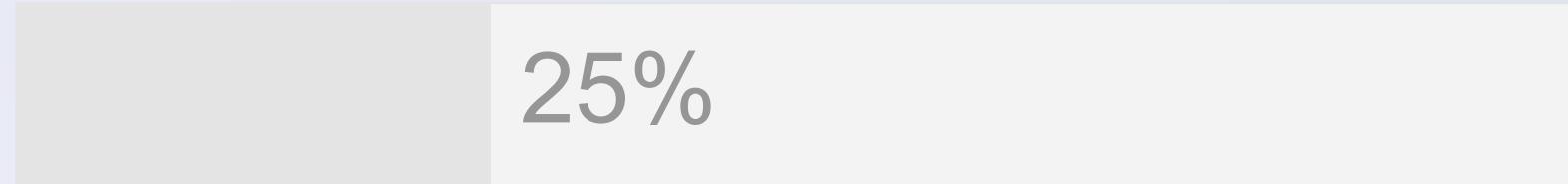
**Colorblindness Disproportionately Overrepresented in A11y Resources**

Colorblindness: % of People



4%

Low Vision: % of People



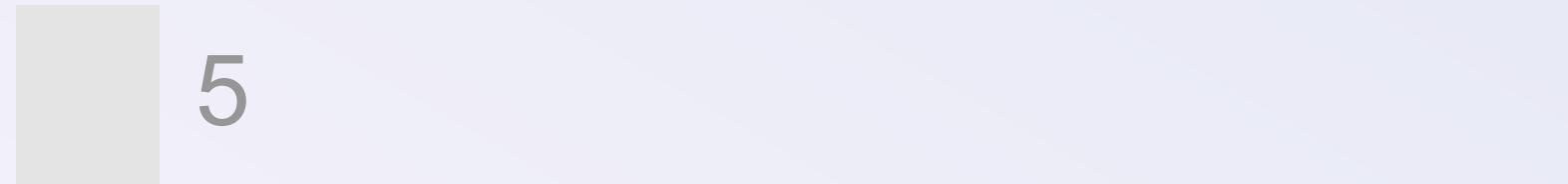
25%

Colorblindness: # of Resources



51

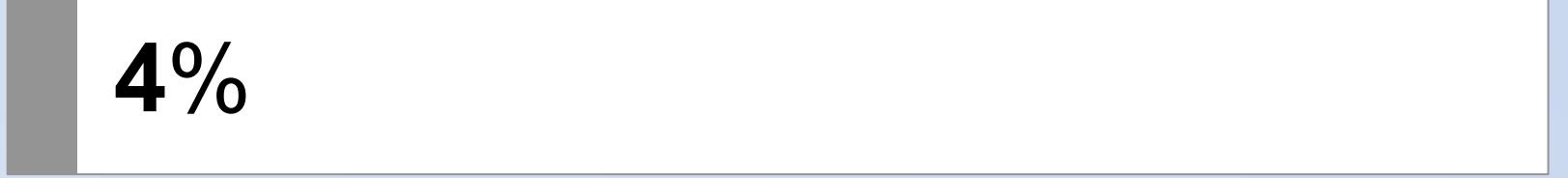
Low Vision: # of Resources



5

**Colorblindness Disproportionately Overrepresented in A11y Resources**

Colorblindness: % of People



4%

Low Vision: % of People



25%

Colorblindness: # of Resources



51

Low Vision: # of Resources



5

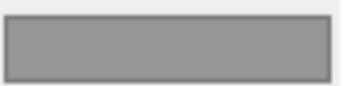
# Check your contrasts

Text needs at least 4.5:1 contrast against its background.

Large text and geometries must be 3:1 or higher.

## Contrast Checker

[Home](#) > [Resources](#) > Contrast Checker

Foreground Color  
#969696 

Lightness 

Background Color  
#FFFFFF 

Lightness 

Contrast Ratio  
**2.95:1**

[permalink](#)

### Normal Text

WCAG AA: **Fail**

WCAG AAA: **Fail**

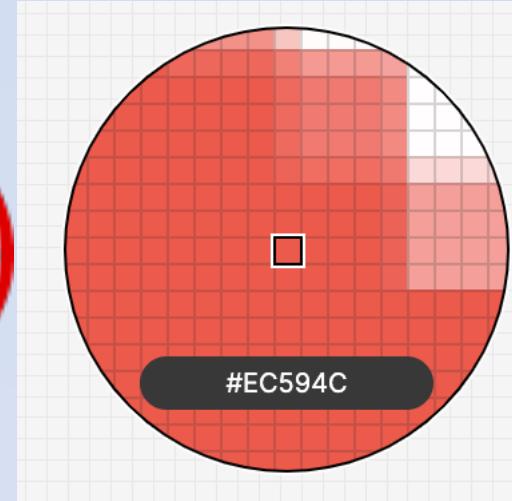
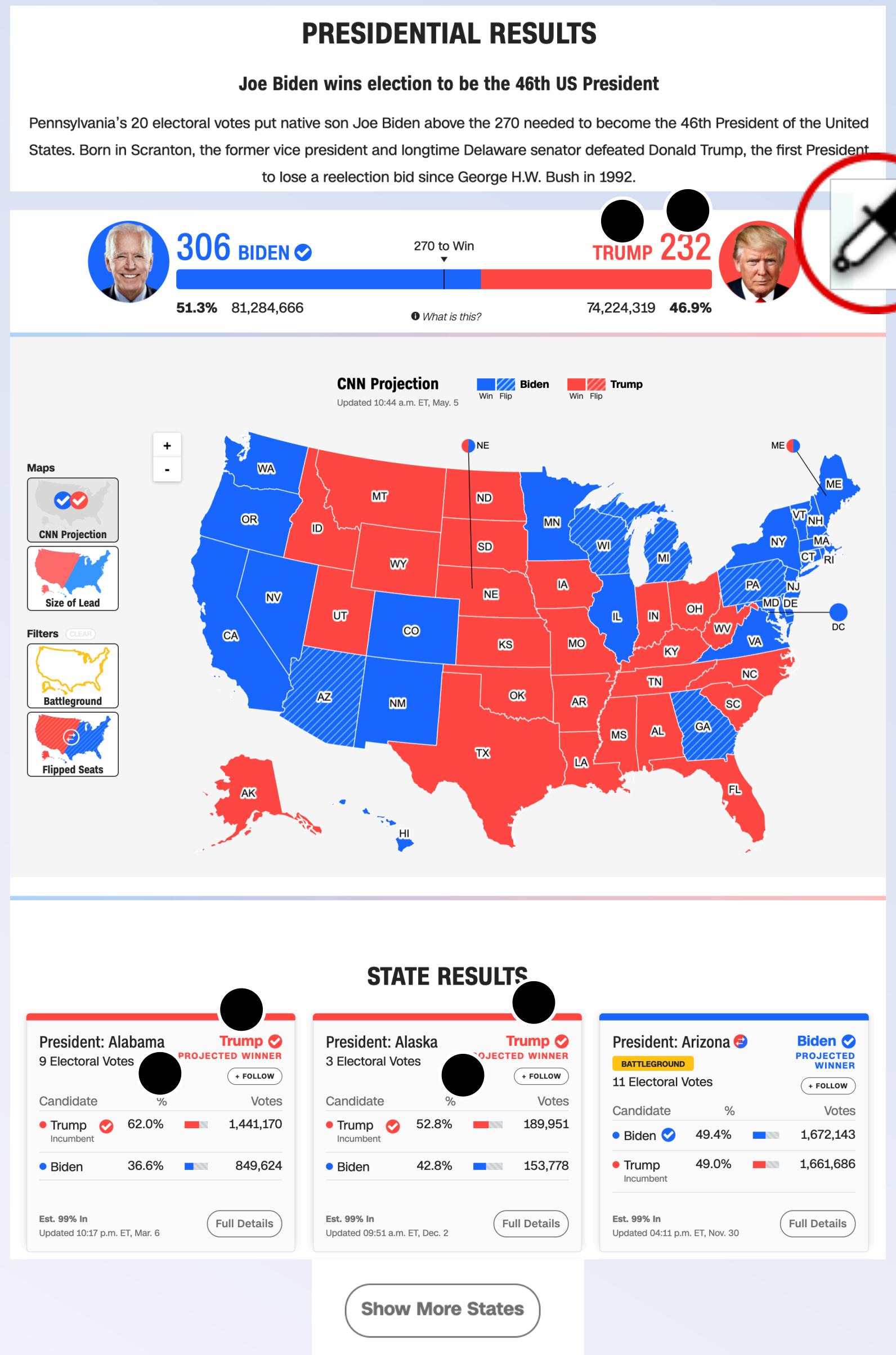
The five boxing wizards jump quickly.

### Large Text

WCAG AA: **Fail**

WCAG AAA: **Fail**

The five boxing wizards jump quickly.



# Contrast Checker

[Home](#) > [Resources](#) > Contrast Checker

## Foreground Color

#EC594C

Lightness



## Contrast Ratio

**3.44:1**

[permalink](#)

## Background Color

#FFFFFF

Lightness



## Normal Text

WCAG AA: **Fail**

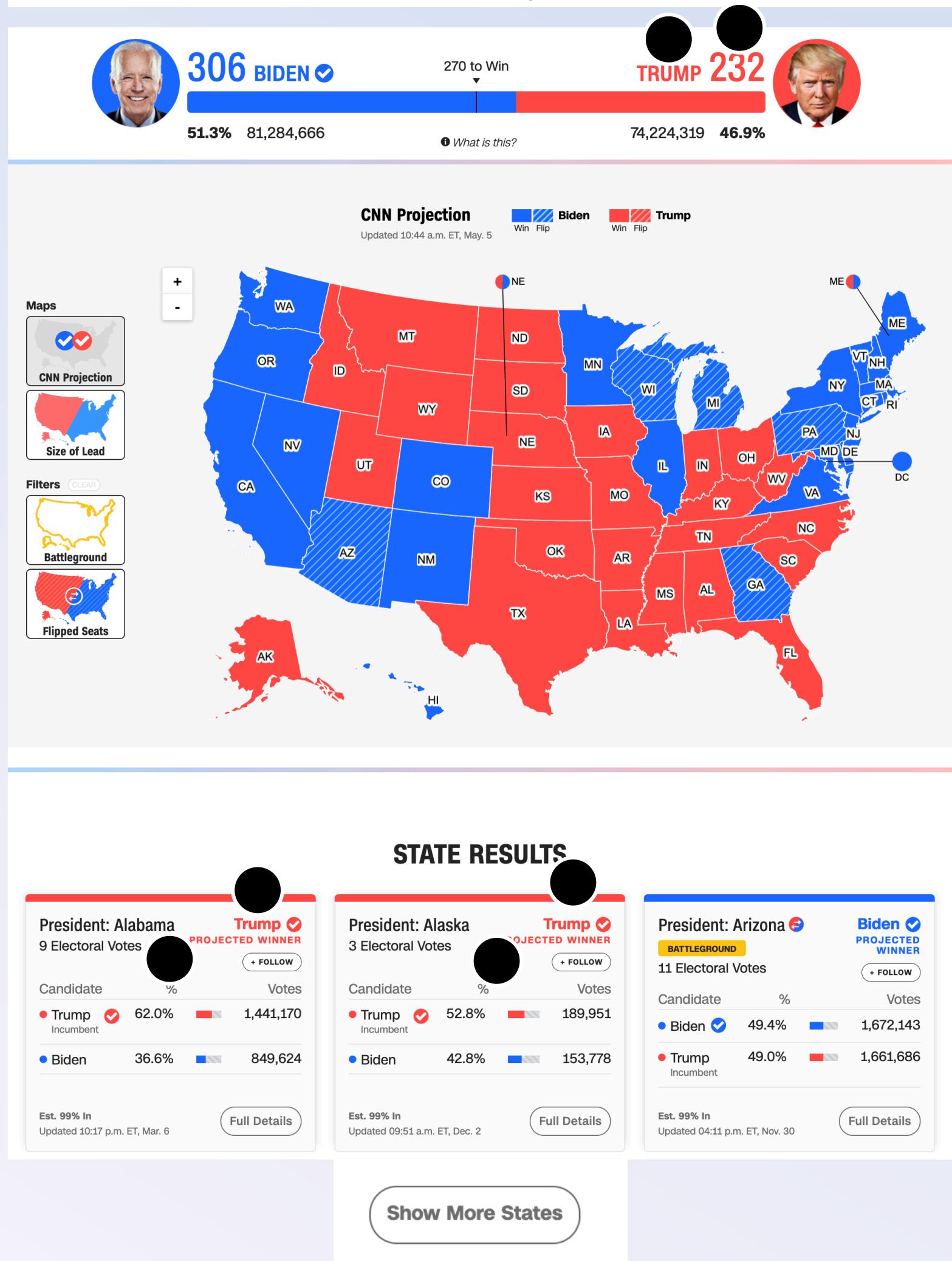
WCAG AAA: **Fail**

The five boxing wizards jump quickly.

## PRESIDENTIAL RESULTS

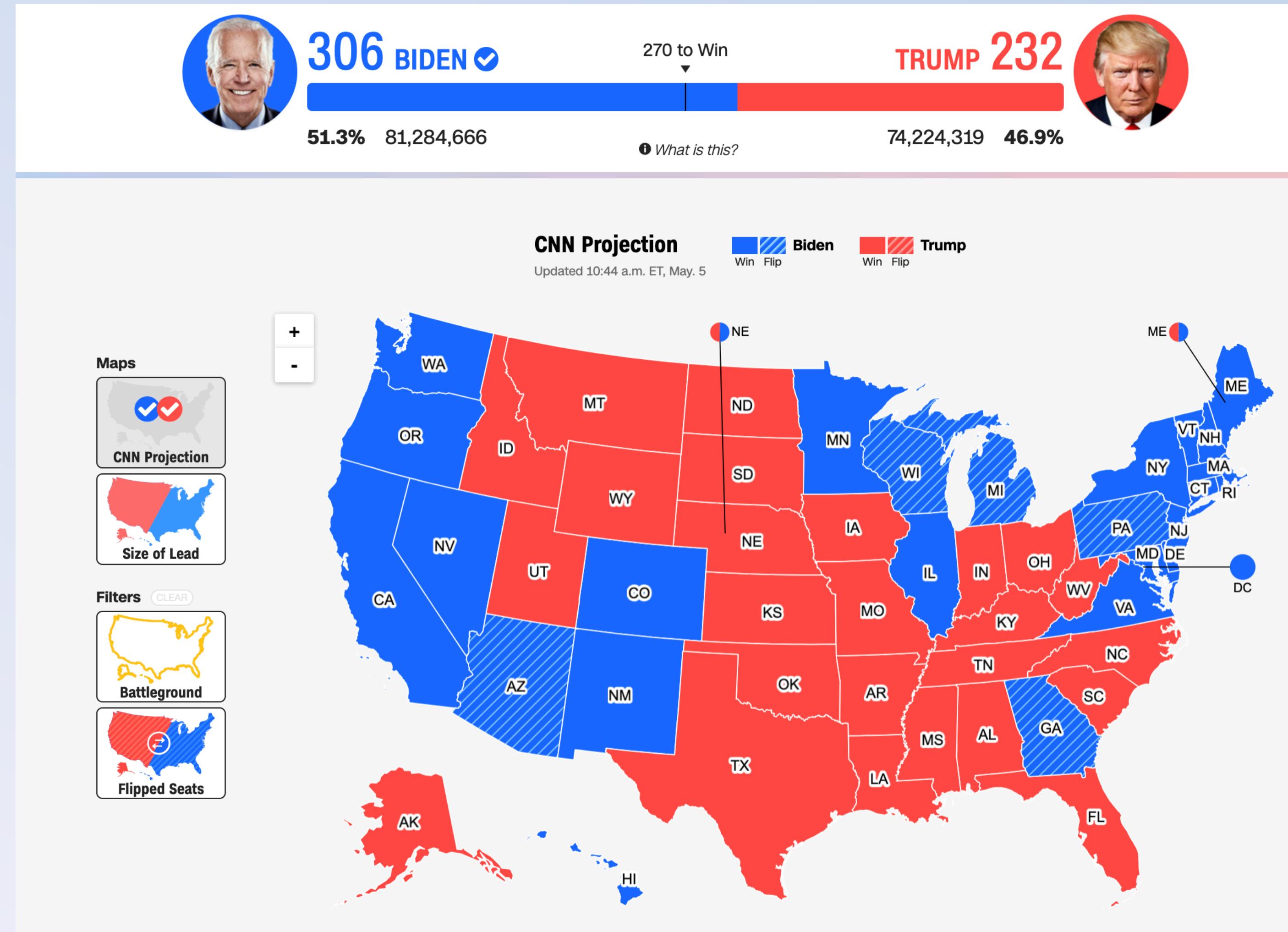
Joe Biden wins election to be the 46th US President

Pennsylvania's 20 electoral votes put native son Joe Biden above the 270 needed to become the 46th President of the United States. Born in Scranton, the former vice president and longtime Delaware senator defeated Donald Trump, the first President to lose a reelection bid since George H.W. Bush in 1992.

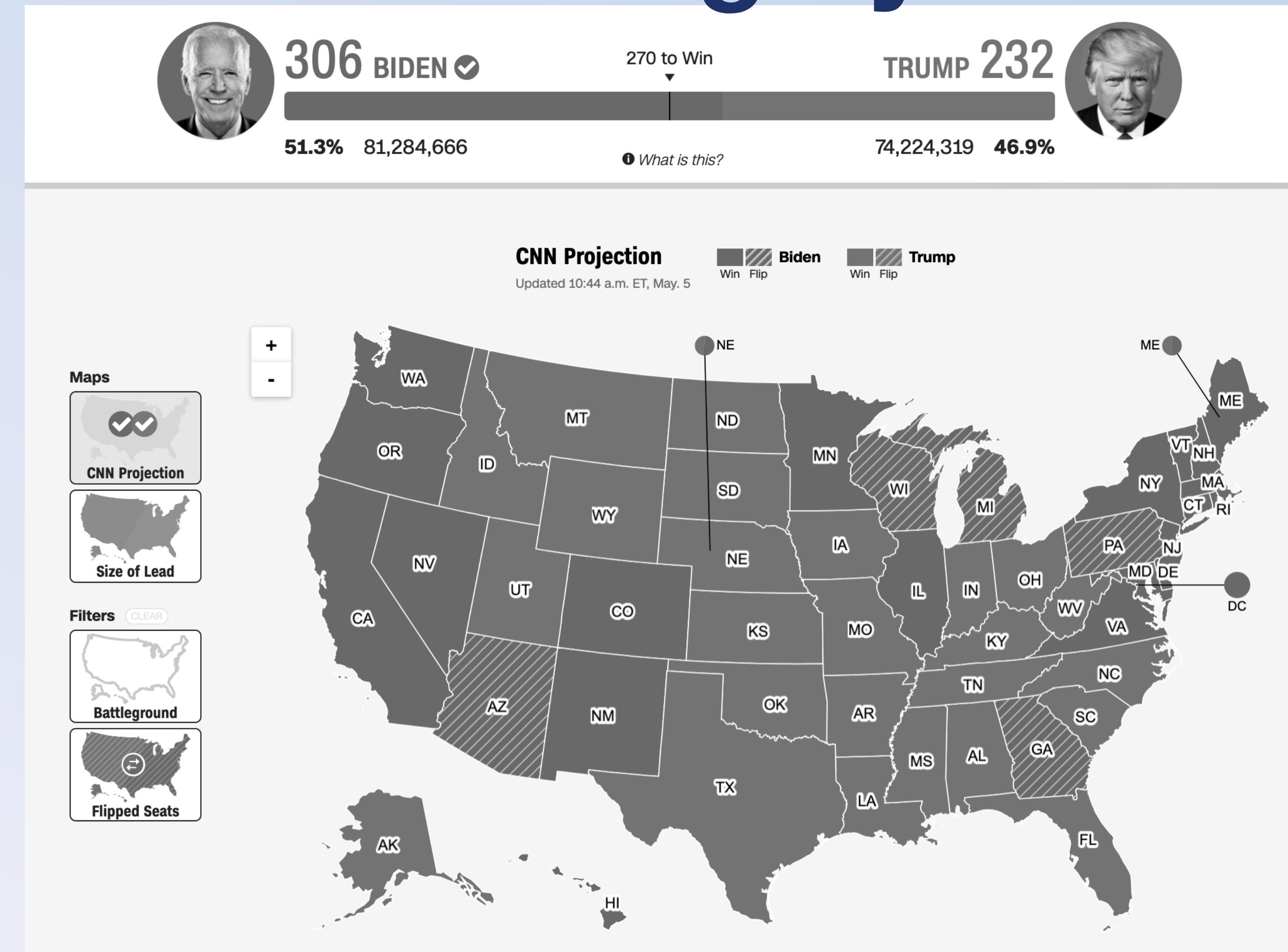


# 6 instances of low contrast

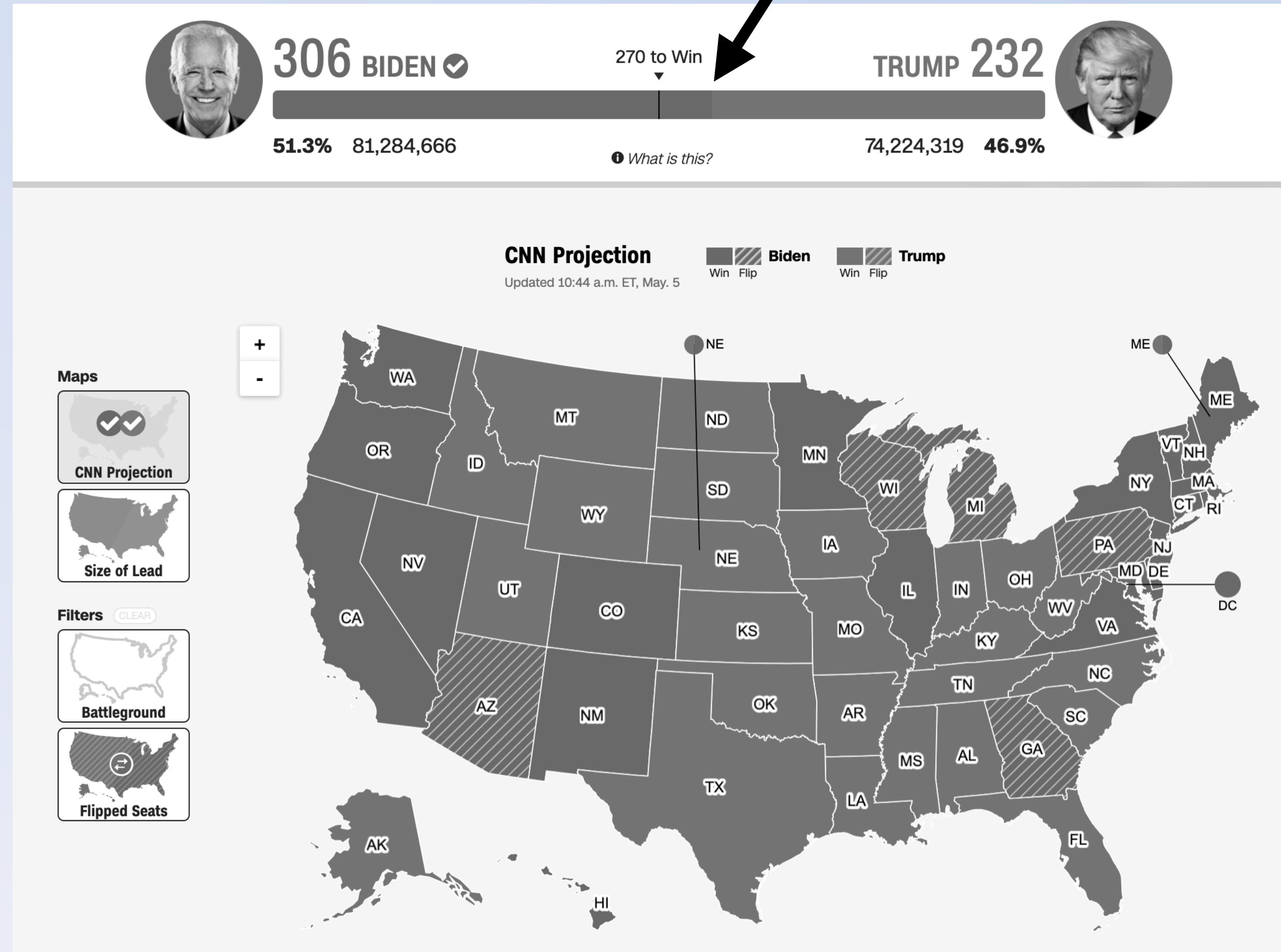
# How can we fix this?



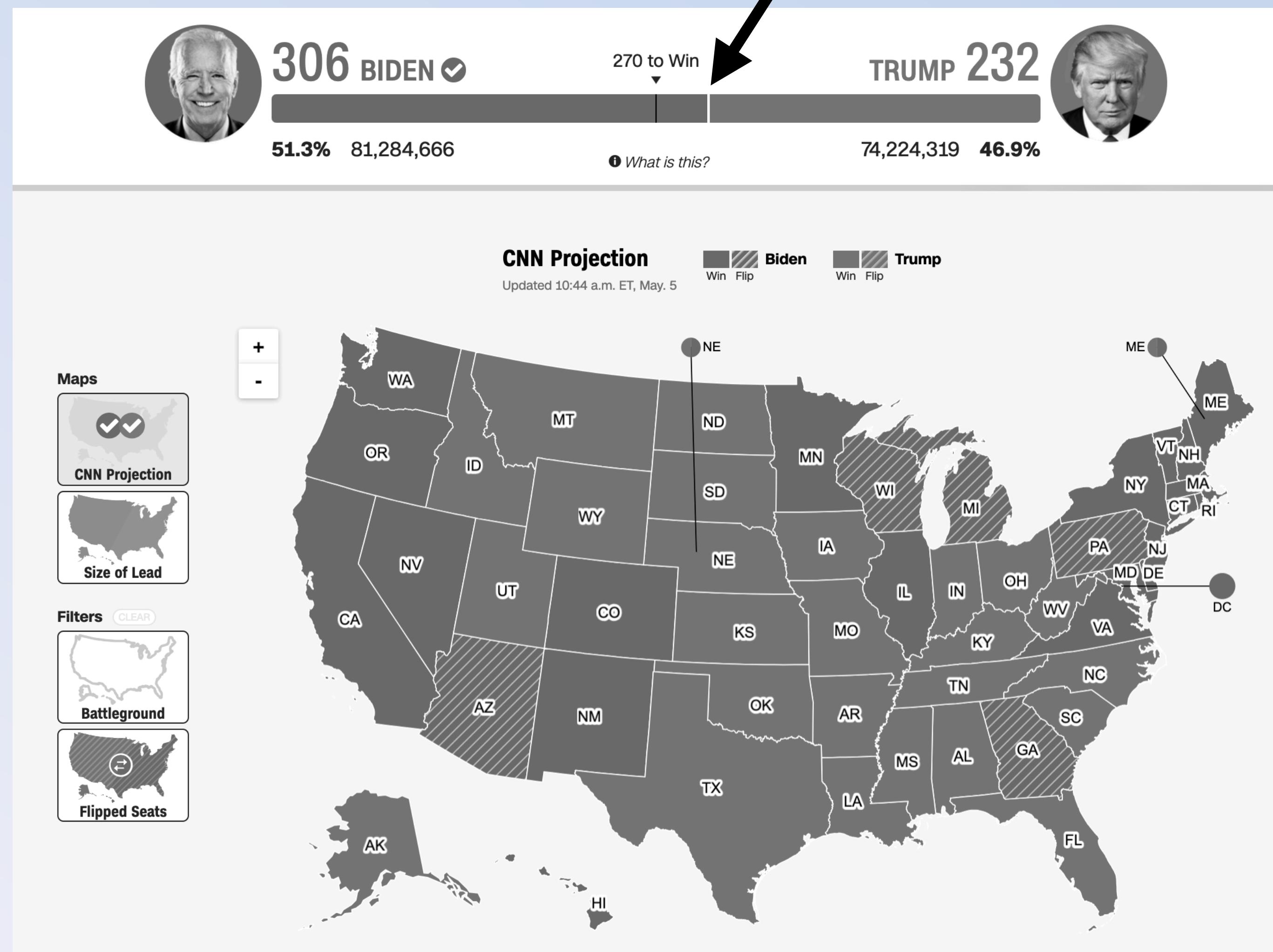
# This map is trouble in greyscale



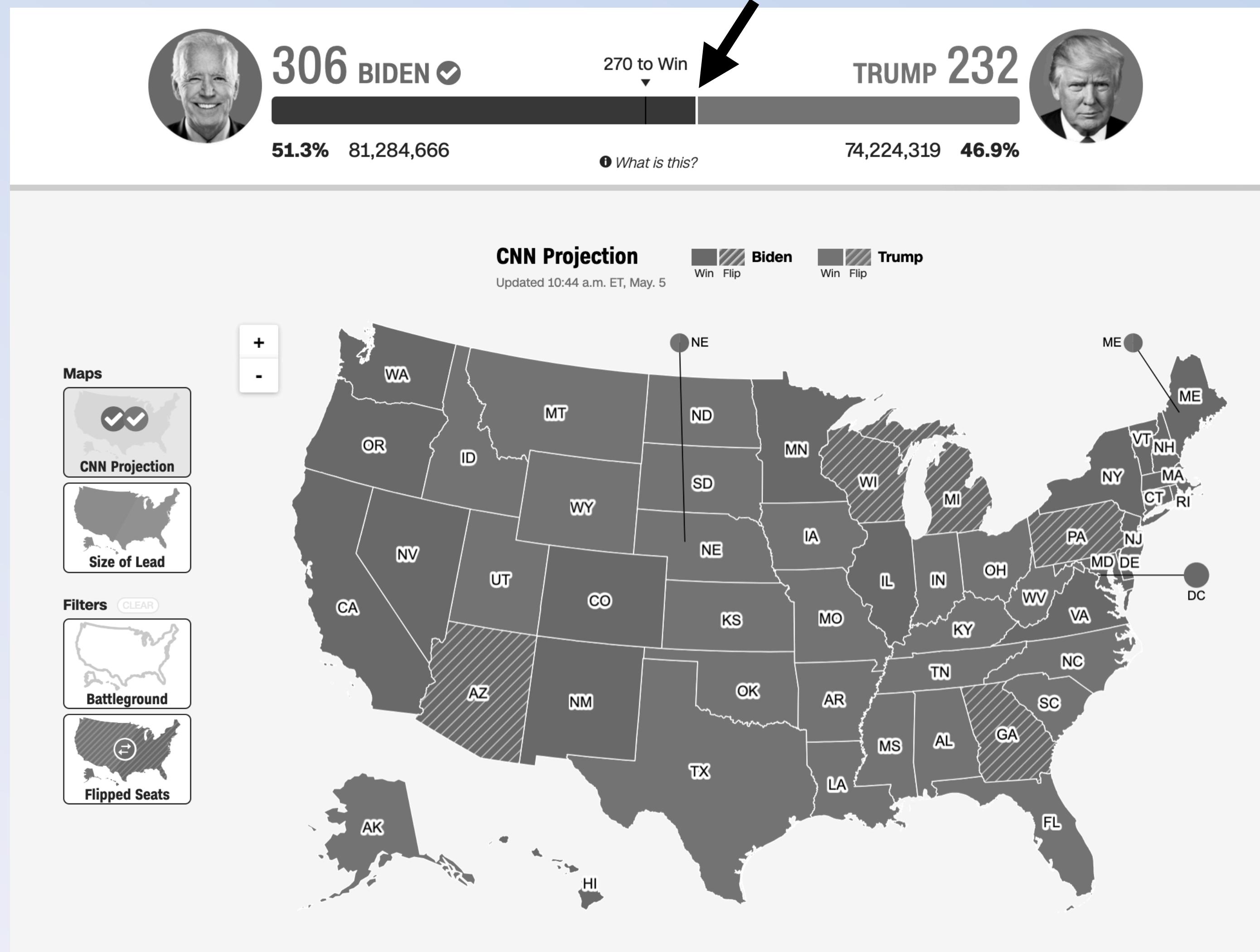
The division here matters!



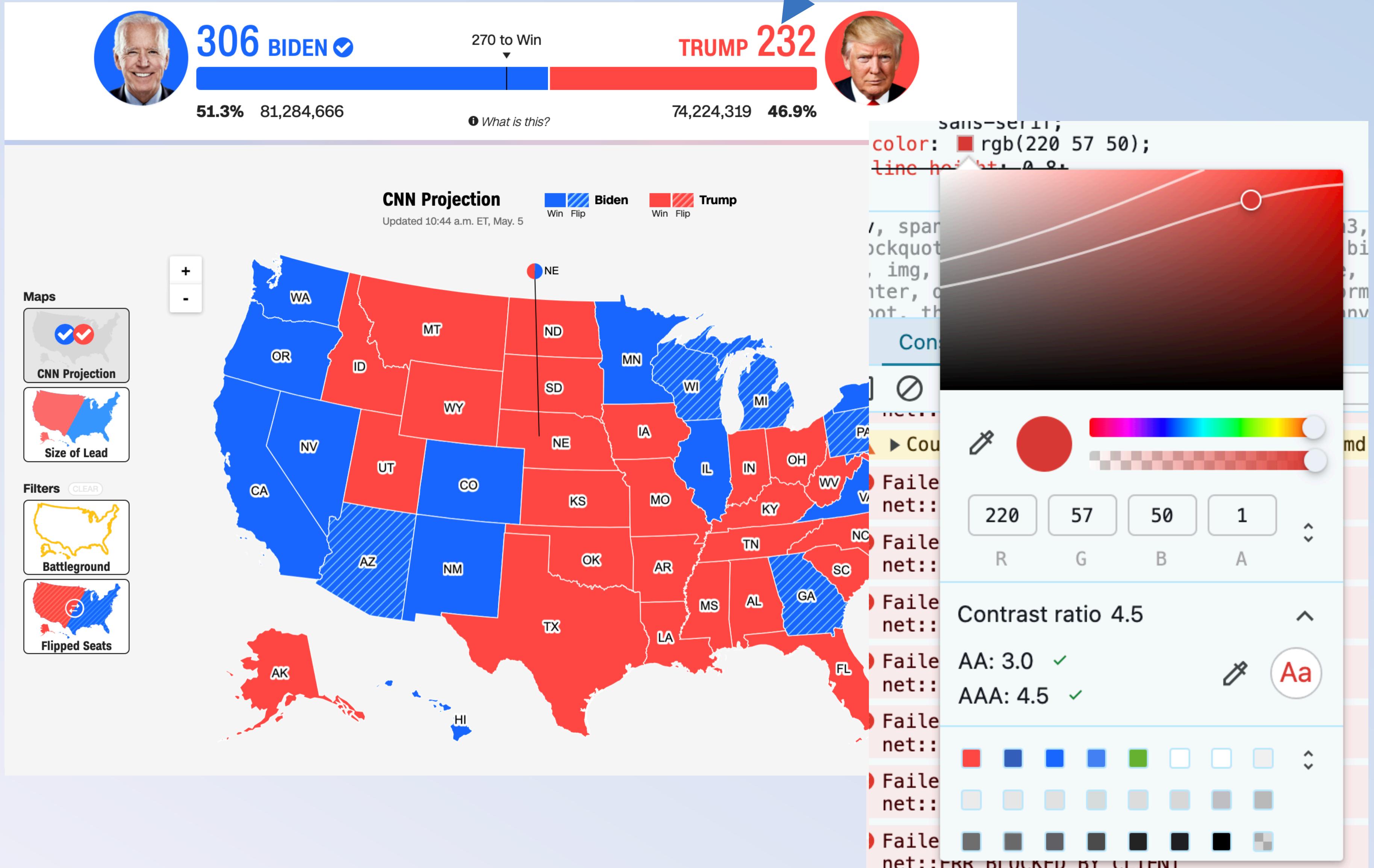
Maybe a small white divider, like the states?



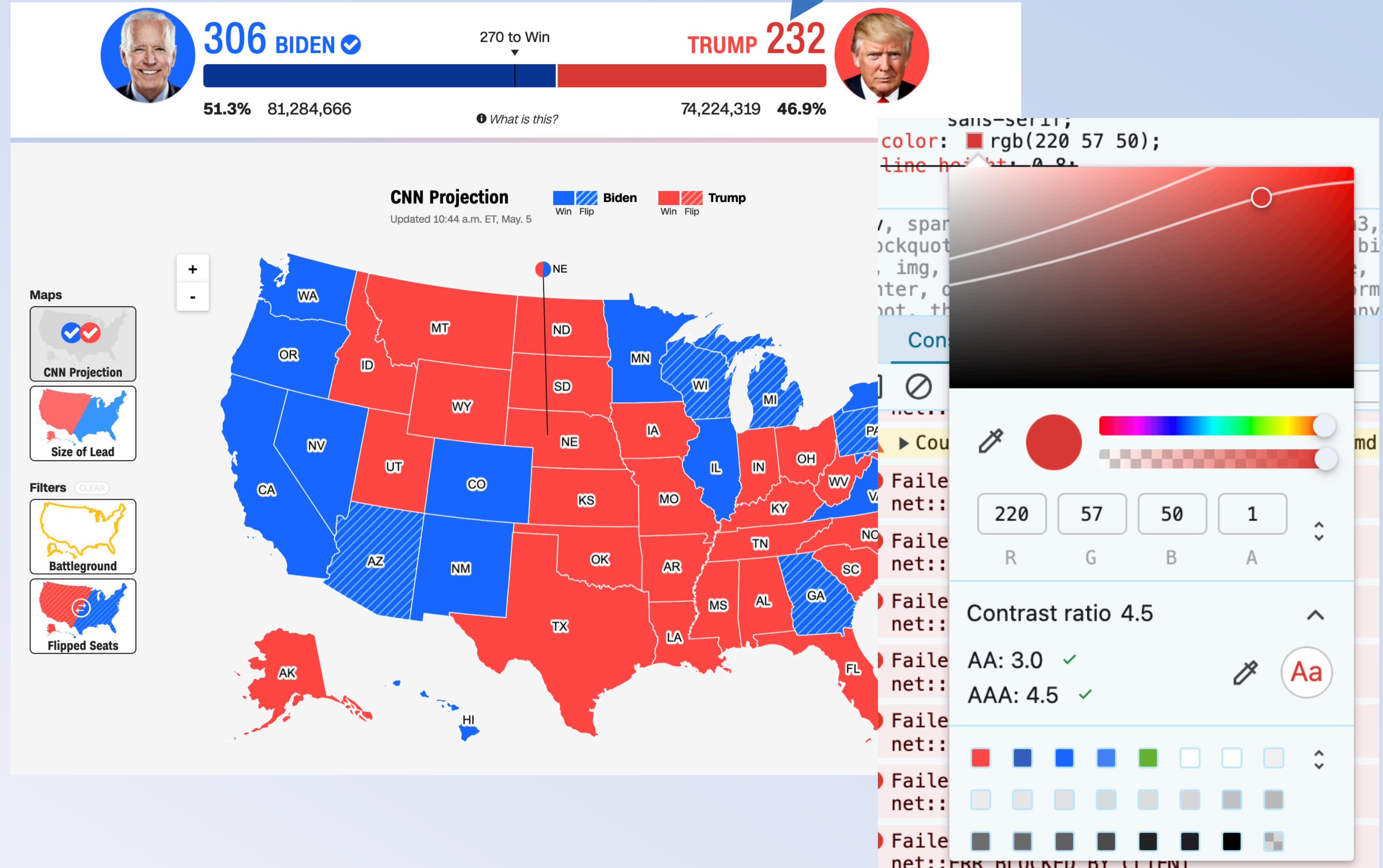
Perhaps test a darker blue too?



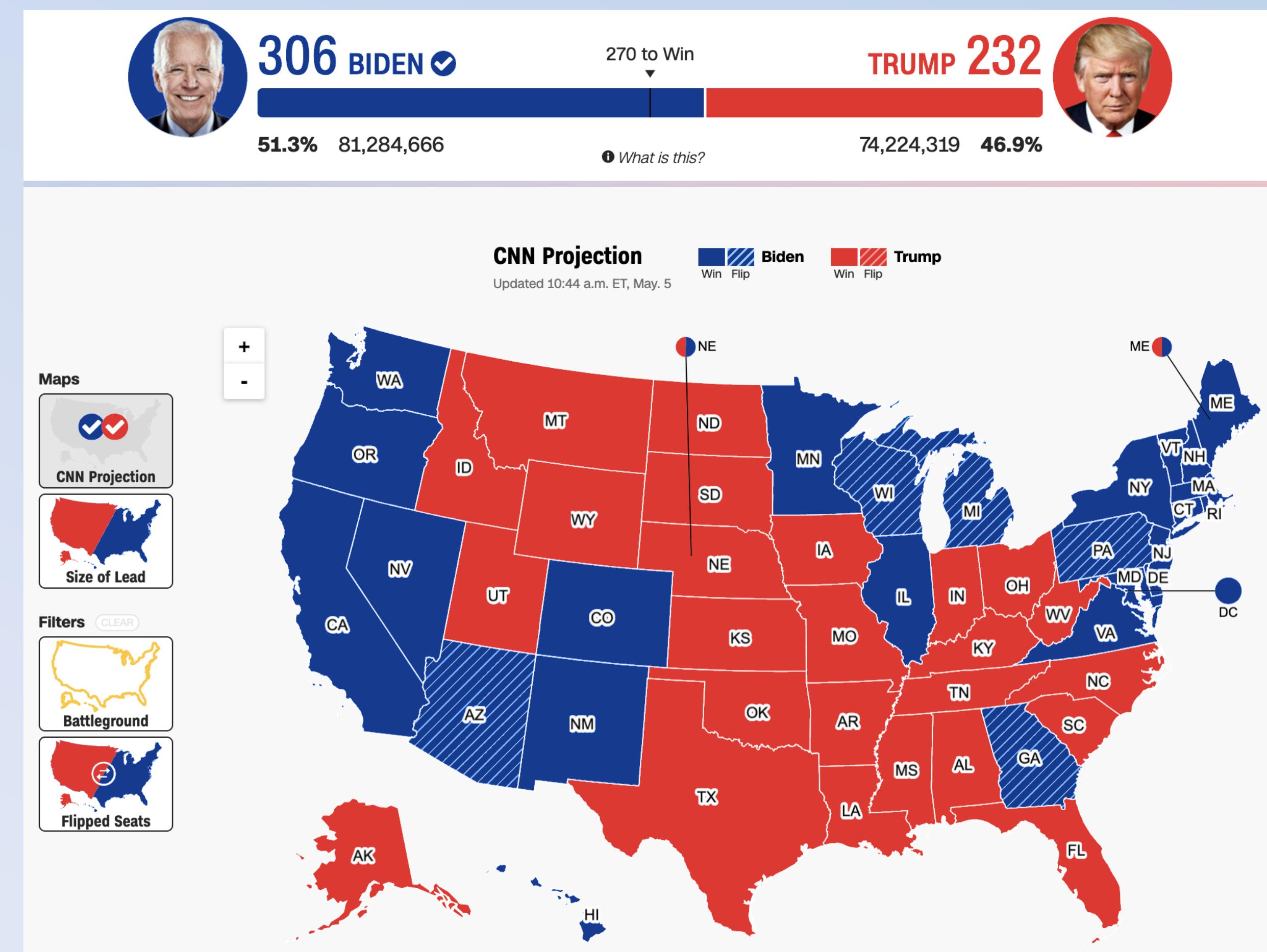
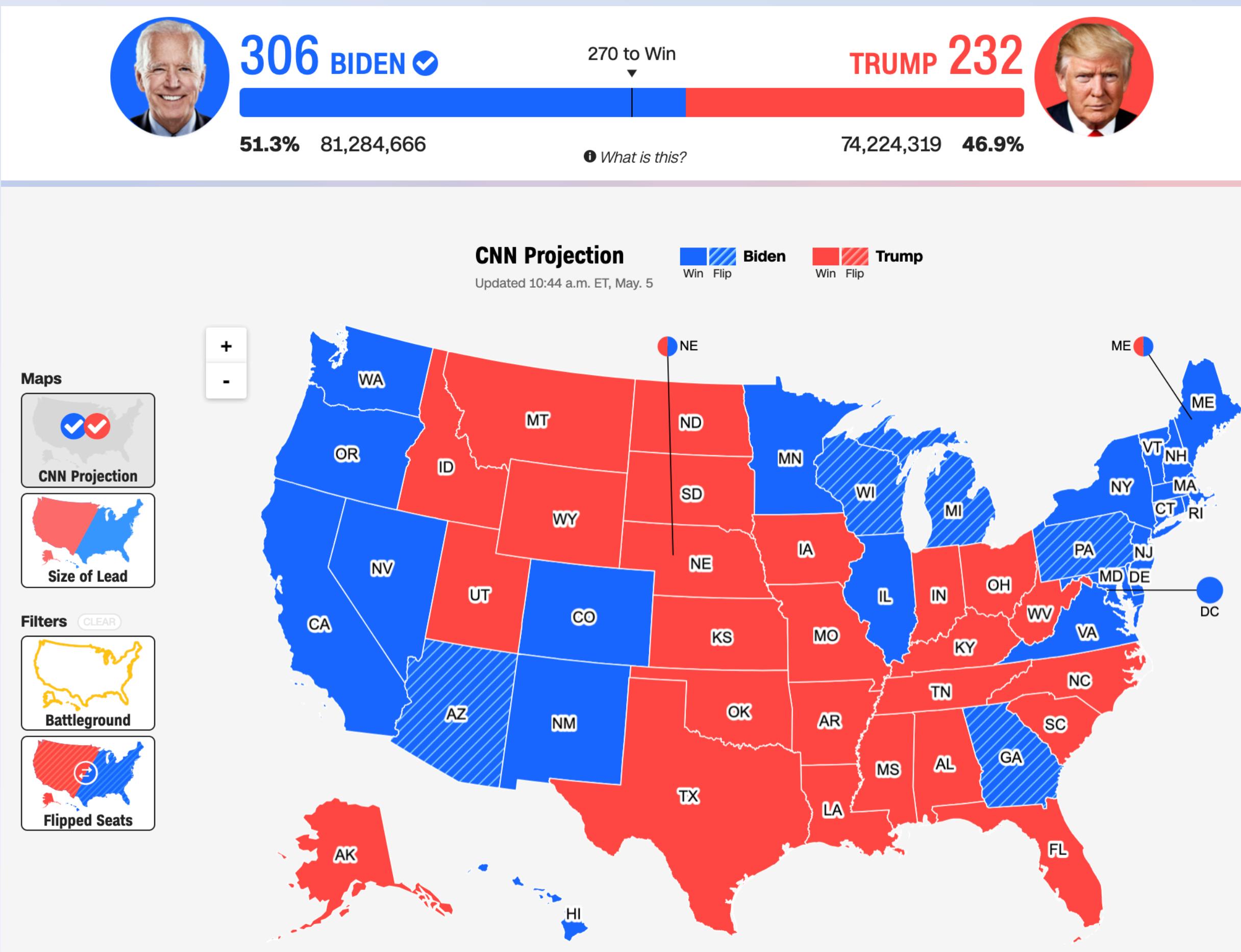
# What if we fix the contrast failures at the same time?



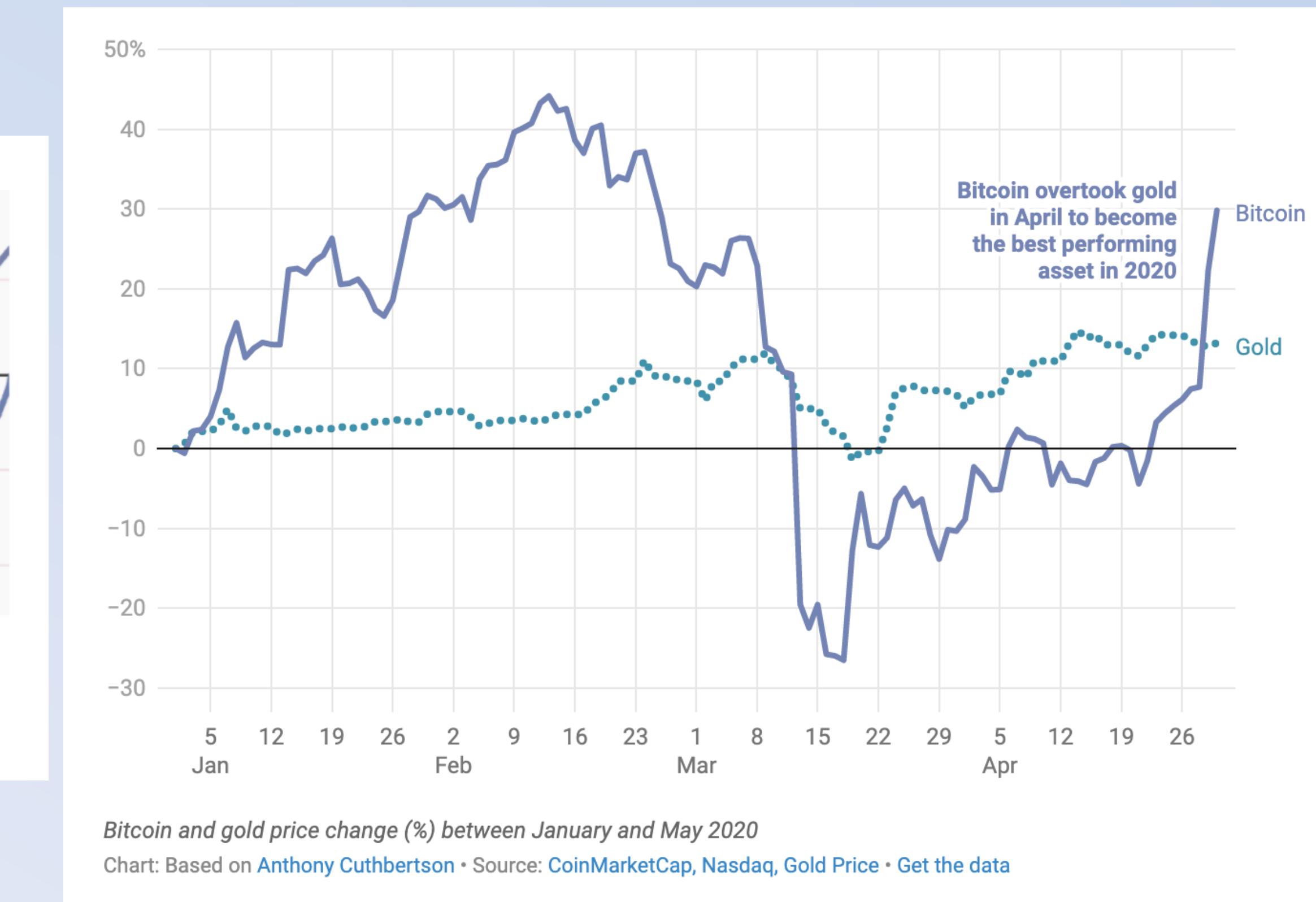
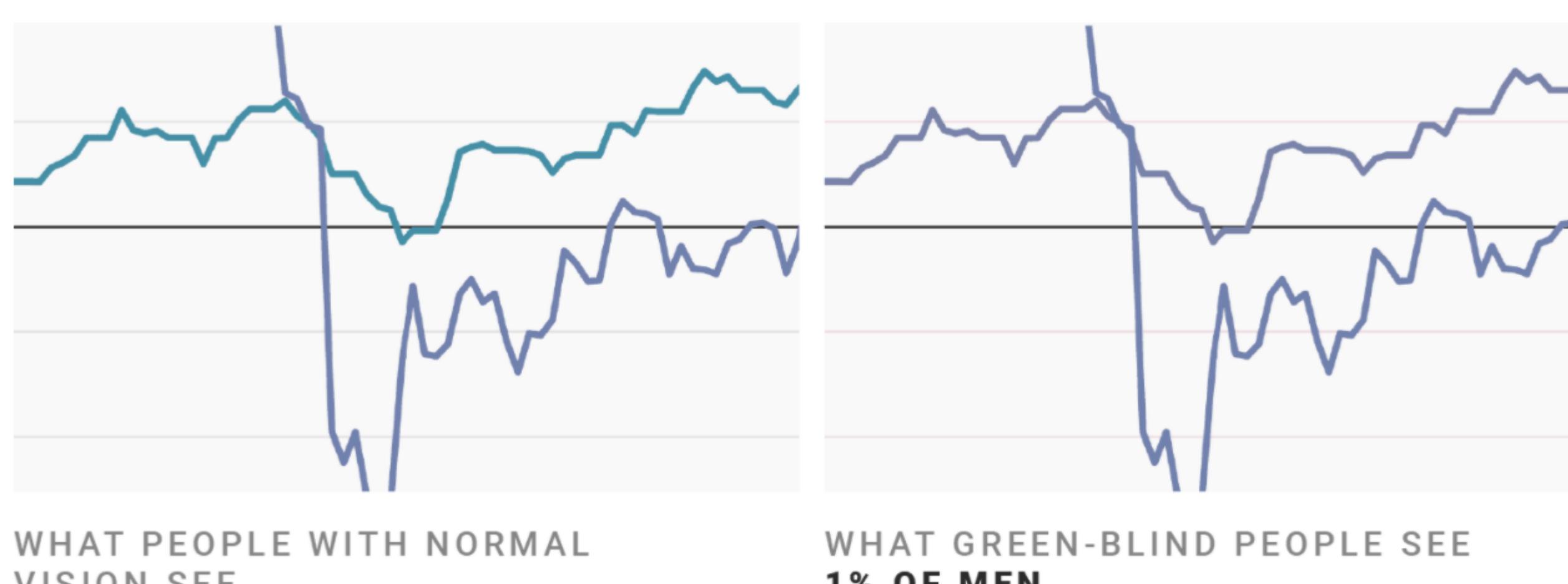
This text now passes!



# Sufficient contrast can help folks differentiate



# Don't rely on color alone!



[Data Wrapper's color guide](#)

# Add alt text

There is great research on alt text, but the most important thing to know is that you should add it to every image you post online (including twitter), in a document, or presentation.

Guidance: <https://medium.com/nightingale/writing-alt-text-for-data-visualization-2a218ef43f81>

alt= "**Chart type** of **type of data**  
where **reason for including chart**"

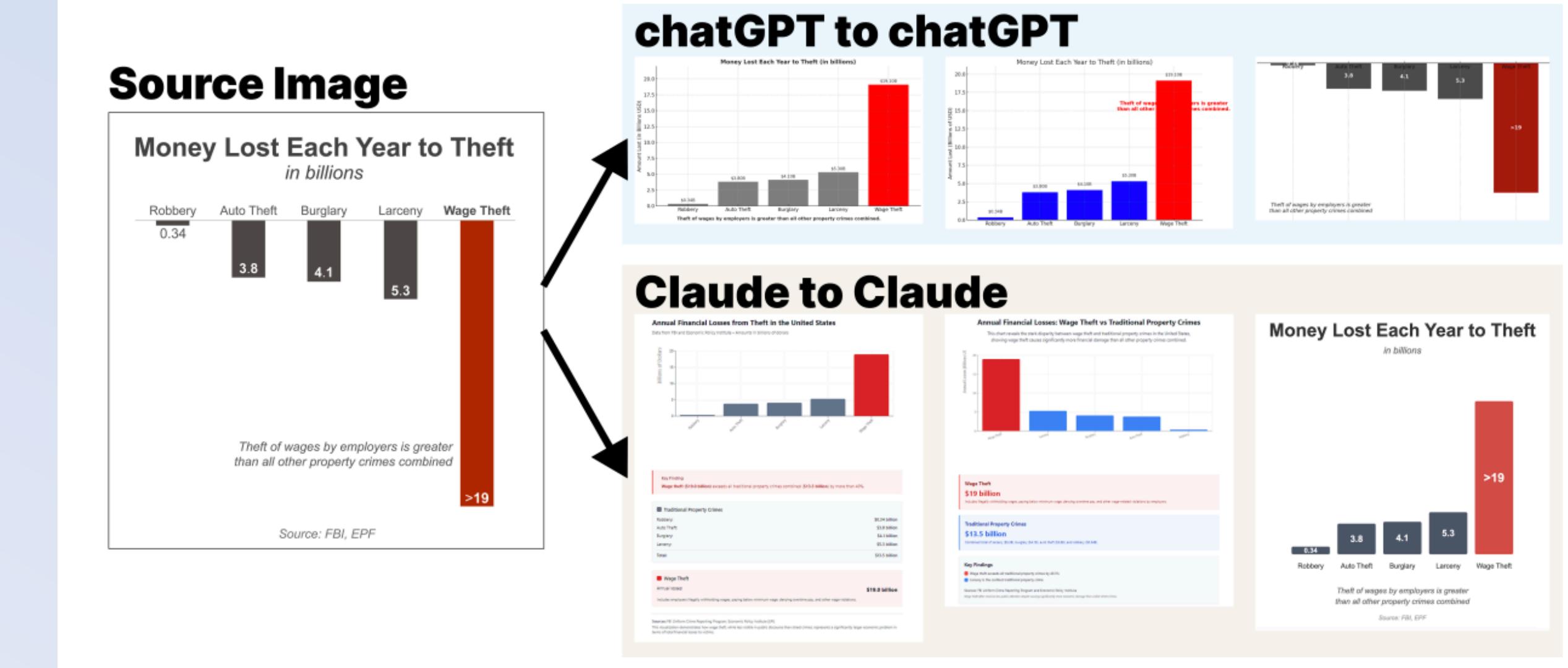
Include a **link to data source**  
somewhere in the text

# Beware of un-monitored LLMs/MMMs

Playing telephone with generative models: “verification disability,”  
“compelled reliance,” and accessibility in data visualization

Frank Elavsky\*  
Carnegie Mellon University

Cindy Xiong Bearfield†  
Georgia Tech



# Beware of un-monitored LLMs/MMMs

Pick the better prompt:

“Describe this image”

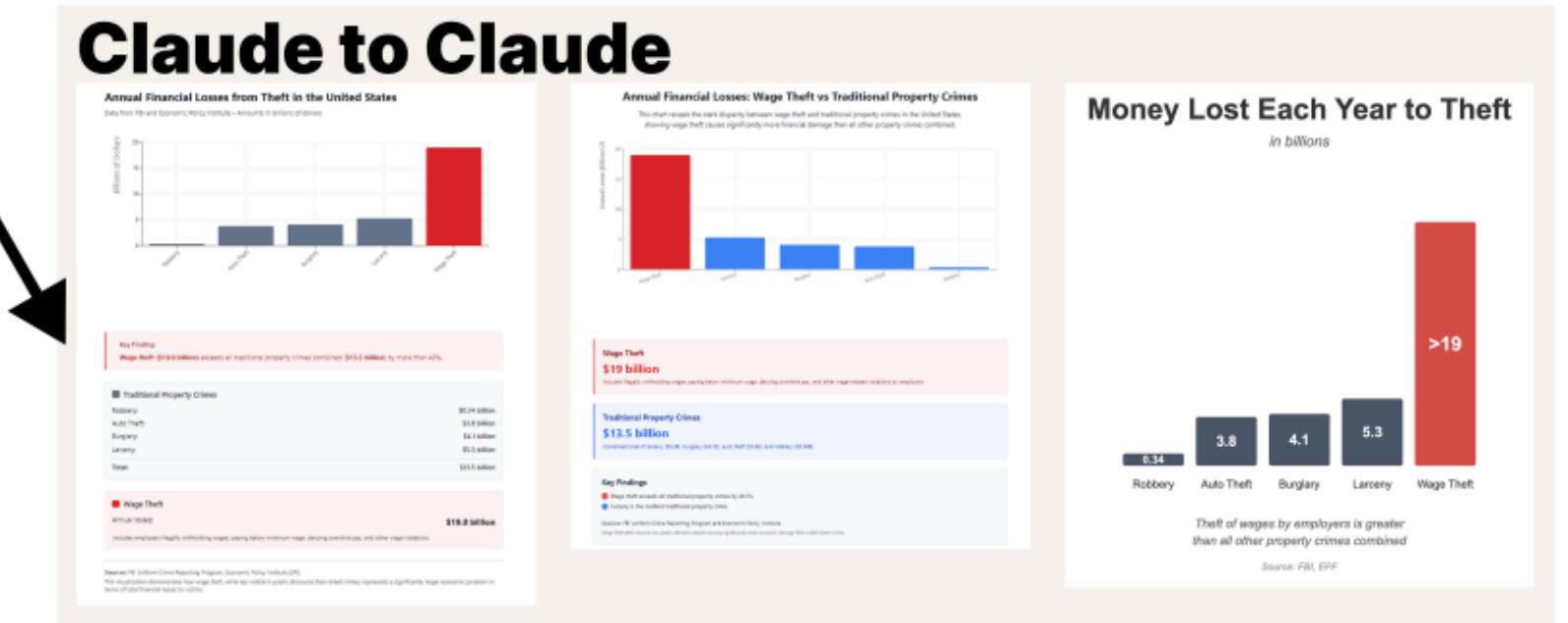
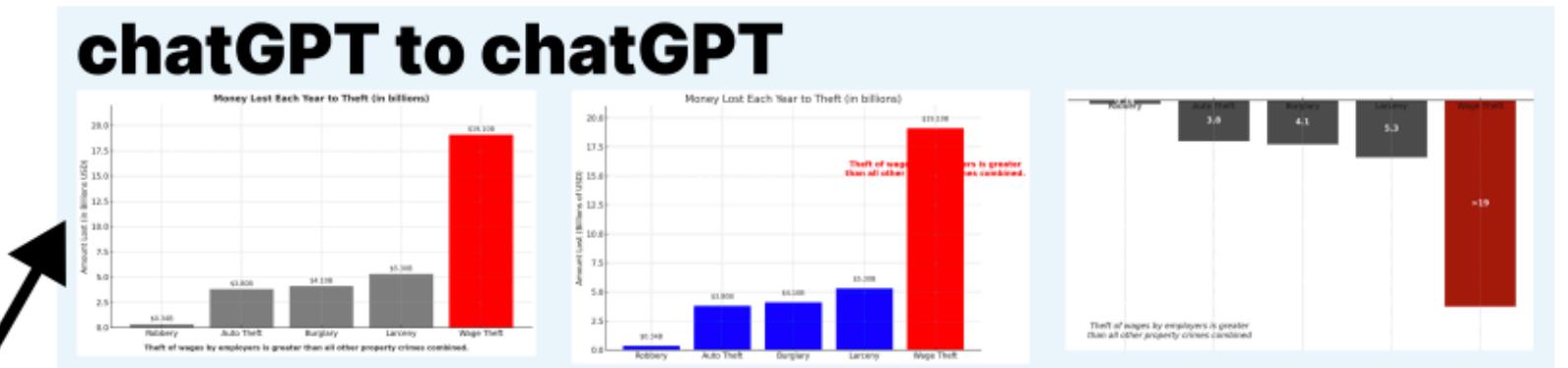
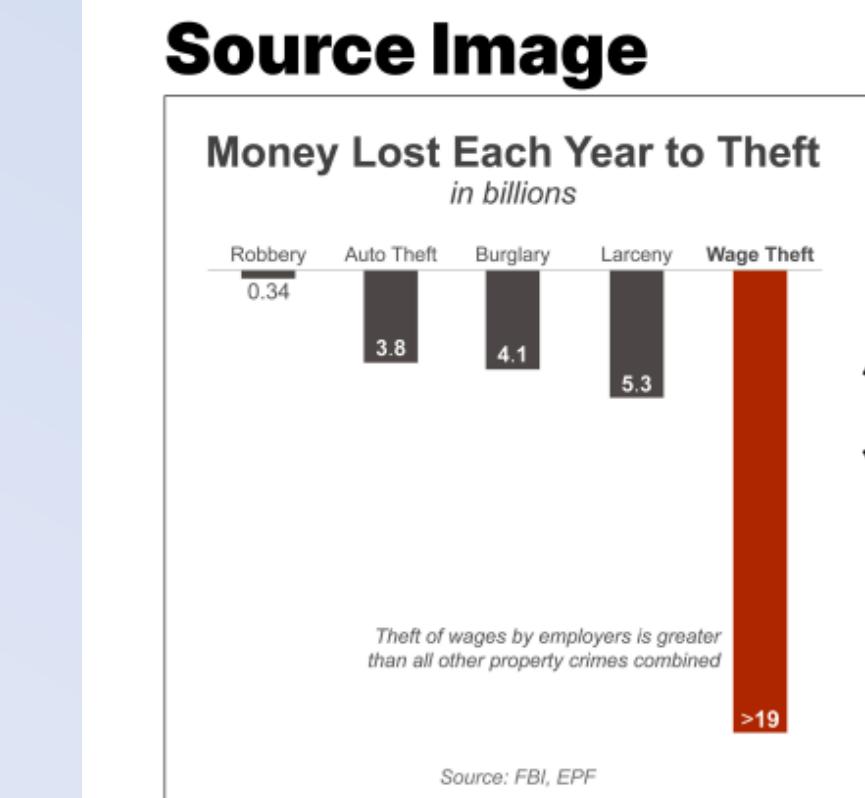
“Write alt text for this for someone who is blind”

“Describe this image and do not make mistakes”

Playing telephone with generative models: “verification disability,” “compelled reliance,” and accessibility in data visualization

Frank Elavsky\*  
Carnegie Mellon University

Cindy Xiong Bearfield†  
Georgia Tech



Source: FBI, EPF

# Beware of un-monitored LLMs/MMMs

Pick the better prompt:

**“Describe this image”**

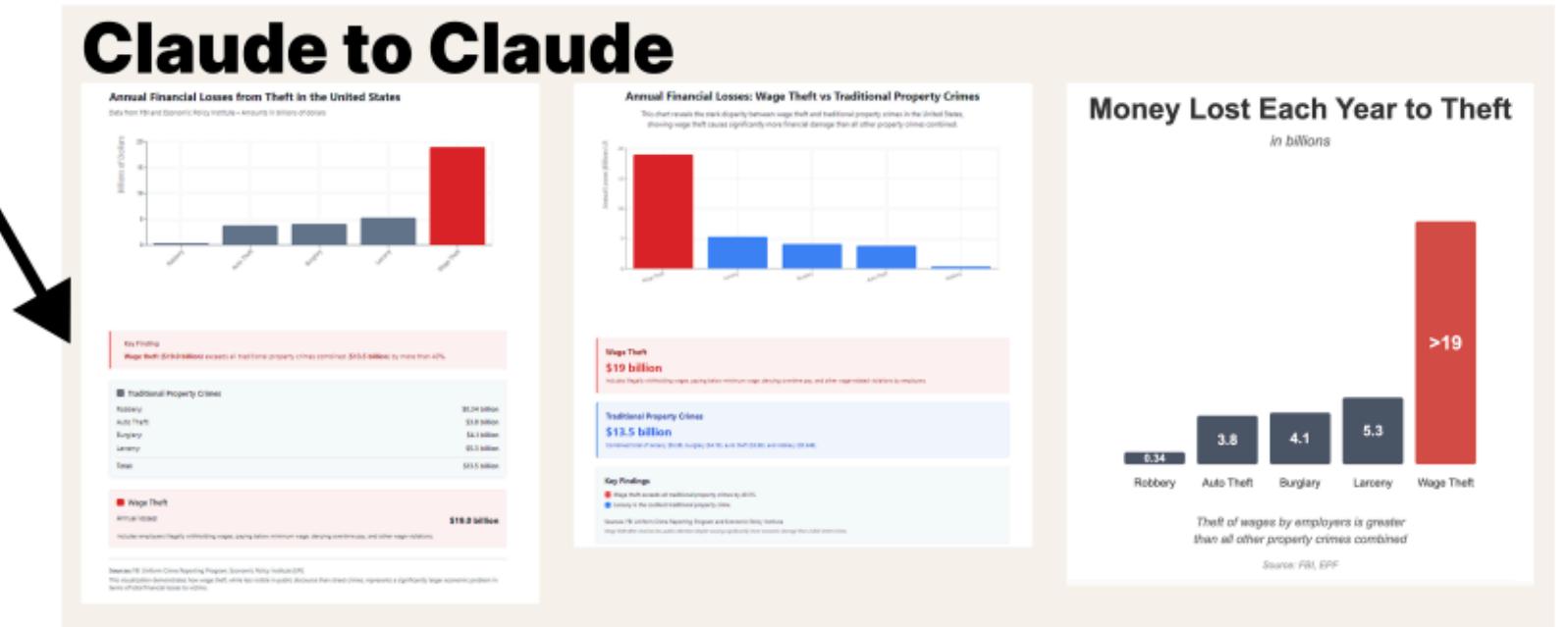
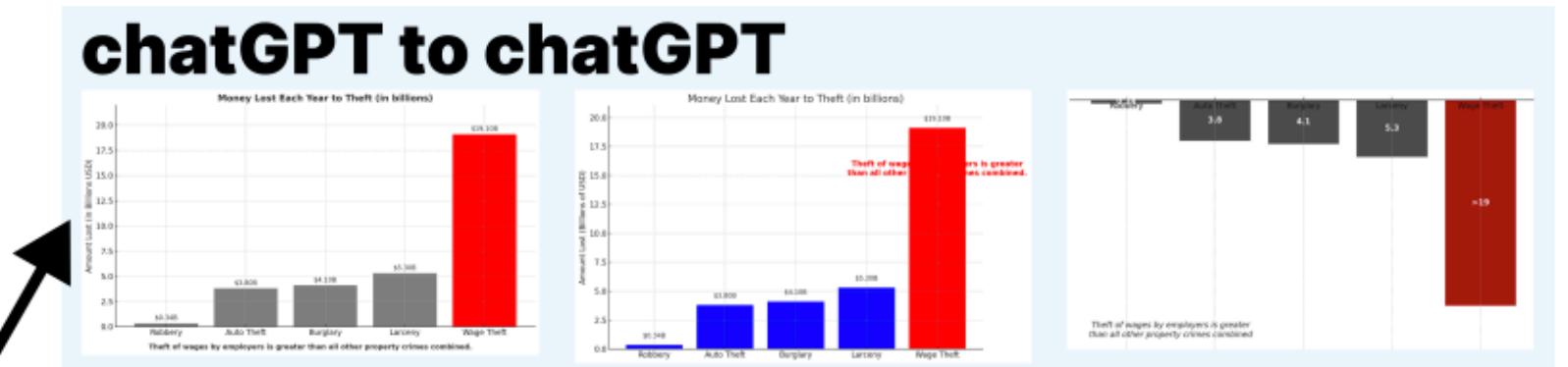
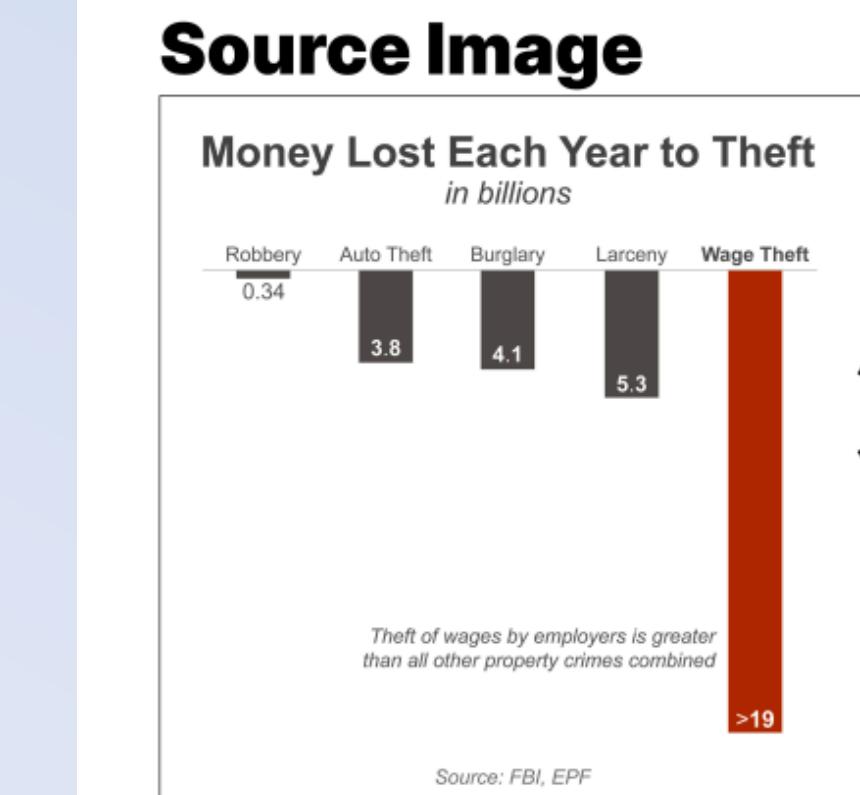
“Write alt text for this for someone who is blind”

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Georgia Tech



# Beware of un-monitored LLMs/MMMs

Pick the better prompt:

And check the output!

“Describe this image”

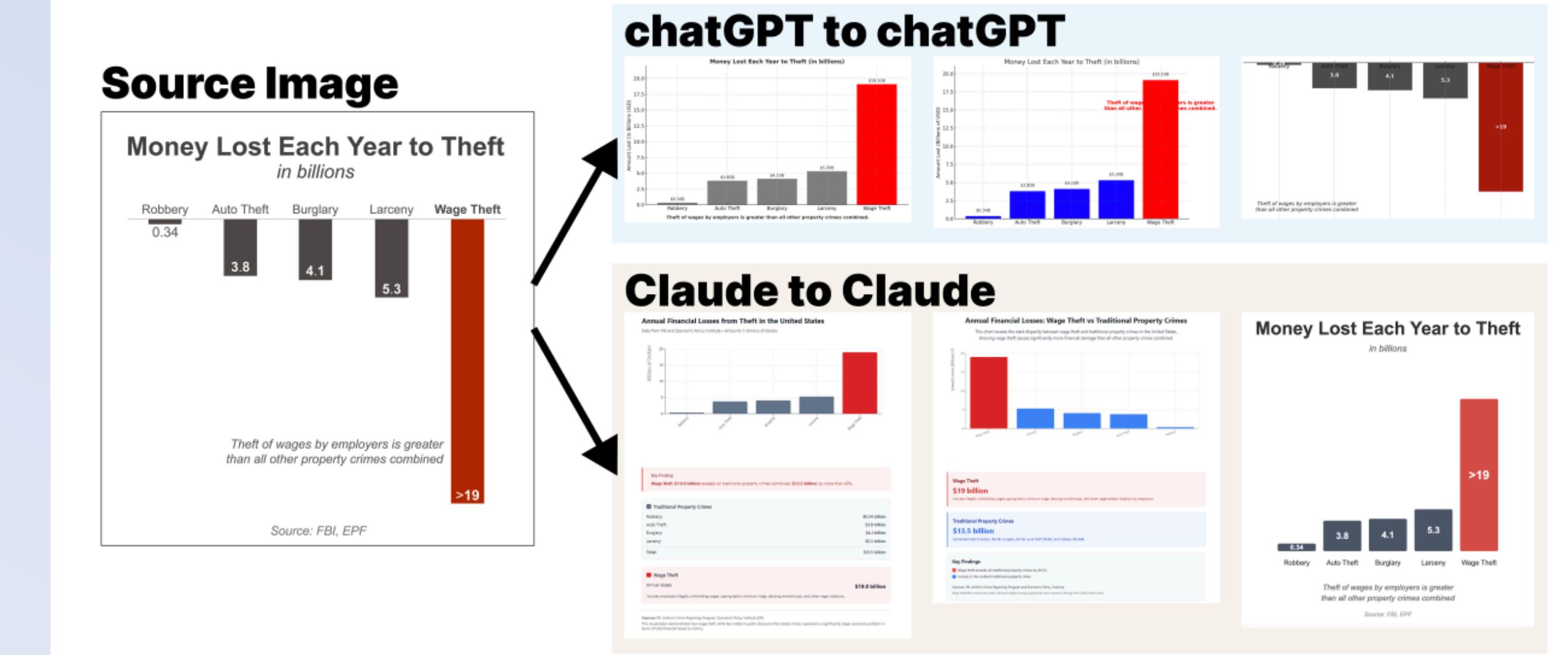
“Write alt text for this for someone who is blind”

“Describe this image and do not make mistakes”

Playing telephone with generative models: “verification disability,” “compelled reliance,” and accessibility in data visualization

Frank Elavsky\*  
Carnegie Mellon University

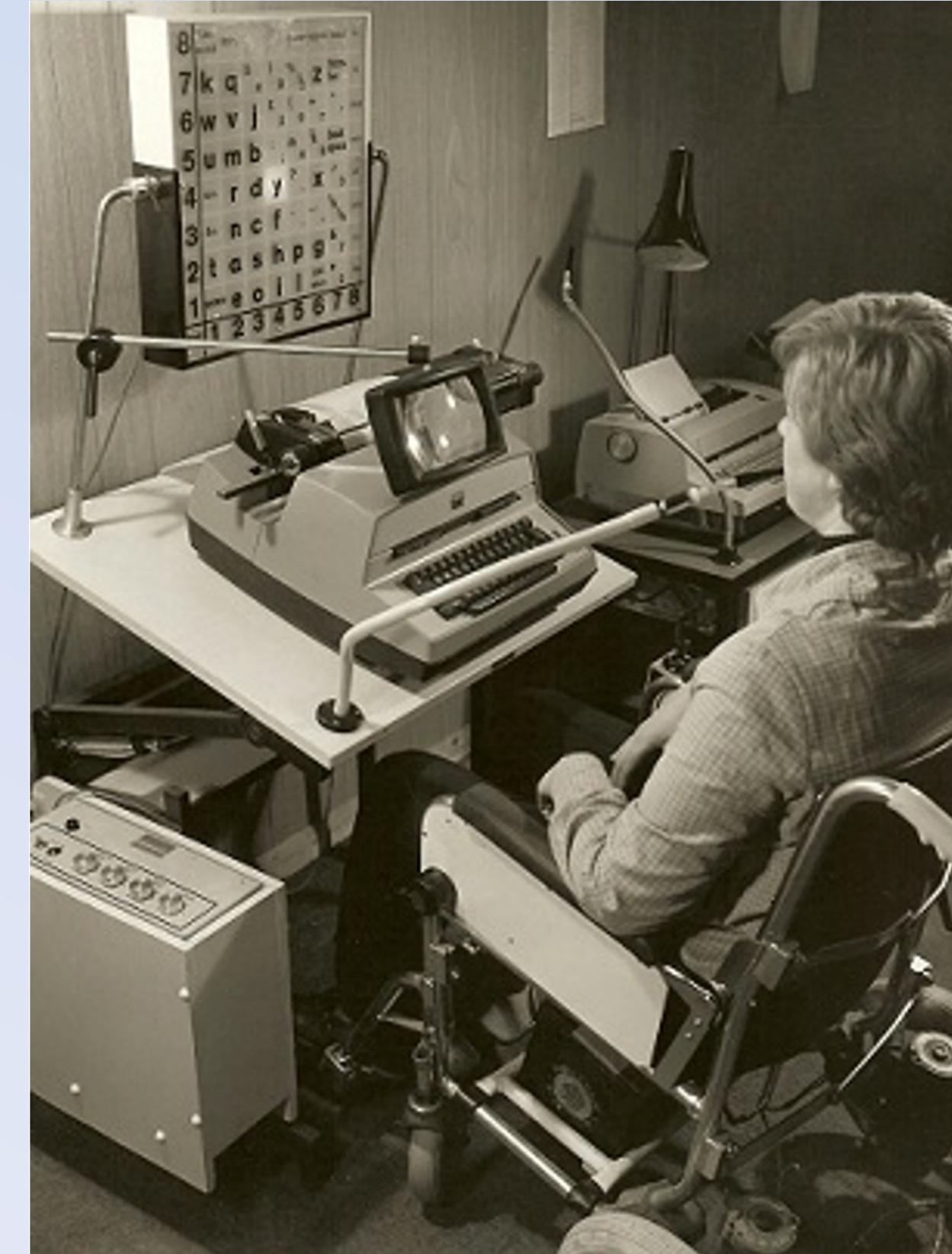
Cindy Xiong Bearfield†  
Georgia Tech



# Operable

Can someone operate this in multiple ways? Is each way easy?

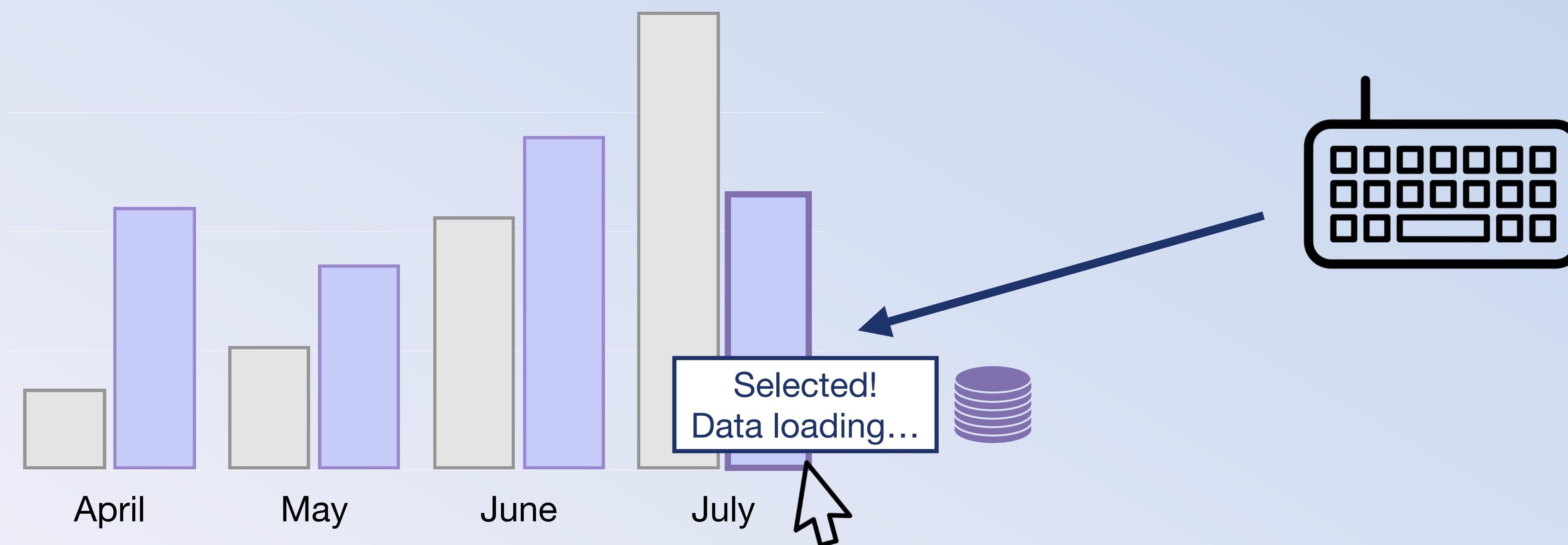
# Many assistive input technologies “navigate”



A person in a wheelchair operating an old computer using a desk-mounted sip and puff device called the POSSUM.

Image credit: [Wikipedia](#), Public Domain, 1960. Photographer: Possum Ltd.

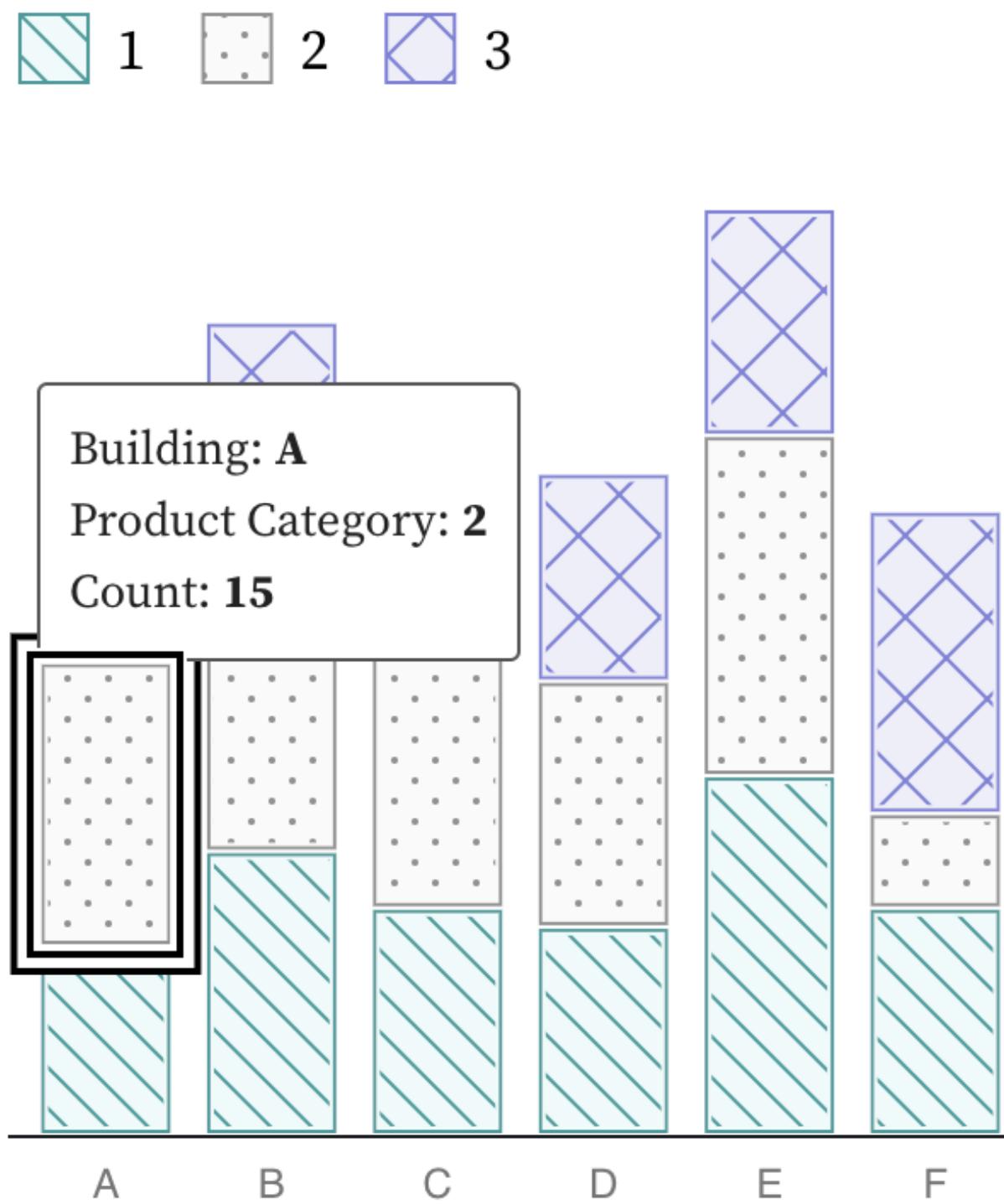
# A keyboard should be able to do everything a mouse can



WAI. “Understanding success criterion 2.1.1: keyboard.” *WCAG standard*, W3C, 2017.

# Alt text should communicate operability

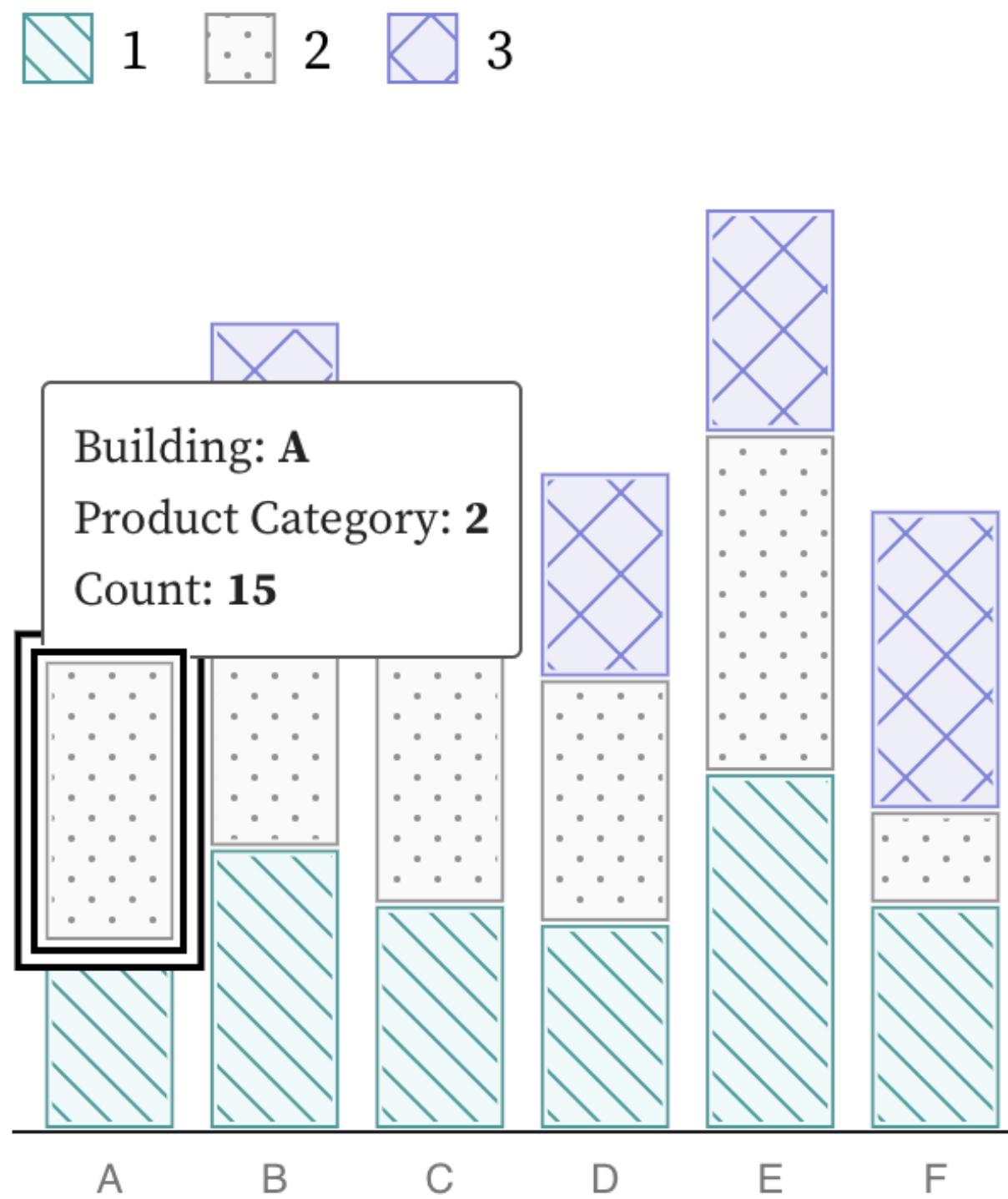
Source: Visa Chart Components, Frank Elavsky (2017-2019)



✖ Building A. Product Category 2.  
Count 15. Bar 2 of 3. Image.

# Semantics matter

Source: Visa Chart Components, Frank Elavsky (2017-2019)



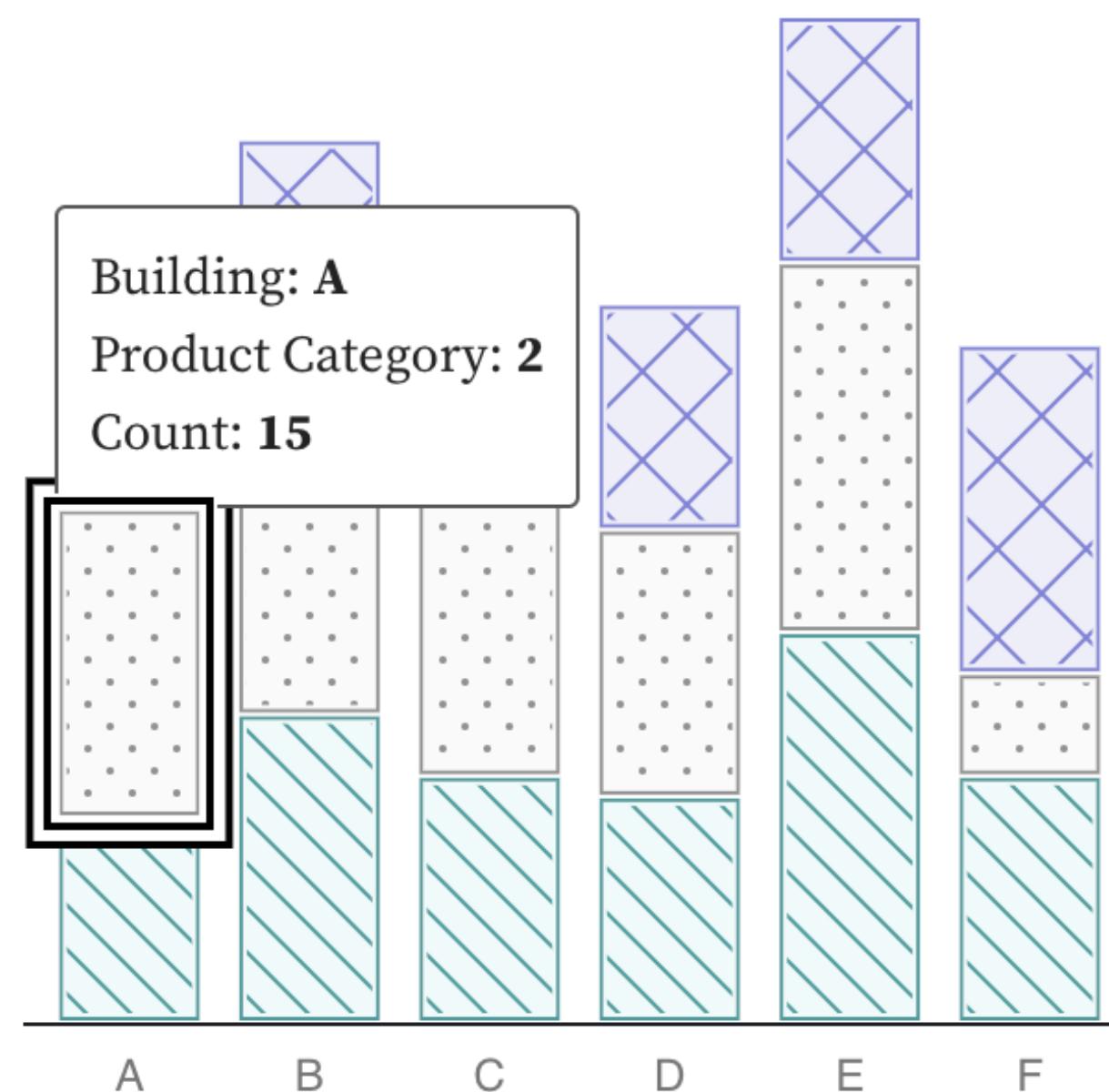
✖ Building A. Product Category 2.  
Count 15. Bar 2 of 3. Image.

“Image” doesn’t signal interactivity!

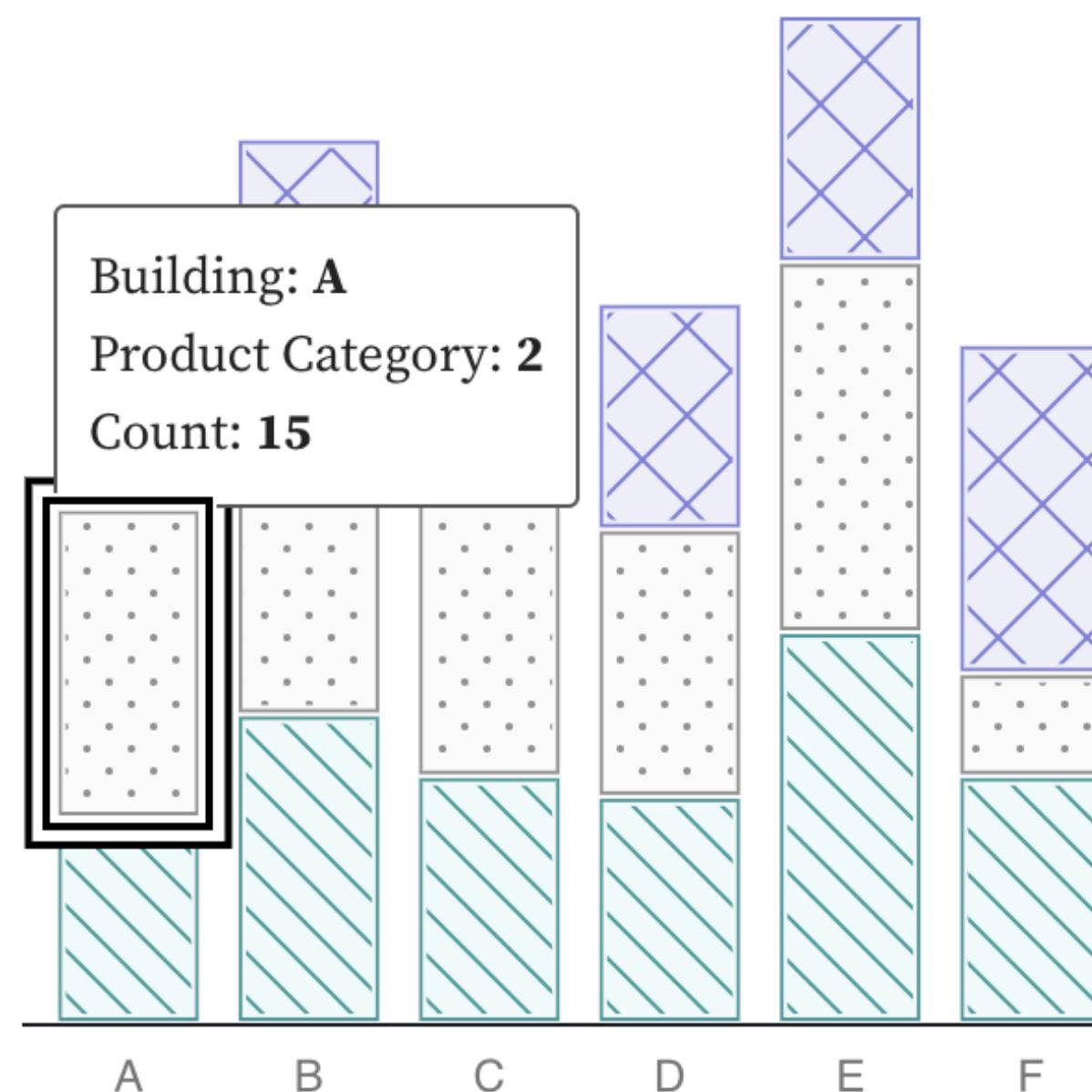
# ARIA semantics are standardized

Source: Visa Chart Components, Frank Elavsky (2017-2019)

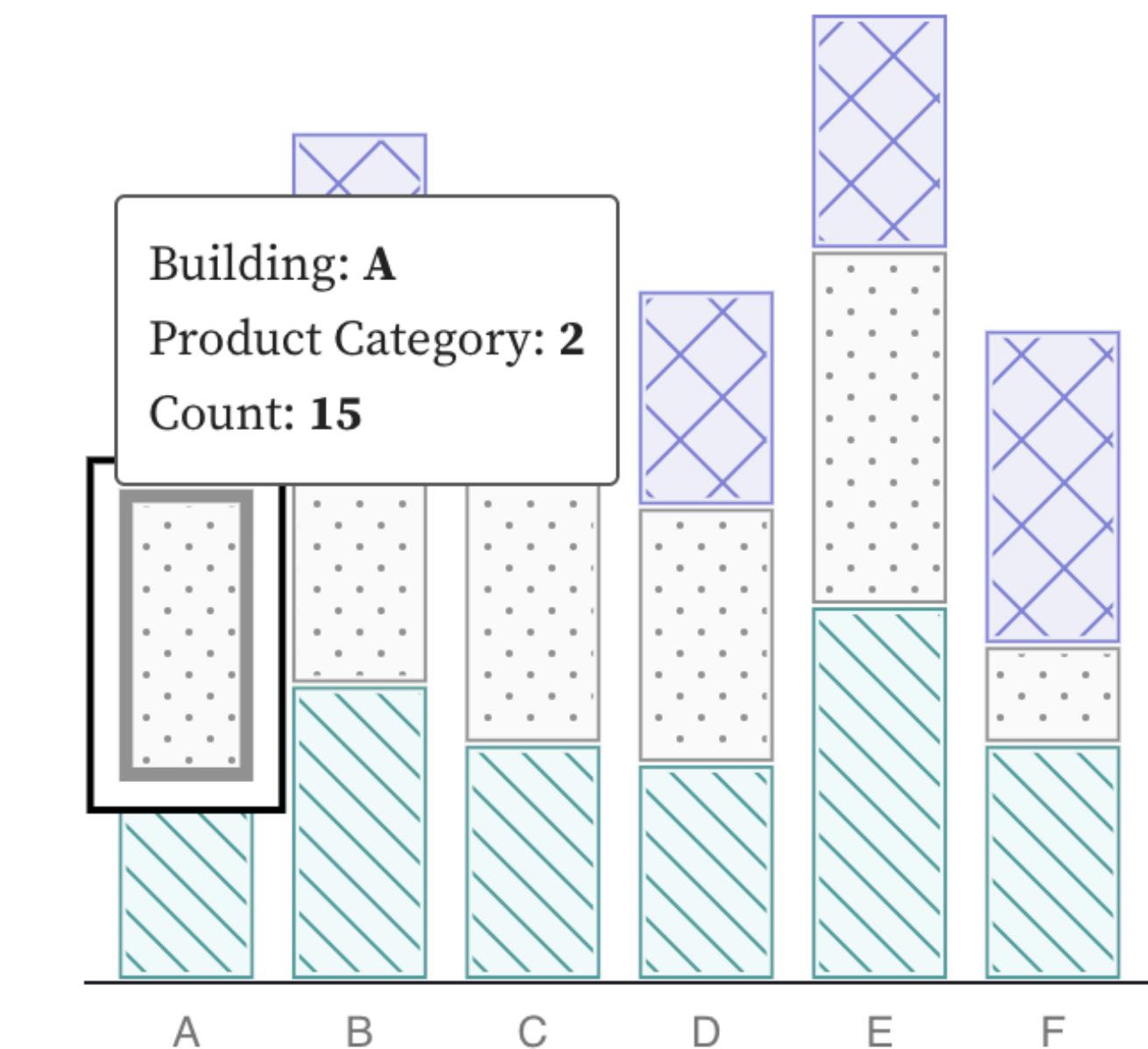
1 2 3



1 2 3



1 2 3



× Building A. Product Category 2.  
Count 15. Bar 2 of 3. Image.

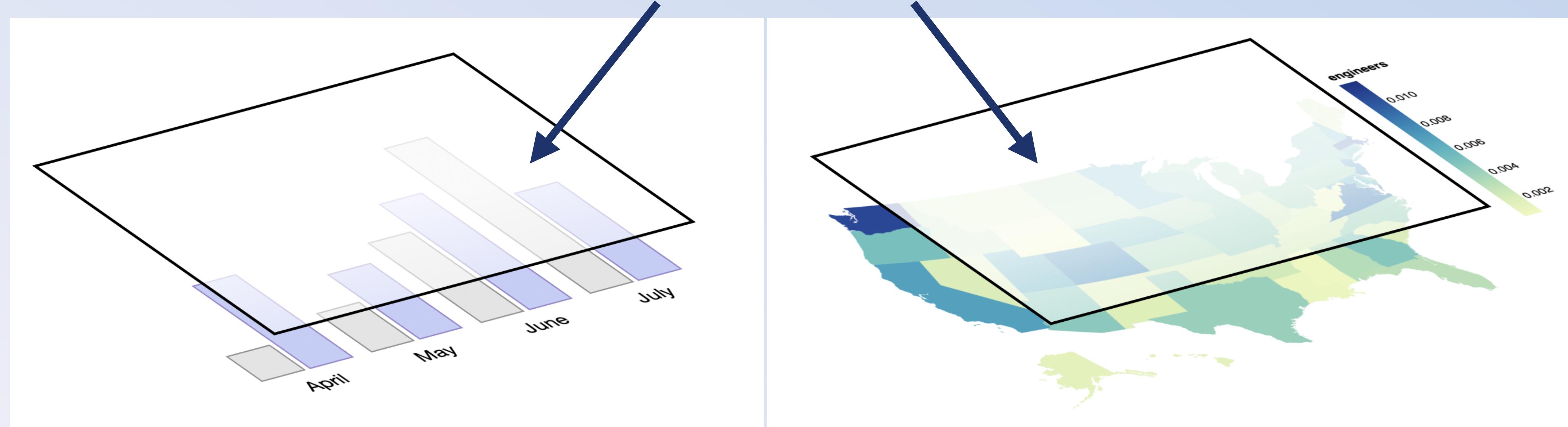
× Building A. Product Category  
2. Count 15. Bar 2 of 3., toggle  
button

× selected, Building A. Product  
Category 2. Count 15. Bar 2 of  
3., toggle button

# Data Navigator

Frank Elavsky et al (2023)

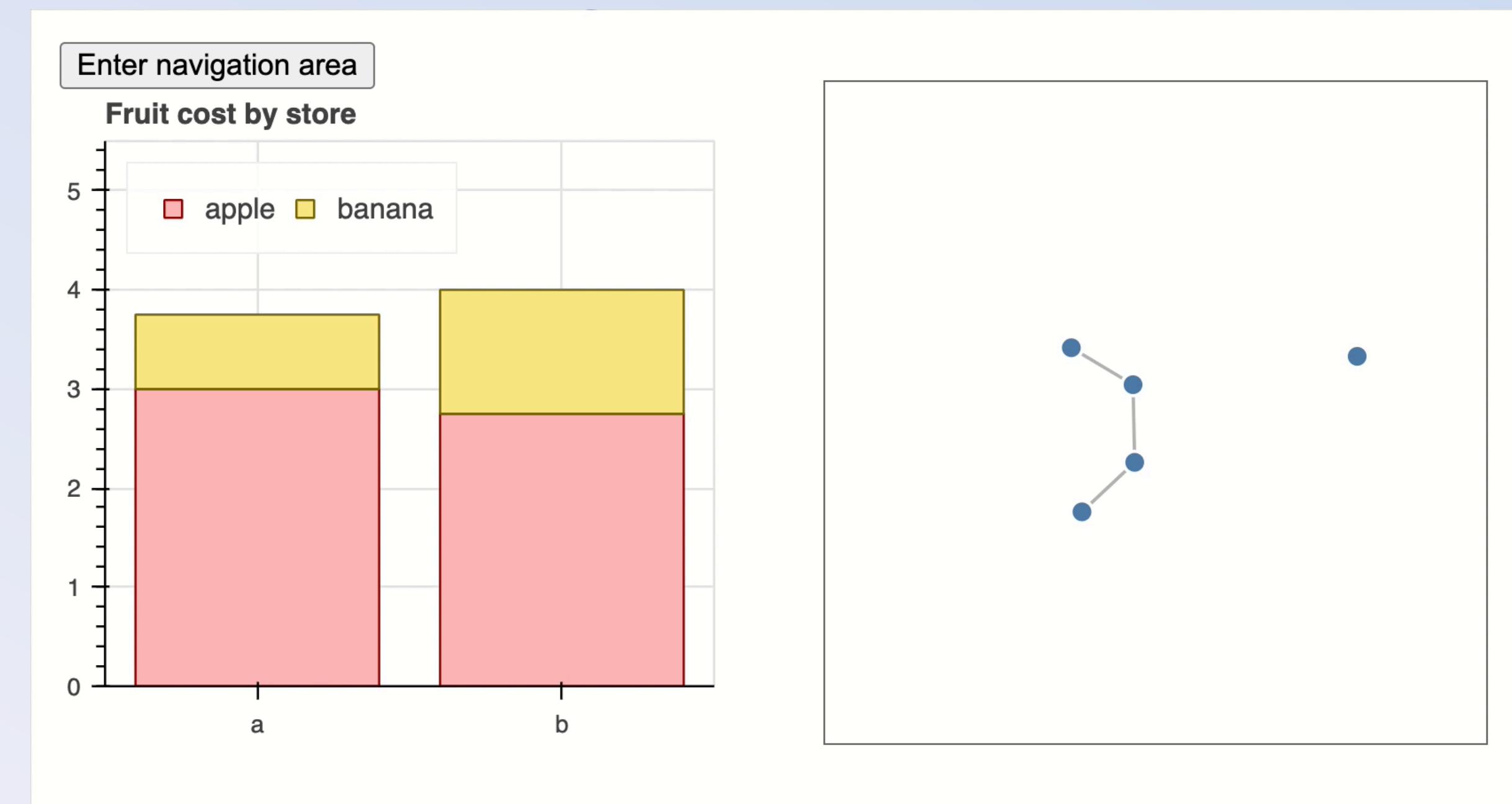
An interactive layer that interfaces between data structures and assistive technologies



Data Navigator

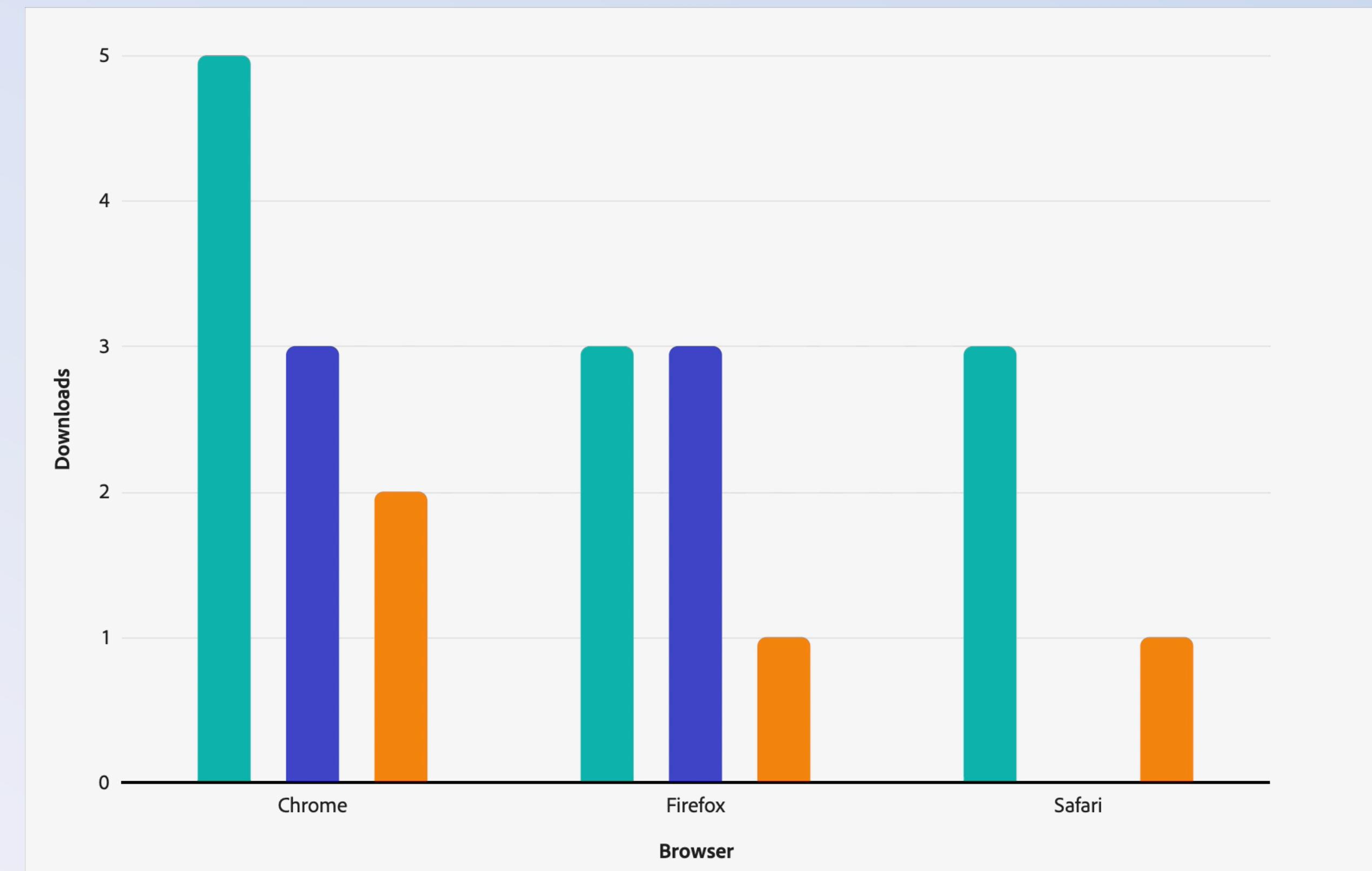
# Data Navigator: Empowering practitioners

## Bokeh, a Python visualization library



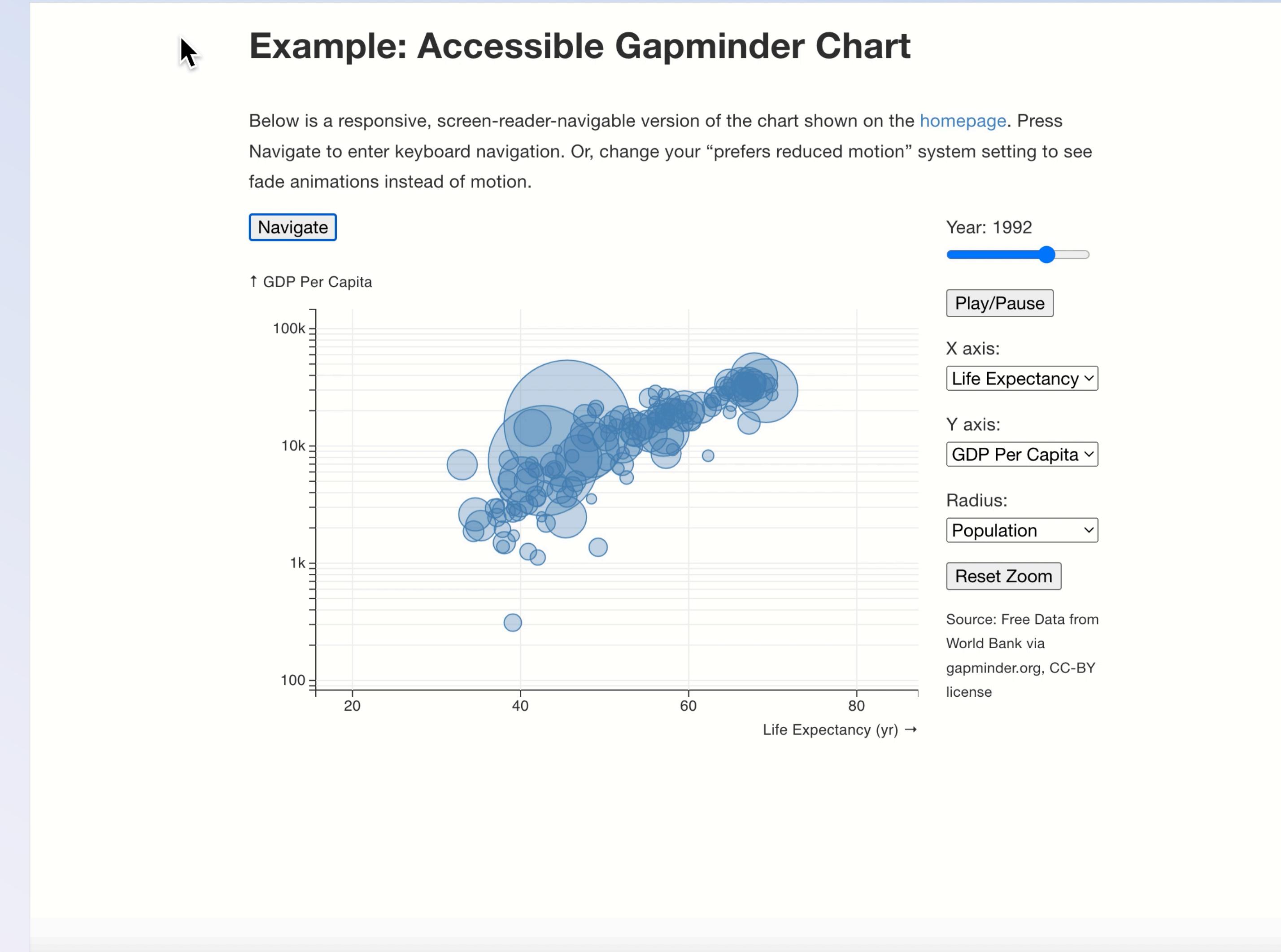
# Data Navigator: Empowering practitioners

## React Spectrum Charts, Adobe's visualization design system



# Counterpoint: navigating animations

## Sivaraman's Counterpoint (2024)



# **Understandable**

Can someone understand this in multiple ways? Is each way easy?

# Keep summaries as non-technical as possible

Measured in EF units (non-normalized). EF units are valuable for catching egregious oversimulation in models that use randomized data decimation techniques. This particular evaluation findings demonstrate that the randomization models are significantly overproducing entropy in our latest force simulations.

## Hemingway Editor

### Readability

### Post-graduate

Poor. Aim for 14.

Words: 39

Show More ▾

1 adverb. Aim for 0 or fewer.

0 uses of passive voice. Nice work.

1 phrase has a simpler alternative.

0 of 3 sentences are hard to read.

2 of 3 sentences are very hard to read.

Measured in EF units (non-normalized). These units are helpful for catching bad data loss when we remove our data at random. We are producing too much entropic force in our latest models.

## Hemingway Editor

### Readability

### Grade 6

Good

Words: 32

Show More ▾

0 adverbs. Well done.

0 uses of passive voice. Nice work.

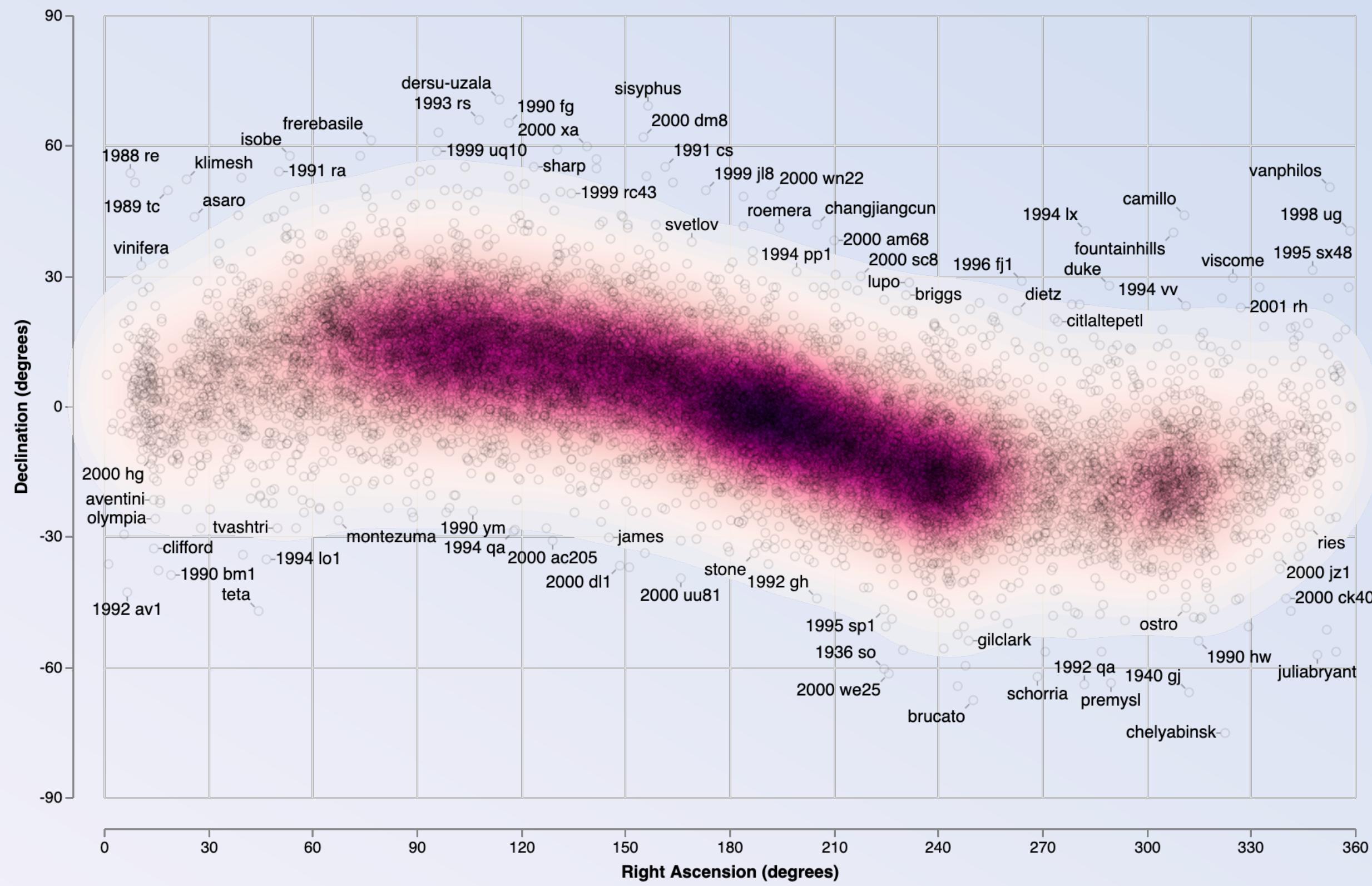
0 phrases have simpler alternatives.

0 of 3 sentences are hard to read.

0 of 3 sentences are very hard to read.

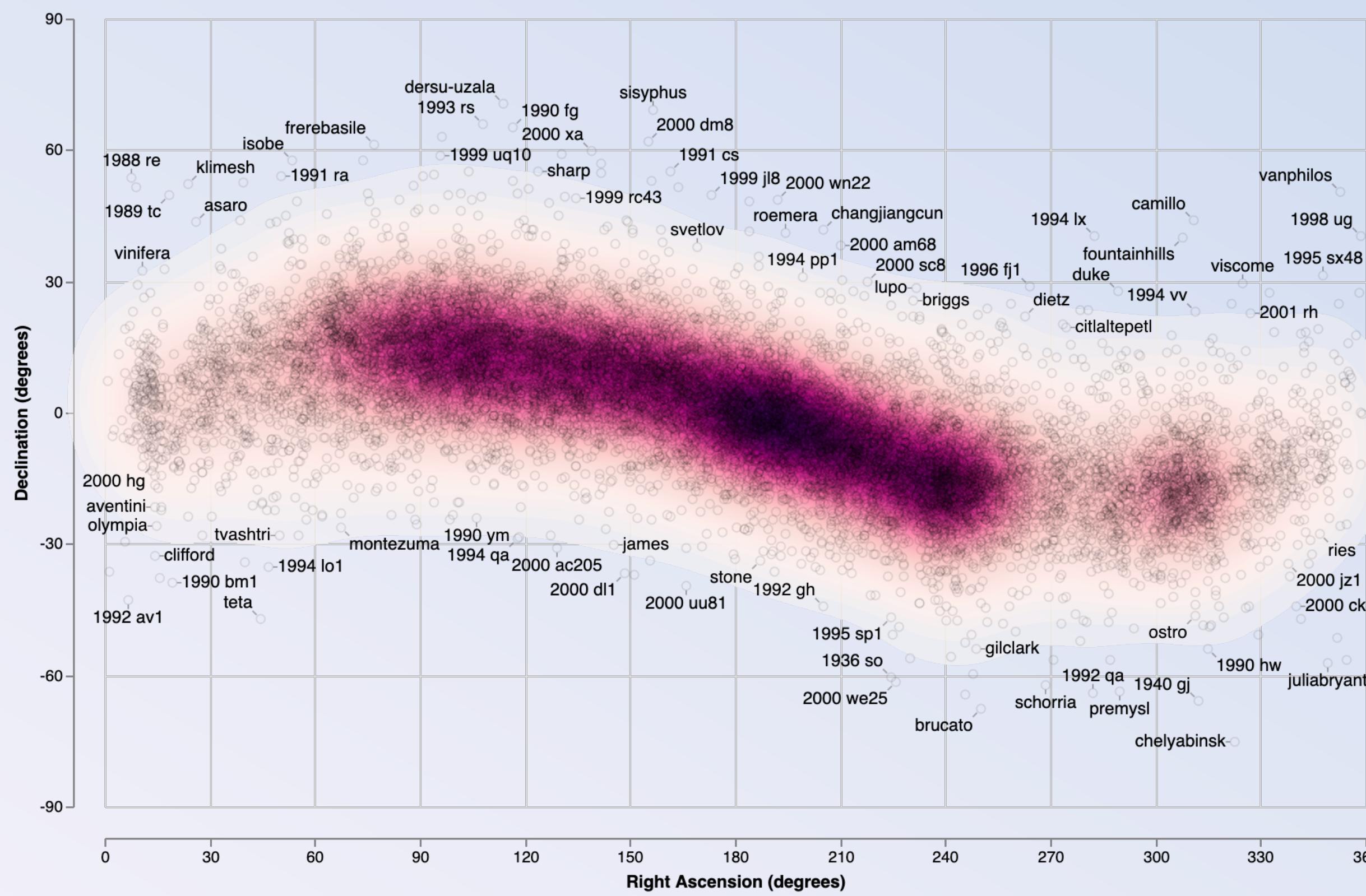
# Label collision detection

Source: Moritz et el, Vega-label (2018-2020)



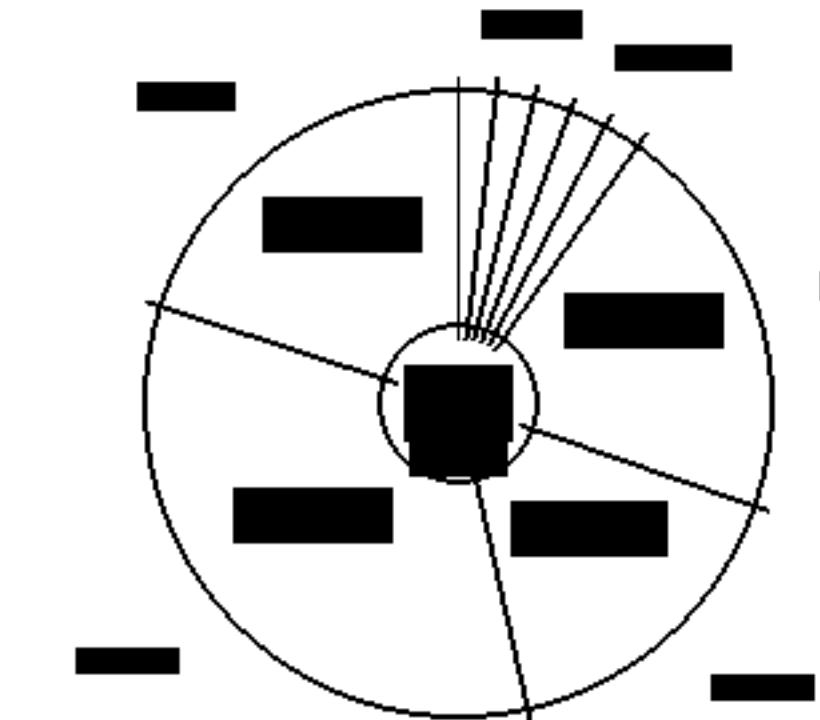
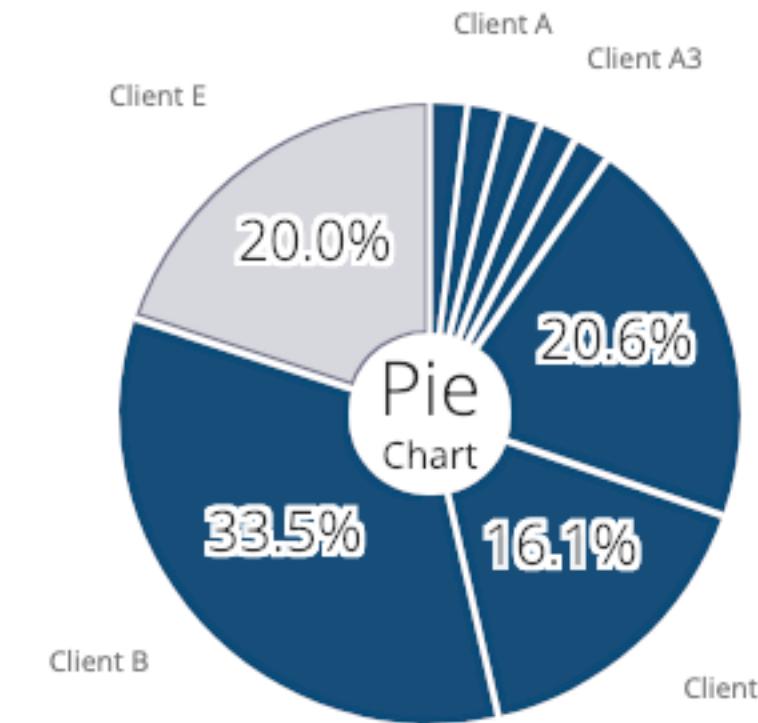
# Label collision detection

Source: Moritz et el, Vega-label (2018-2020)



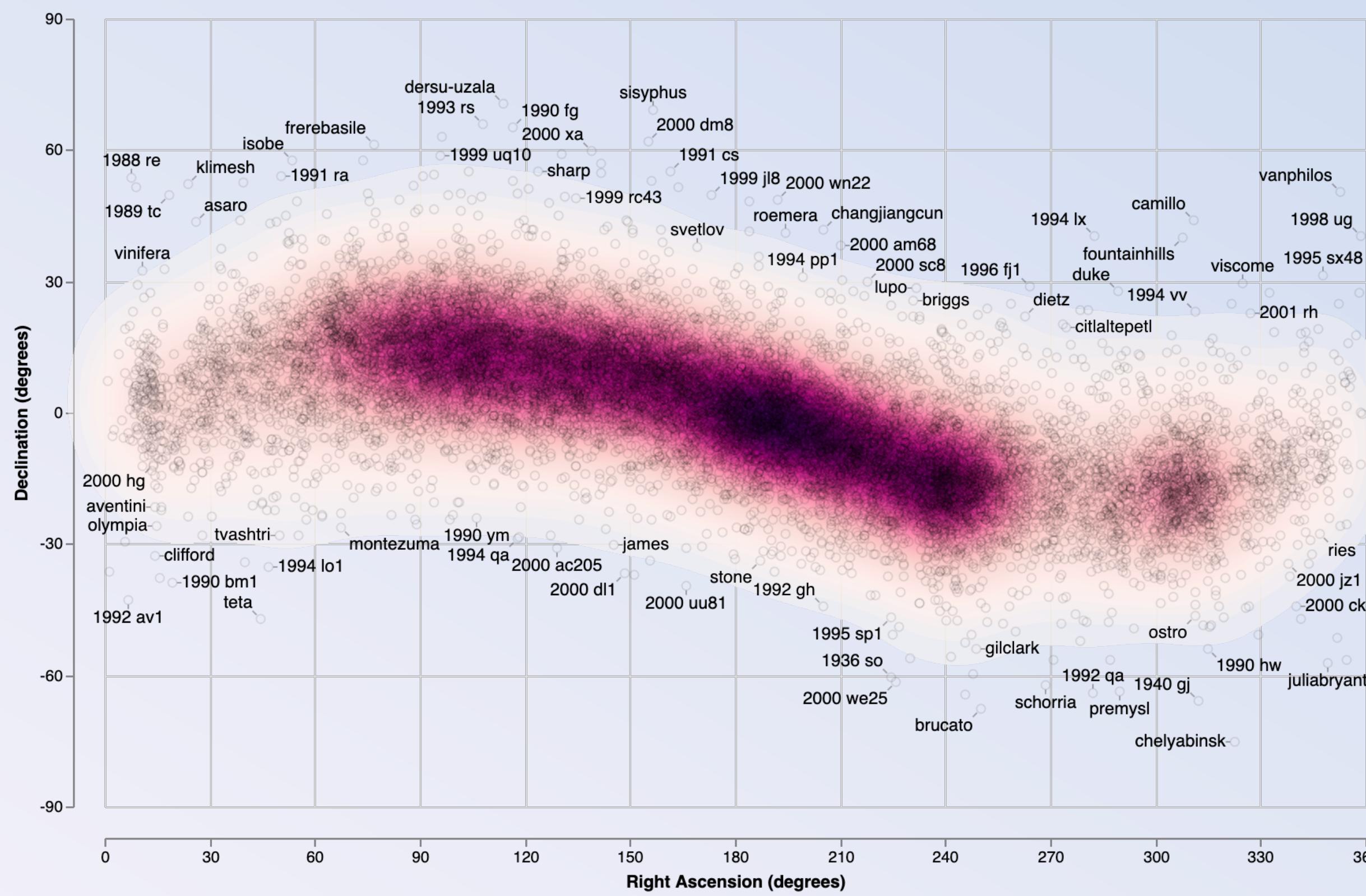
## Label Collision

VCC leverages Vega-Label's Occupancy Bitmap approach to handle label overlapping issues.



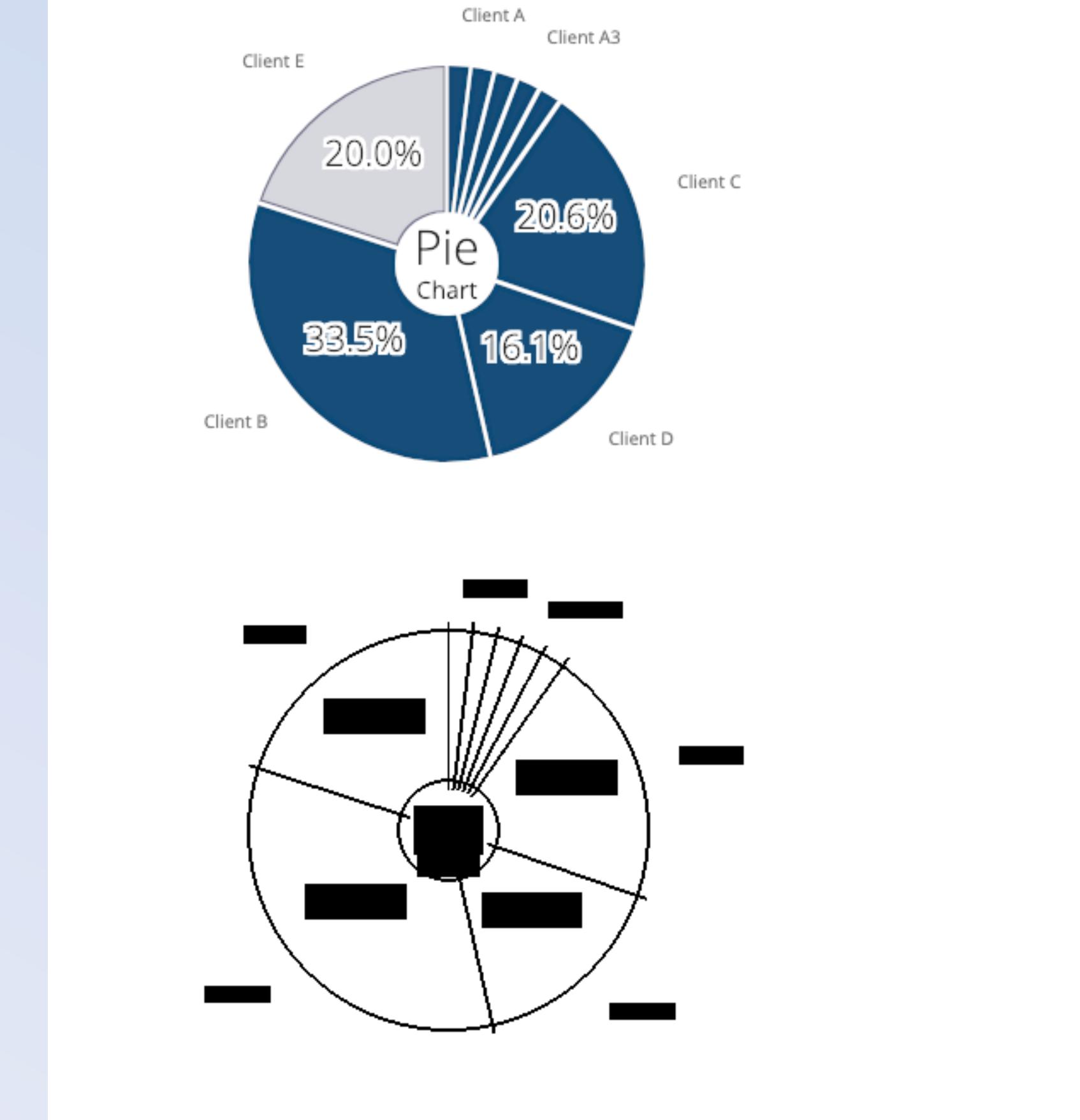
# Label collision detection

Source: Moritz et el, Vega-label (2018-2020)



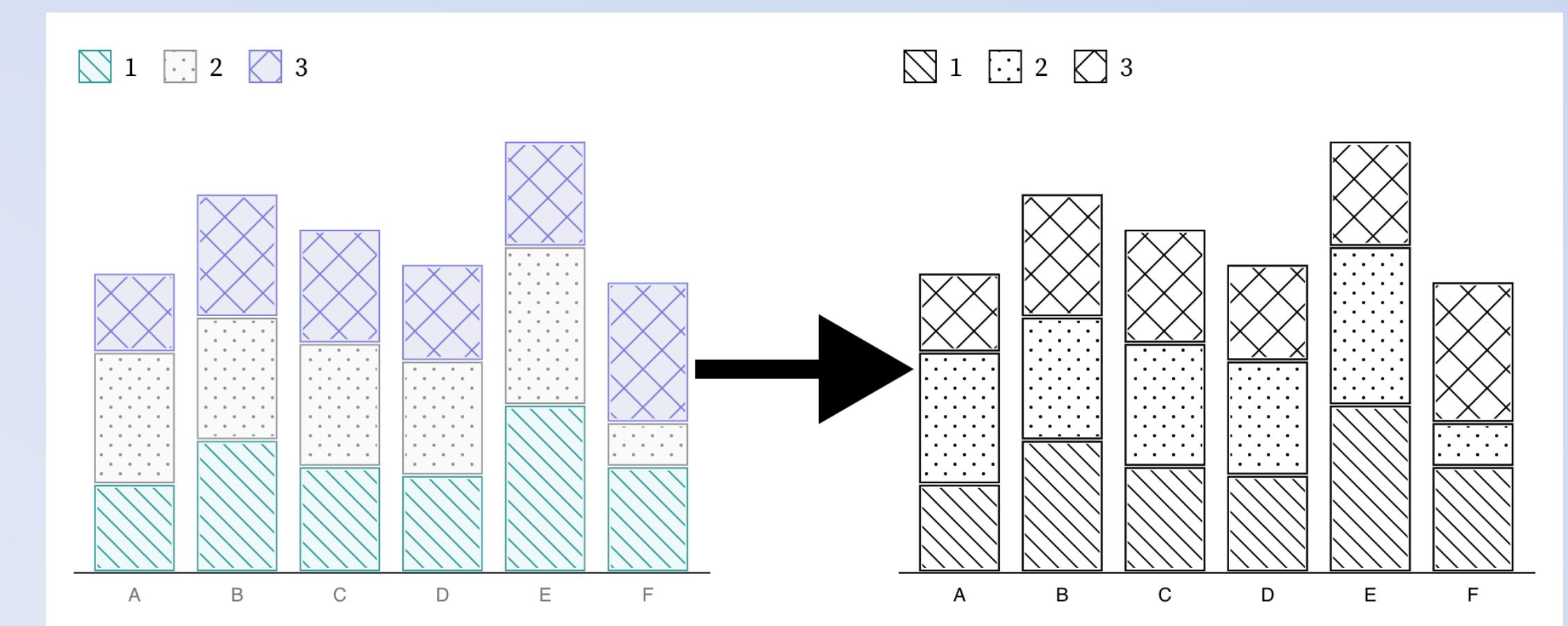
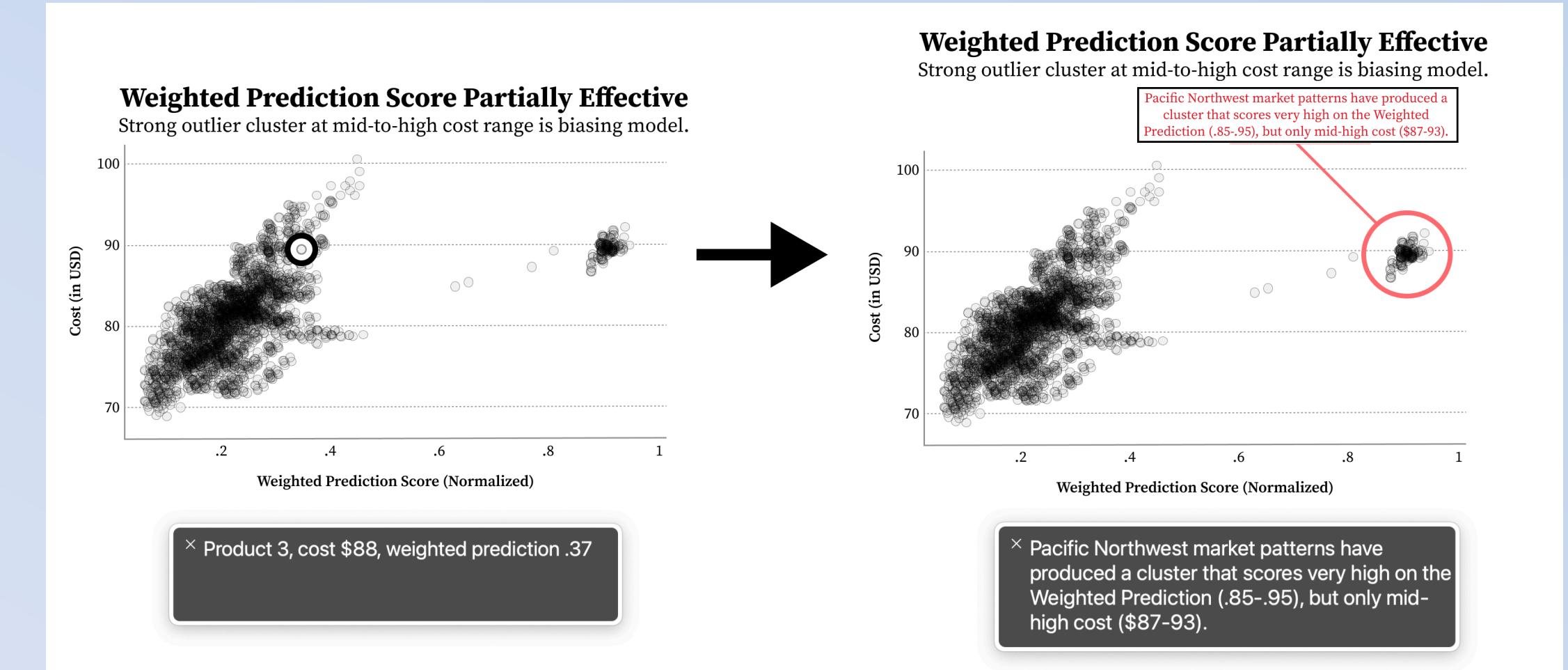
## Label Collision

VCC leverages Vega-Label's Occupancy Bitmap approach to handle label overlapping issues.



# Check out Chartability for more

- Perceivable
- Operable
- Understandable
- Robust
- Compromising
- Assistive
- Flexible



Chartability

YOW! 2025

[frank.computer](http://frank.computer)

★Slides here

# From Charted to Uncharted Territory

Accessibility and Interactive Data Experiences



Frank Elavsky



Human-  
Computer  
Interaction  
Institute

[hcii.cmu.edu](http://hcii.cmu.edu), [axle-lab.com](http://axle-lab.com), [dig.cmu.edu](http://dig.cmu.edu)

