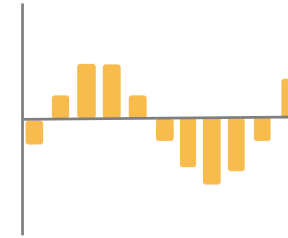
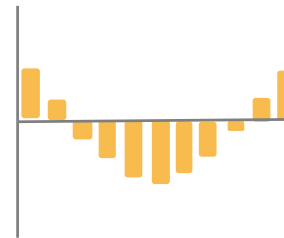
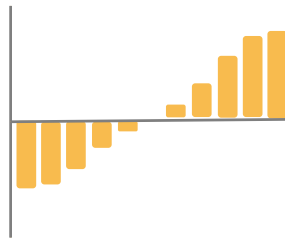


Crafting Impactful Data Stories

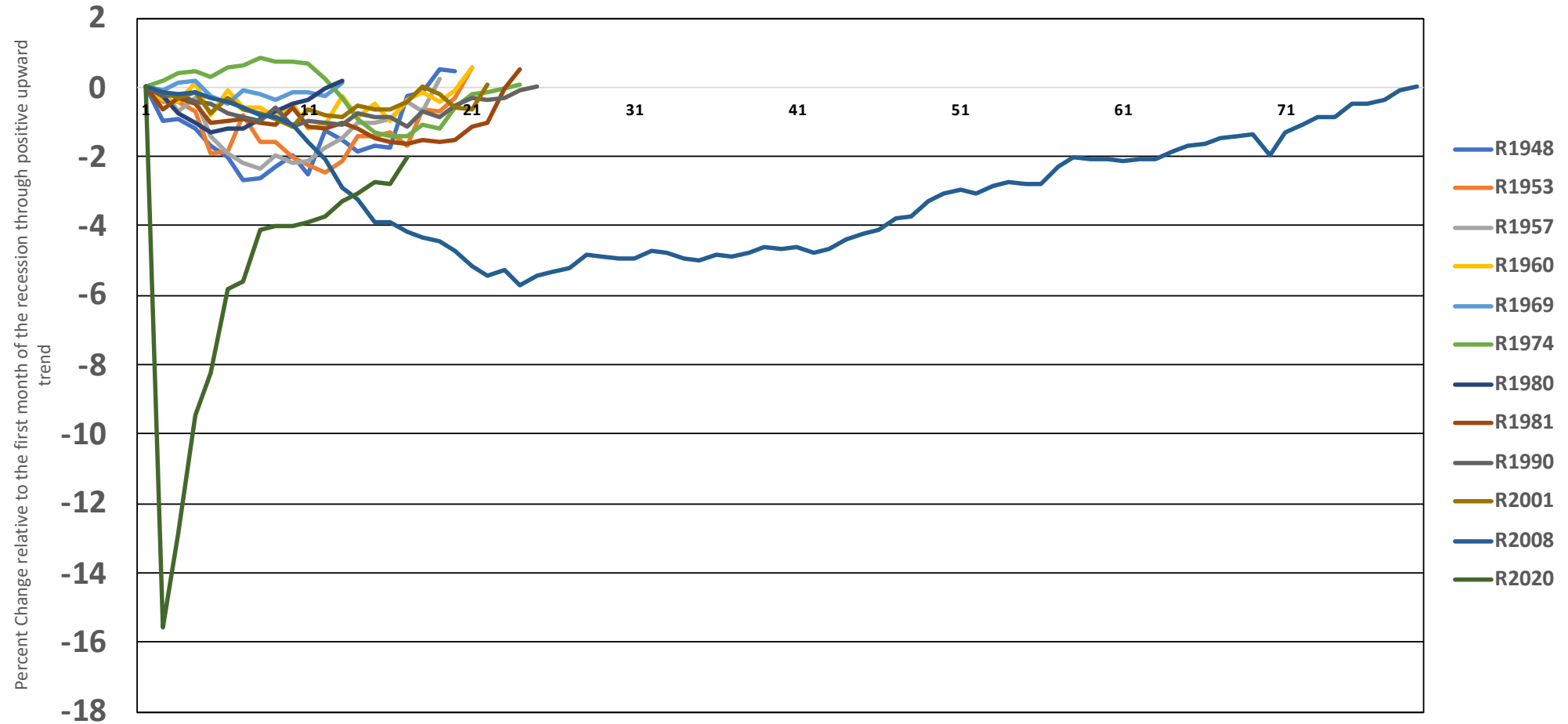
AUBER 2024 Workshop



Design Principles
Charts + Exploration
Storytelling

Let's begin with an example...

Job Loss during Post-WWII Recessions



Source: Bureau of Labor Statistics

HomeInsertDrawPage LayoutFormulasDataReviewViewAcrobat

PivotTable

Recommended PivotTables

Table

Illustrations

Get Add-ins

My Add-ins

Recommended Charts

Maps

PivotChart

Sparklines

Slicer

Timeline

Link

New Comment

Text

Symbols

Share

A1

fx

Months

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S	T
1	Months	Job-Losses	Recession																	
2	0	0	R1948																	
3	1	-0.9618659	R1948																	
4	2	-0.9056861	R1948																	
5	3	-1.186585	R1948																	
6	4	-1.6905005	R1948																	
7	5	-2.0224719	R1948																	
8	6	-2.6693905	R1948																	
9	7	-2.638747	R1948																	
10	8	-2.2863466	R1948																	
11	9	-1.9679946	R1948																	
12	10	-2.504256	R1948																	
13	11	-1.2444671	R1948																	
14	12	-1.5236636	R1948																	
15	13	-1.8811713	R1948																	
16	14	-1.6836908	R1948																	
17	15	-1.7228464	R1948																	
18	16	-0.2672795	R1948																	
19	17	-0.15492	R1948																	
20	18	0.53115424	R1948																	
21	19	0.44433095	R1948																	
22	0	0	R1953																	
23	1	-0.4006476	R1953																	
24	2	-0.4219064	R1953																	
25	3	-0.6753773	R1953																	
26	4	-1.9198378	R1953																	
27	5	-1.8429789	R1953																	
28	6	-0.7980246	R1953																	
29	7	-1.5780609	R1953																	
30	8	-1.5780609	R1953																	

data

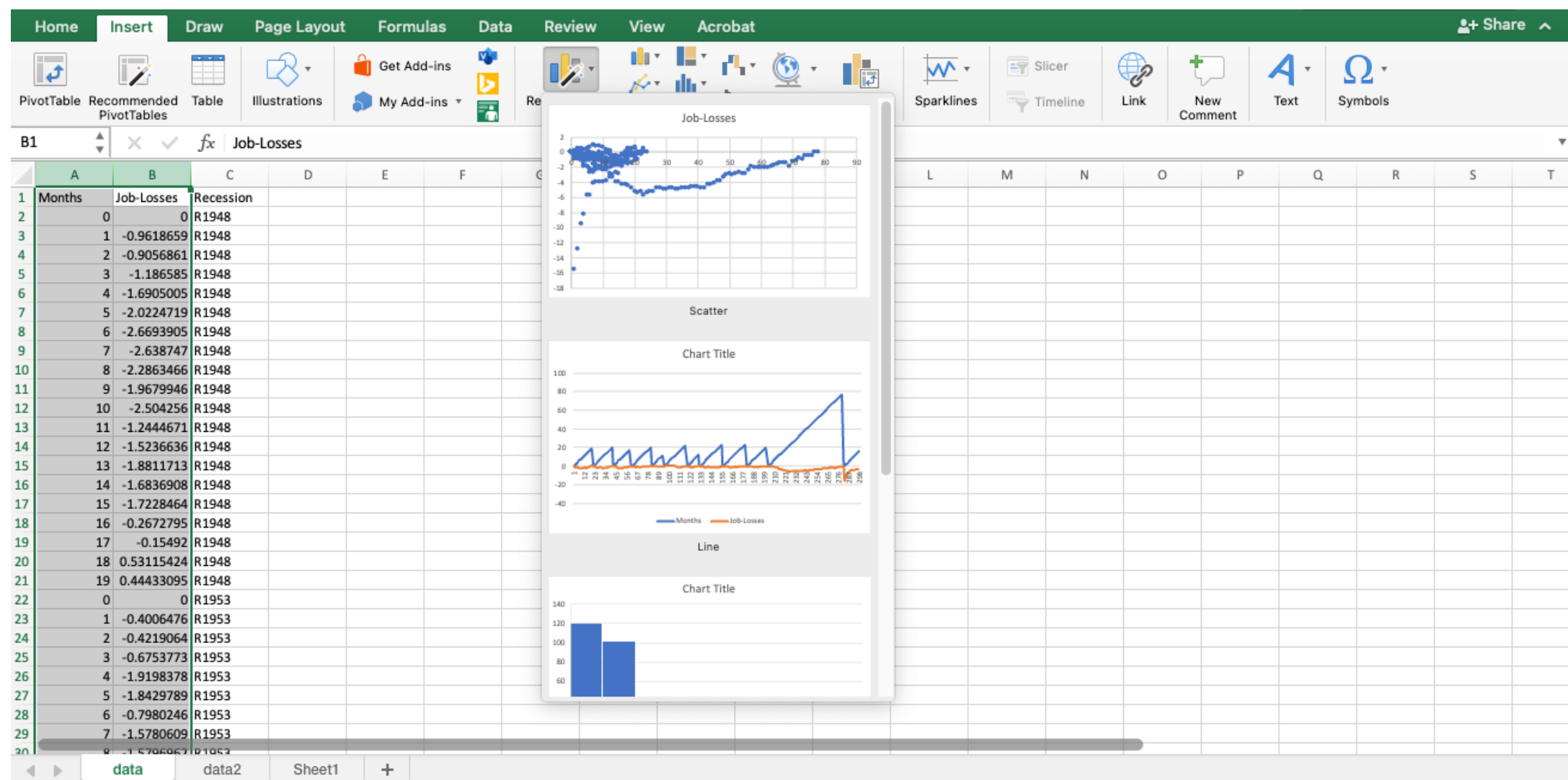
data2

Sheet1

+

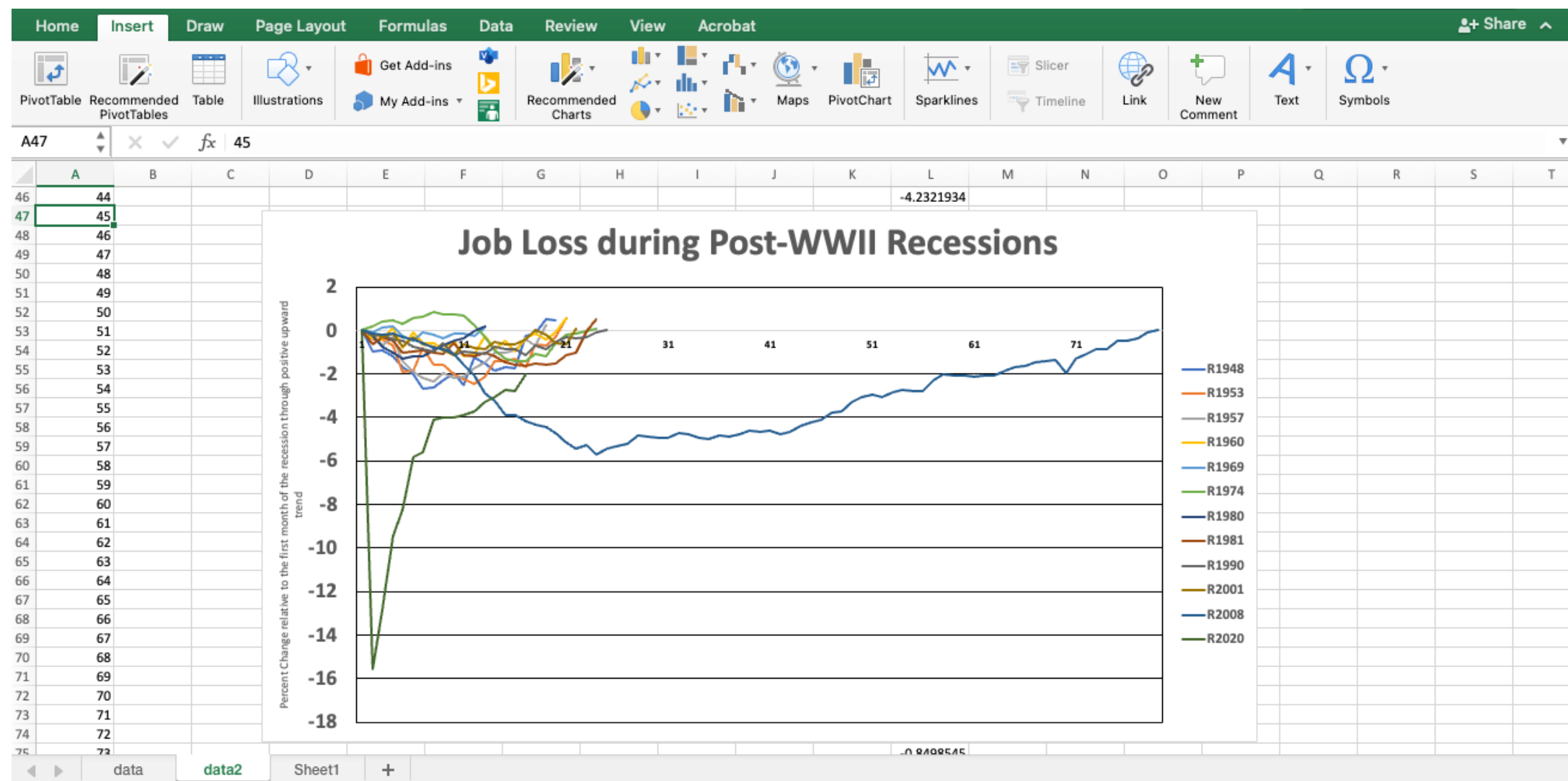
Traditional Data Visualization Process

Step 2: Ask for Excel for a recommendation



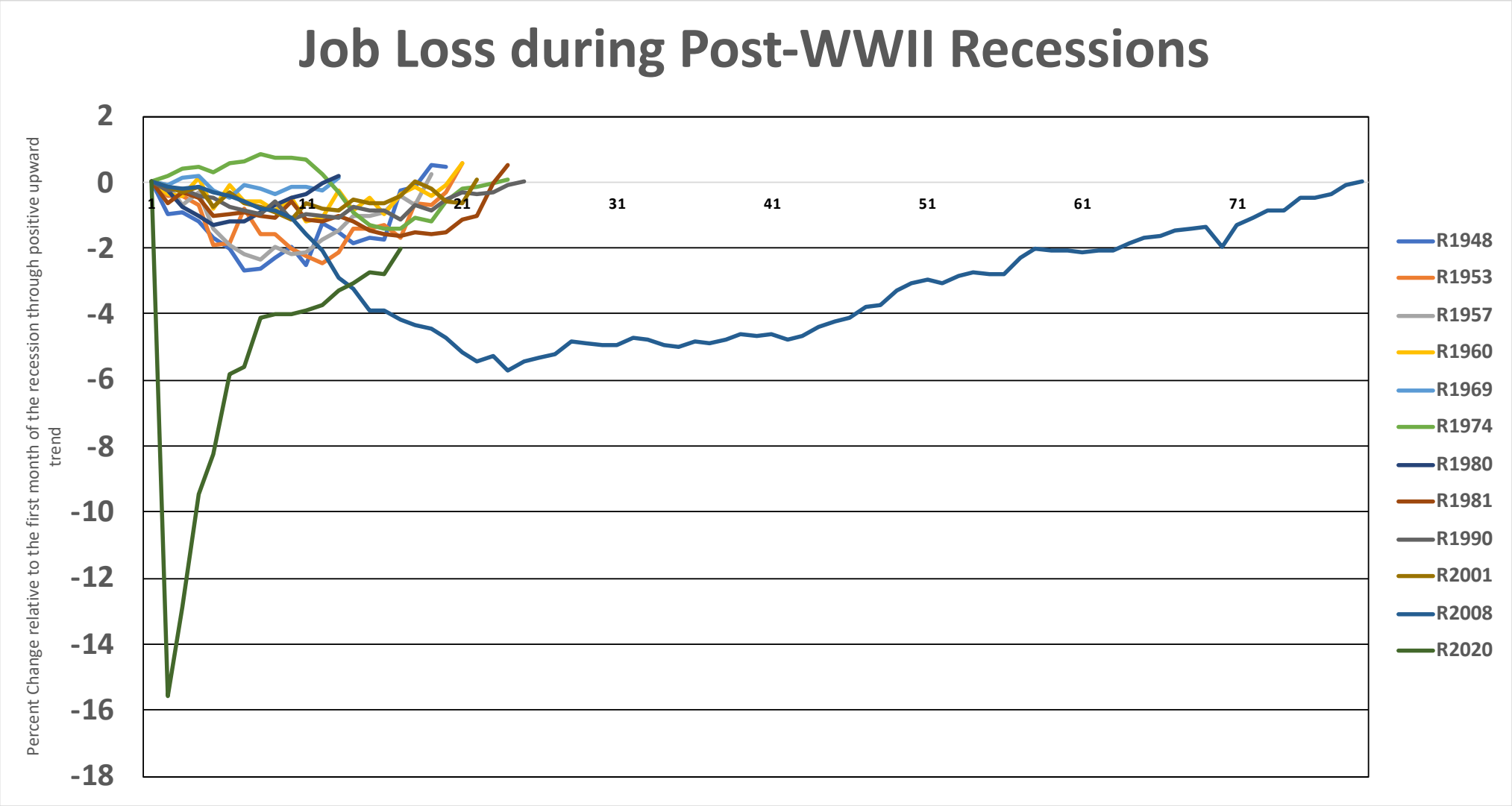
Traditional Data Visualization Process

Step 3: Change labels, titles, formatting



Traditional Data Visualization Process

Step 4: Copy and paste for output

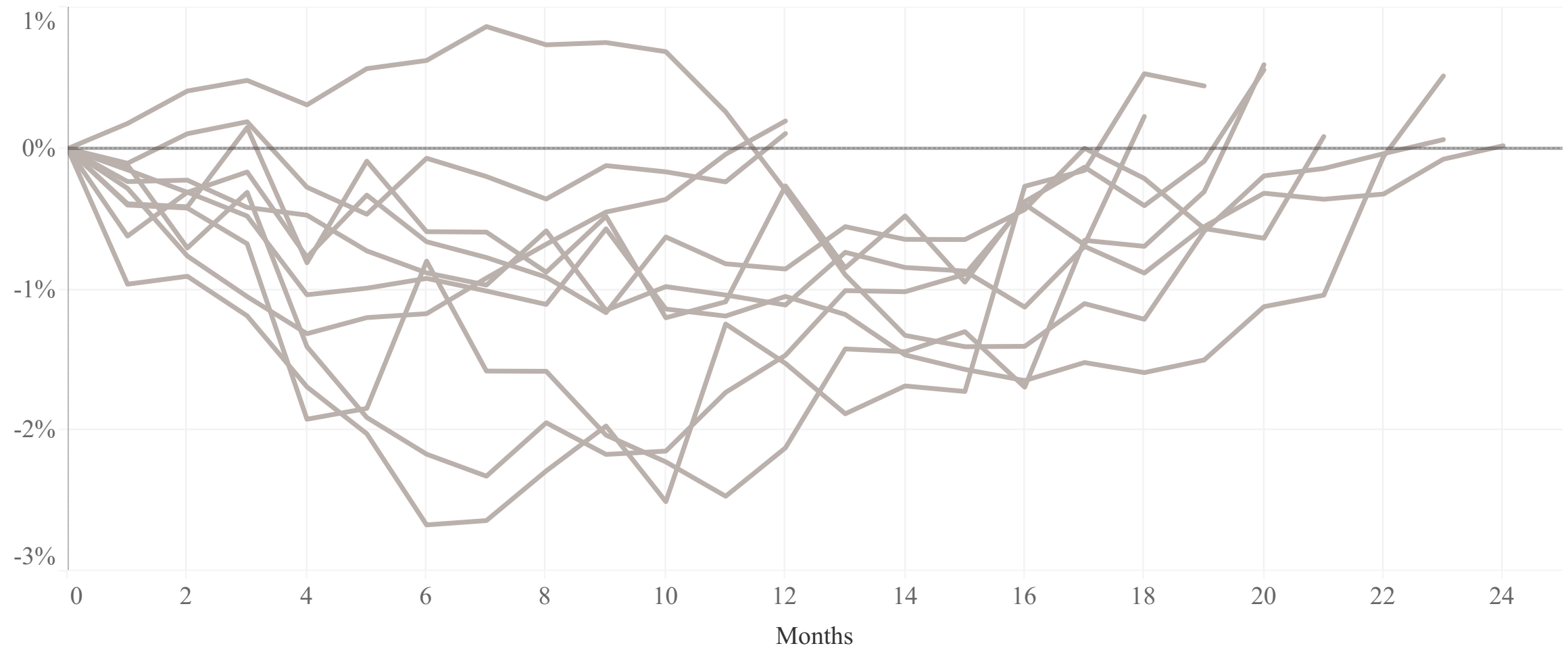


Source: Bureau of Labor Statistics

Is there a better way to tell
the story with this data?

Job Losses during post-WWII Recessions

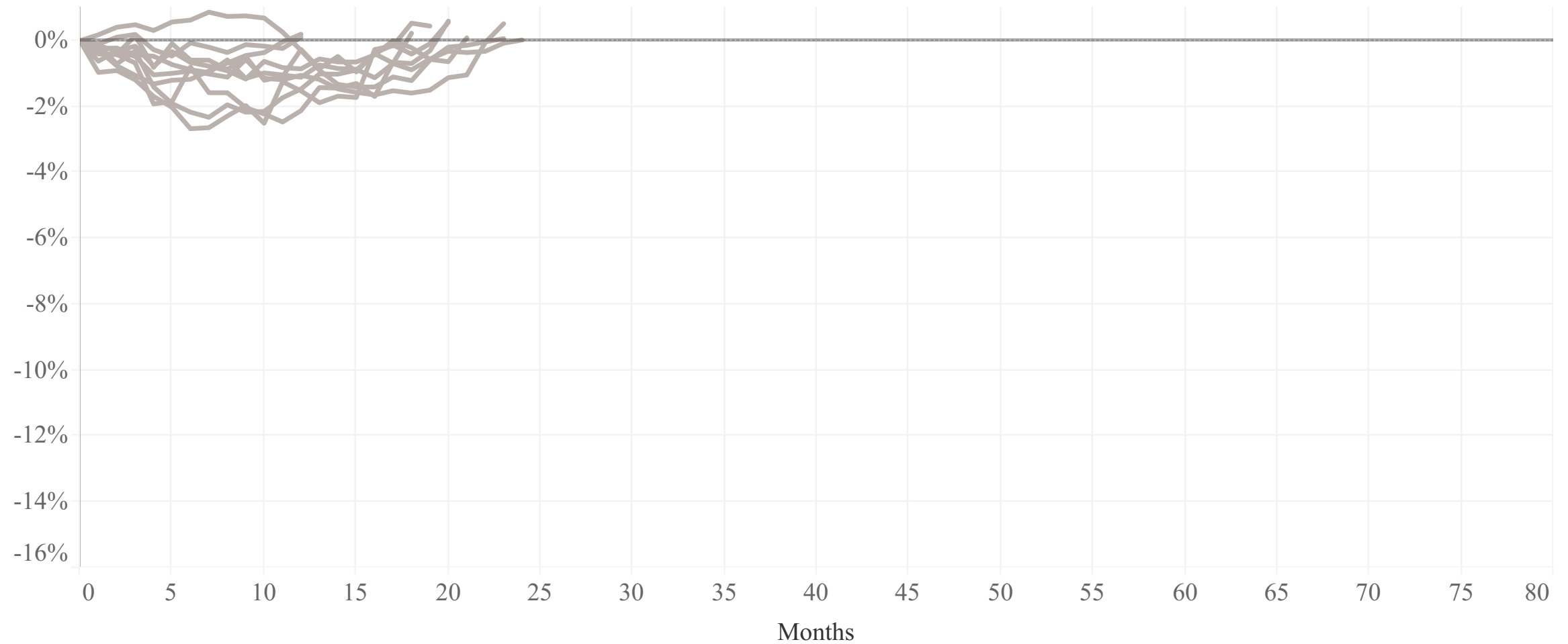
Percent change relative to first month of a recession through the beginning of positive trend (updated through July 2021)



Source: Bureau of Labor Statistics

Job Losses during post-WWII Recessions | Typical recessions last between 18-24 months

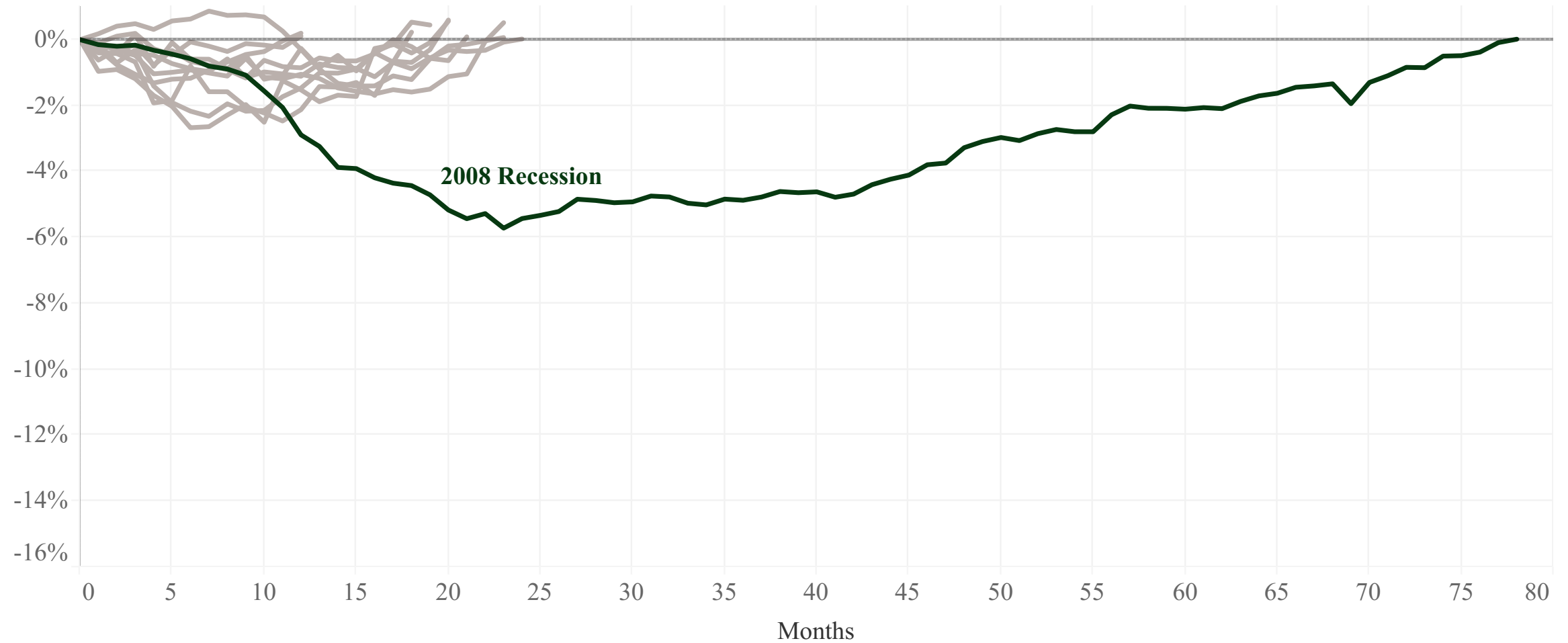
Percent change relative to first month of a recession through the beginning of positive trend (updated through July 2021)



Source: Bureau of Labor Statistics

Job Losses during post-WWII Recessions | The 2008 recession added length

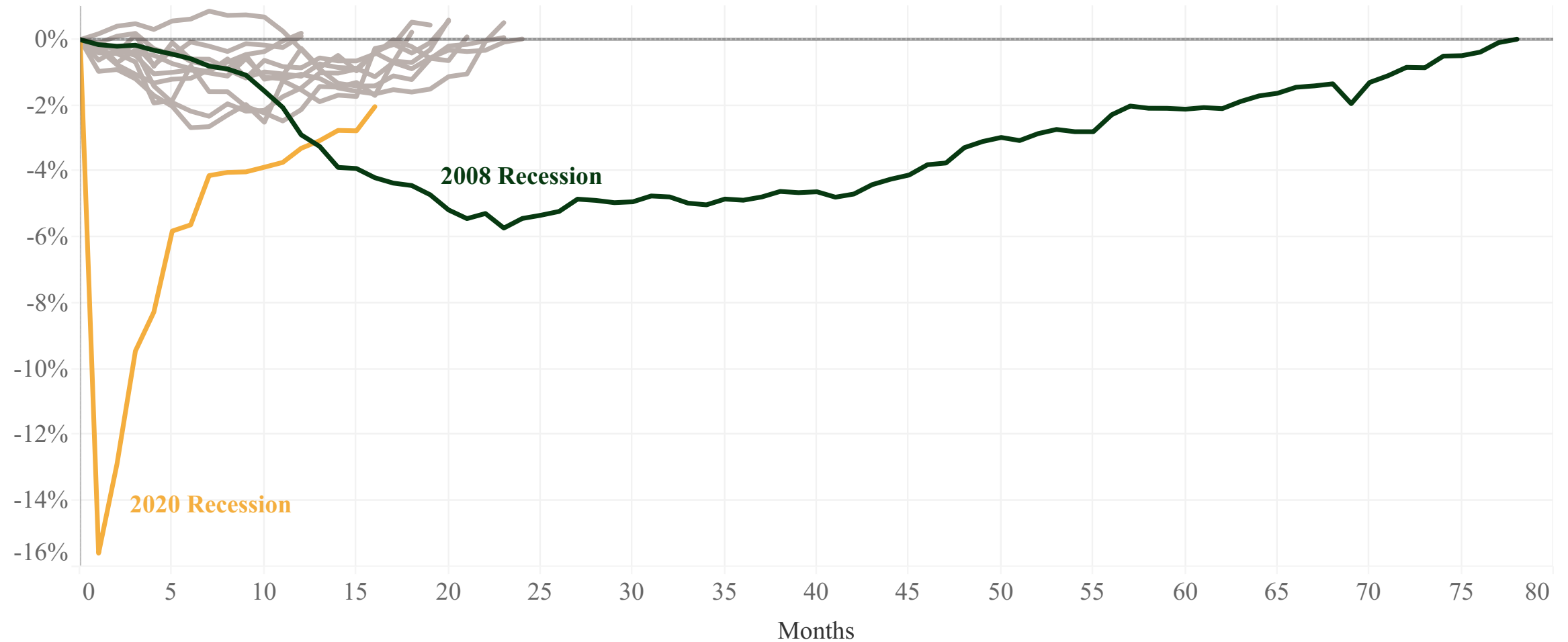
Percent change relative to first month of a recession through the beginning of positive trend (updated through July 2021)



Source: Bureau of Labor Statistics

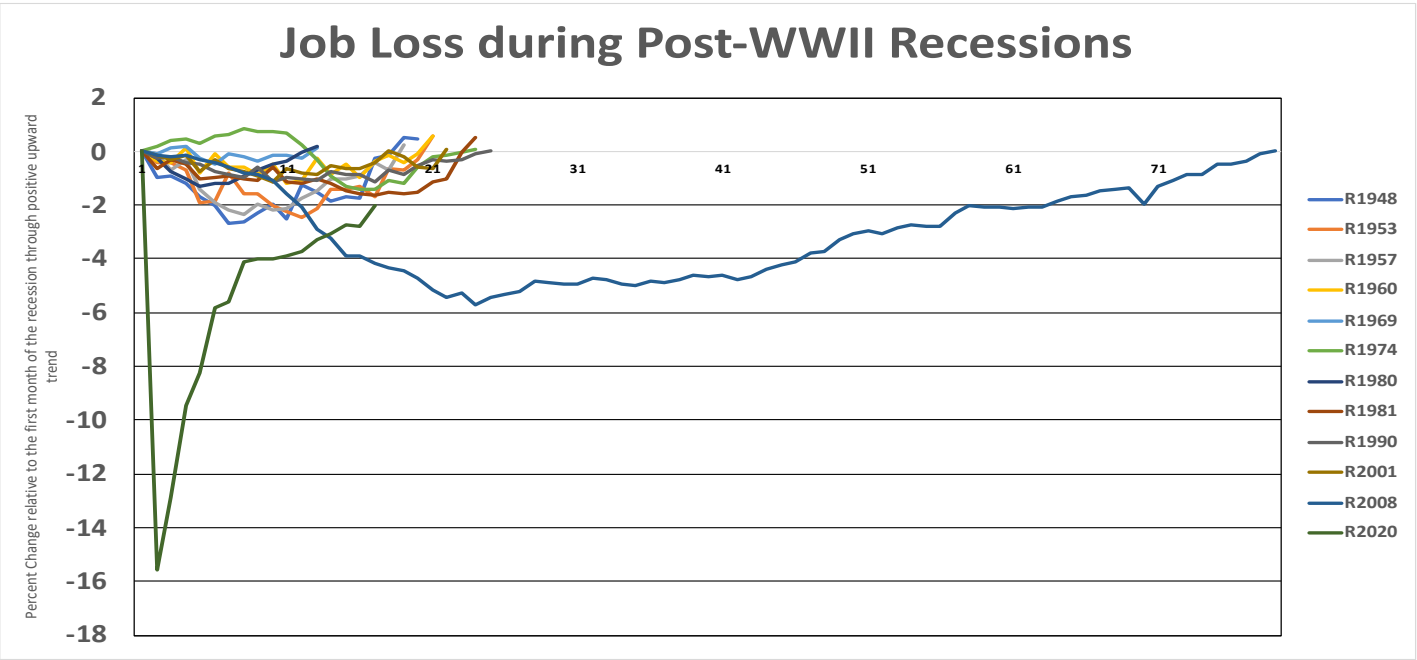
Job Losses during post-WWII Recessions | The 2020 recession added depth

Percent change relative to first month of a recession through the beginning of positive trend (updated through July 2021)

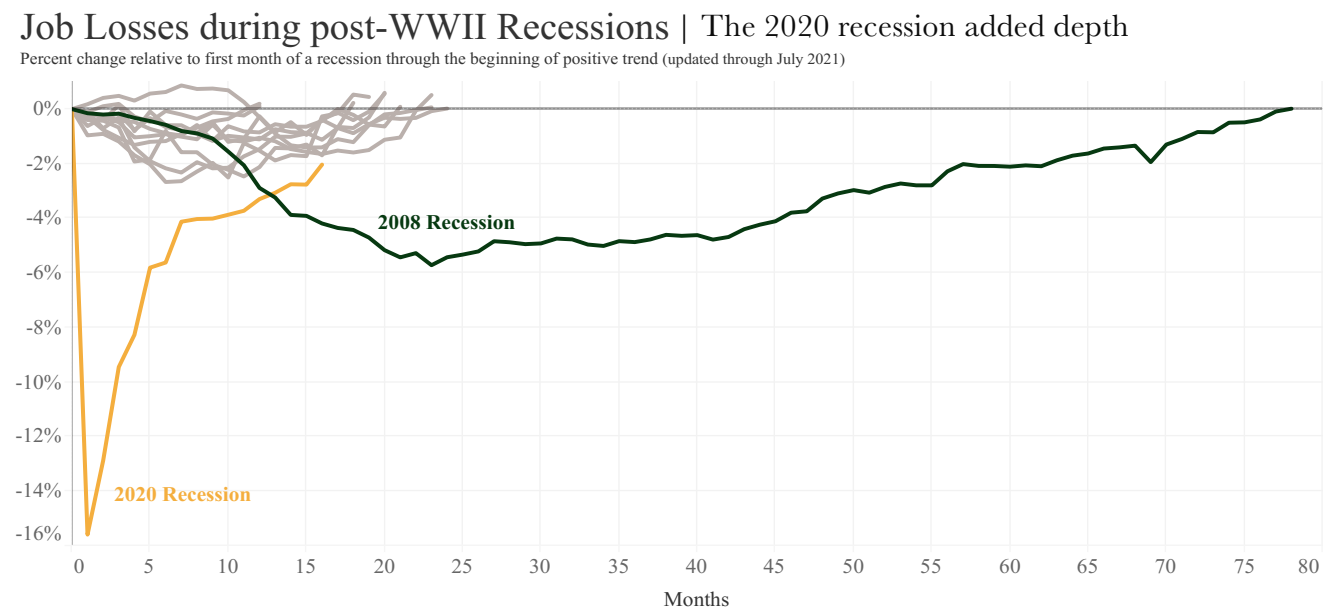


Source: Bureau of Labor Statistics

Before



After



Crafting Impactful Data Stories:

Design Principles
Exploration + Conception
Storytelling



Agenda

Data Visualization Design Principles

Chart Types + EDA

Break

Storytelling

Takeaways

Crafting Impactful Data Stories:

Design Principles
Exploration + Conception
Storytelling



Agenda

Data Visualization Design Principles

Chart Types + EDA

Break

Storytelling

Takeaways

Crafting Impactful Data Stories: Design Principles

No.1 Why we Visualize

No.2 Psychology + Visual Perception

No.3 Data Visualization Process

Think | Sketch | Create | Articulate

No.4 Case Study

No.5 Takeaways

Crafting Impactful Data Stories: Design Principles

No.1 Why we Visualize

No.2 Psychology + Visual Perception

No.3 Data Visualization Process

Think | Sketch | Create | Articulate

No.4 Case Study

No.5 Takeaways

Why do we visualize?

X1	Y1
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

X2	Y2
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	9.13
7	7.26
5	4.74

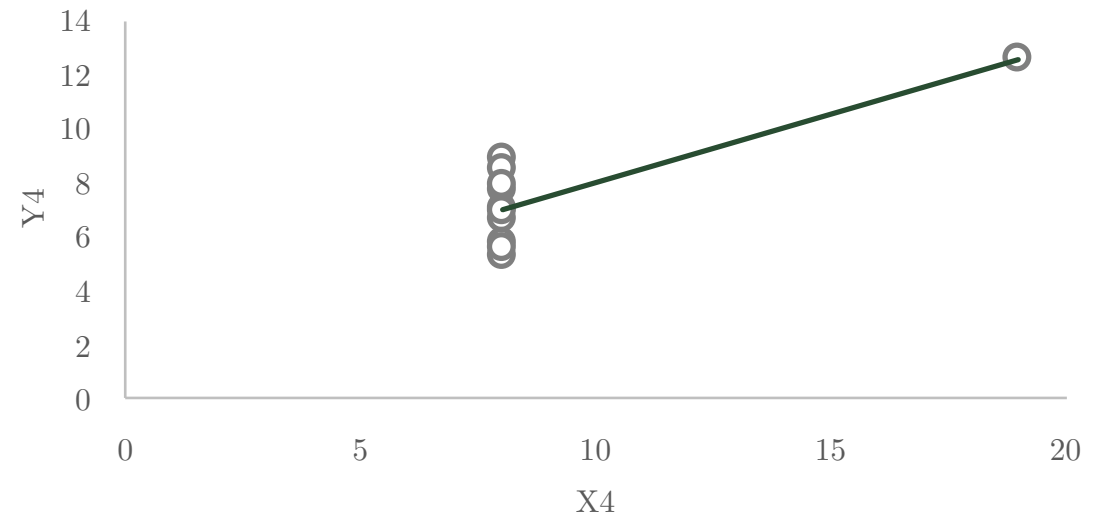
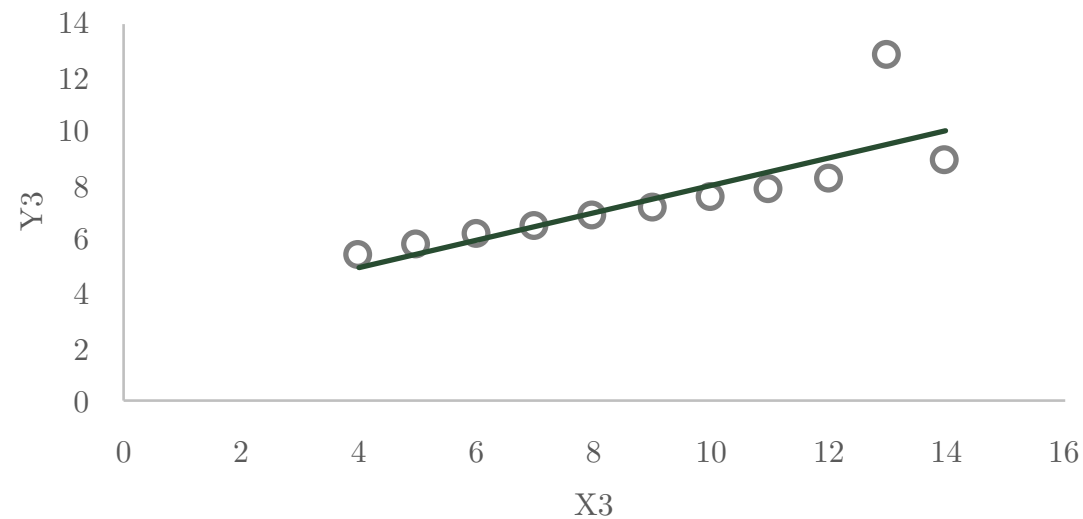
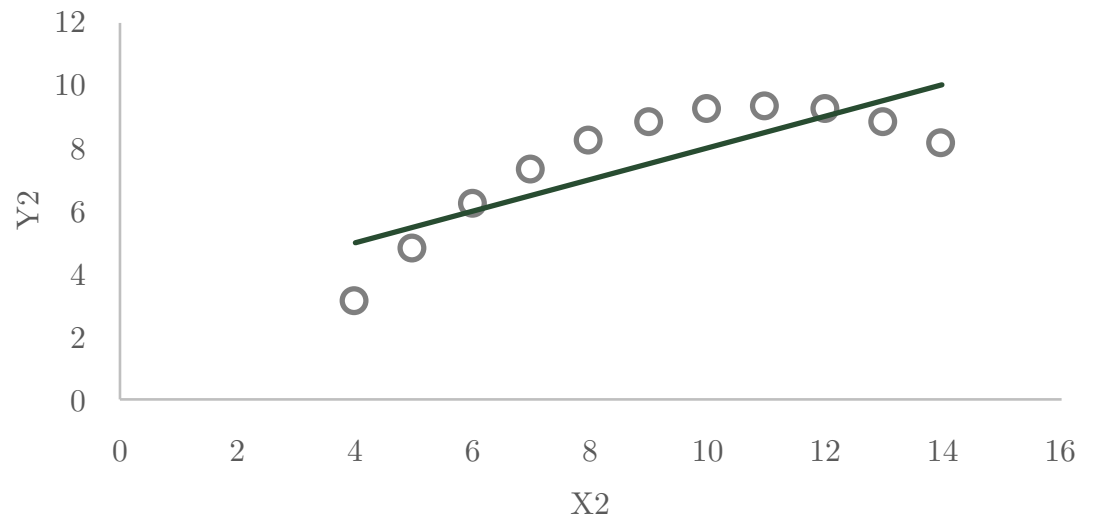
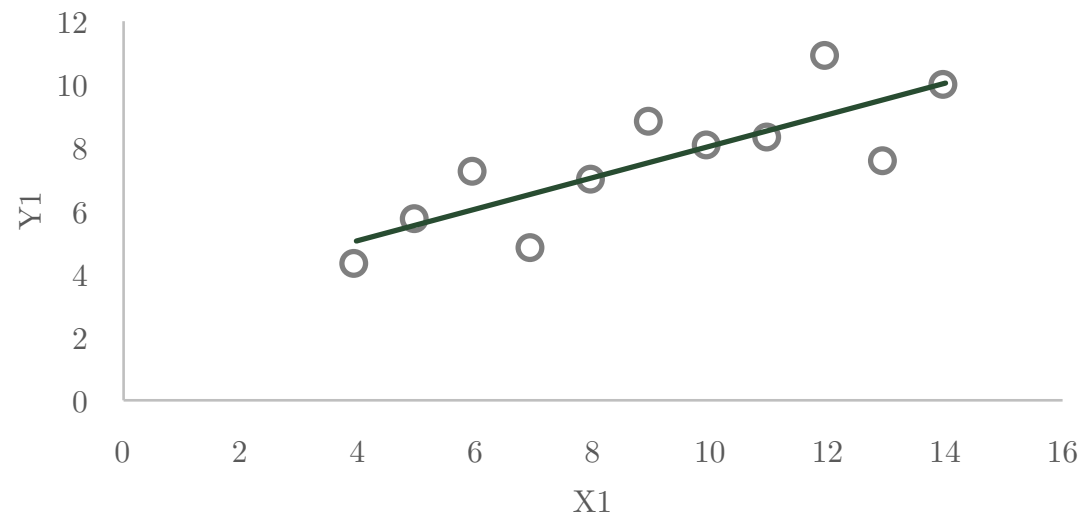
X3	Y3
10	7.46
8	6.77
13	12.74
9	7.11
11	7.81
14	8.84
6	6.08
4	5.39
12	8.15
7	6.42
5	5.73

X4	Y4
8	6.58
8	5.76
8	7.71
8	8.84
8	8.47
8	7.04
8	5.25
8	5.56
8	7.91
8	6.89
19	12.5

Why do we visualize?

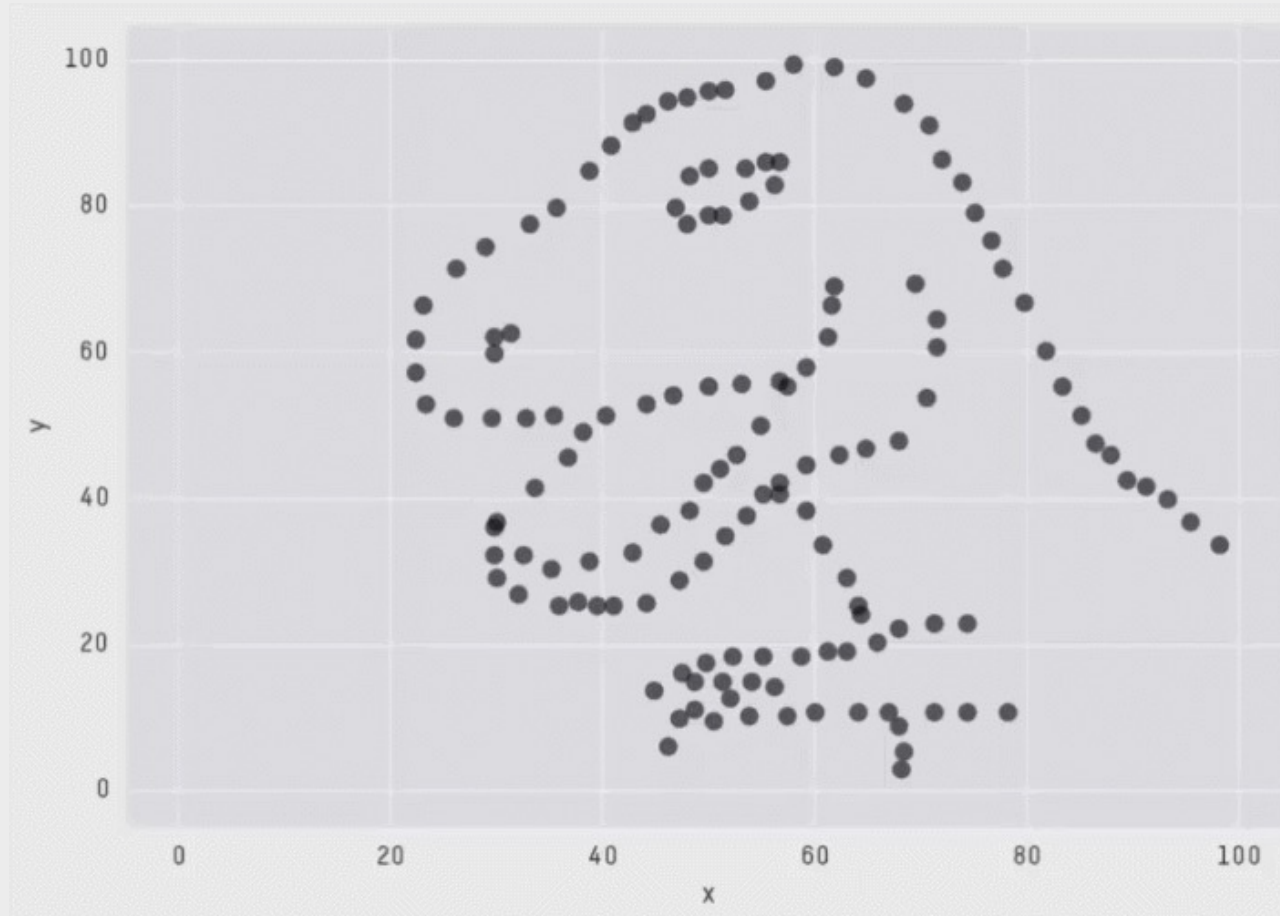
Variables	X1	Y1	X2	Y2	X3	Y3	X4	Y4
Mean	9.00	7.50	9.00	7.50	9.00	7.50	9.00	7.50
Median	9.00	7.58	9.00	8.14	9.00	7.11	8.00	7.04
Std Deviation	3.32	2.03	3.32	2.03	3.32	2.03	3.32	2.03
Variance	11.00	4.13	11.00	4.13	11.00	4.12	11.00	4.12
Correlation	0.82		0.82		0.82		0.82	
Slope	0.50		0.50		0.50		0.50	
Intercept	3.00		3.00		3.00		3.00	

Why do we visualize?



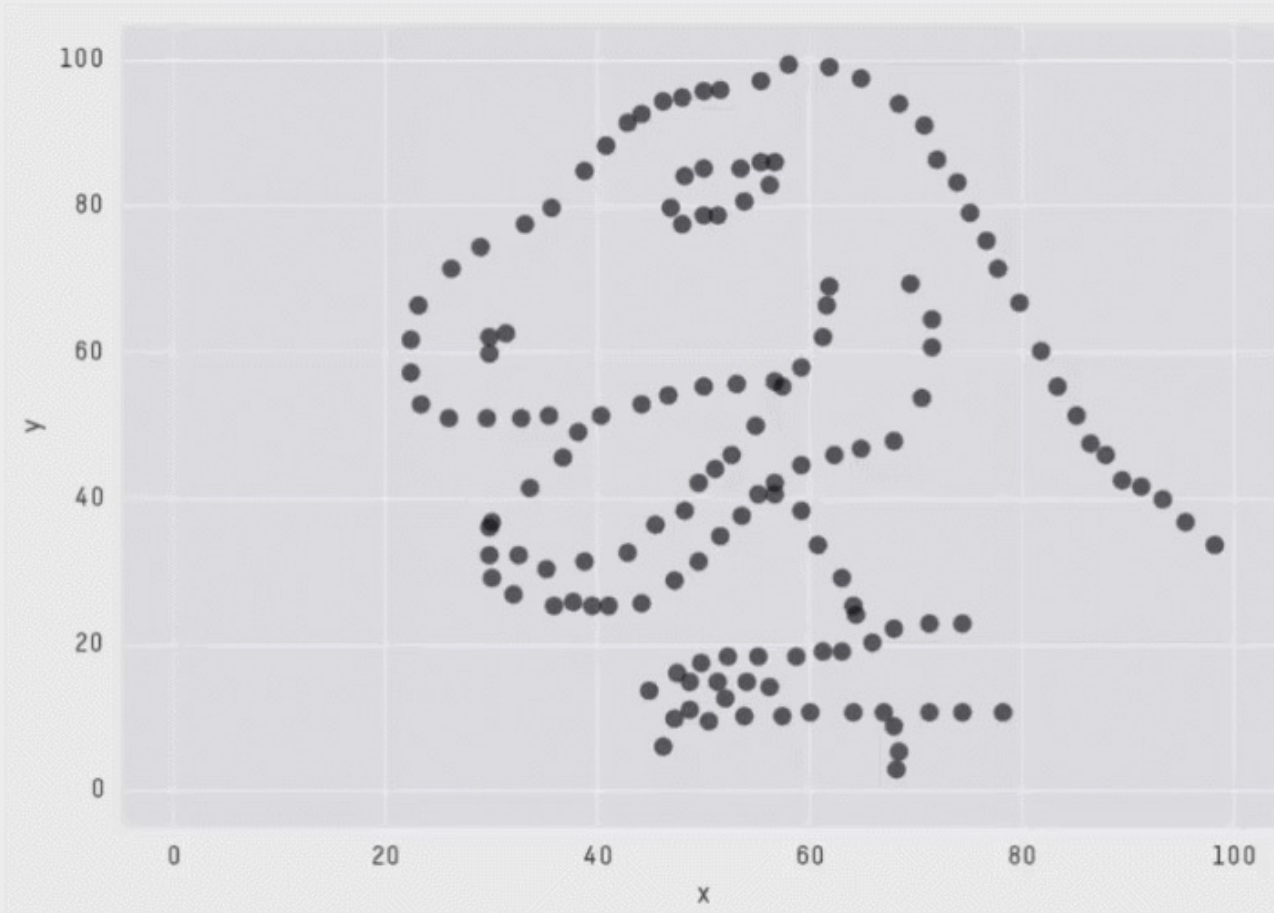
Source: F. J. Anscombe (1973) Graphs in Statistical Analysis, The American Statistician, 27:1, 17-21

Why do we visualize?



```
X Mean: 54.2659224
Y Mean: 47.8313999
X SD   : 16.7649829
Y SD   : 26.9342120
Corr.  : -0.0642526
```

Why do we visualize?



```
X Mean: 54.2659224
Y Mean: 47.8313999
X SD   : 16.7649829
Y SD   : 26.9342120
Corr.  : -0.0642526
```

Crafting Impactful Data Stories: Design Principles

No.1 Why we Visualize

No.2 Psychology + Visual Perception

No.3 Data Visualization Process

Think | Sketch | Create | Articulate

No.4 Case Study

No.5 Takeaways

Psychology + Visual Perception

No. 1 | What we See

No. 2 | Gestalt

No. 3 | Attributes

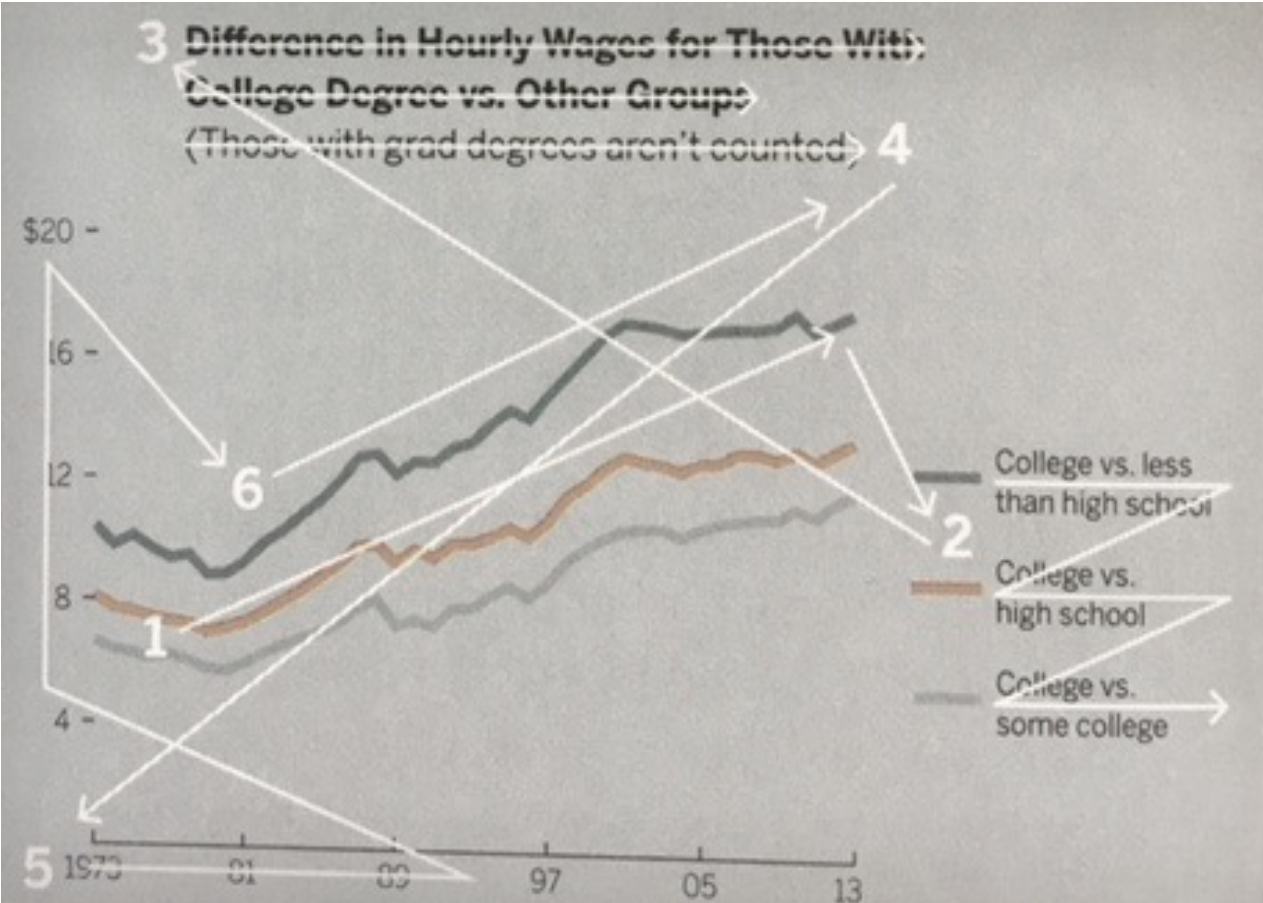
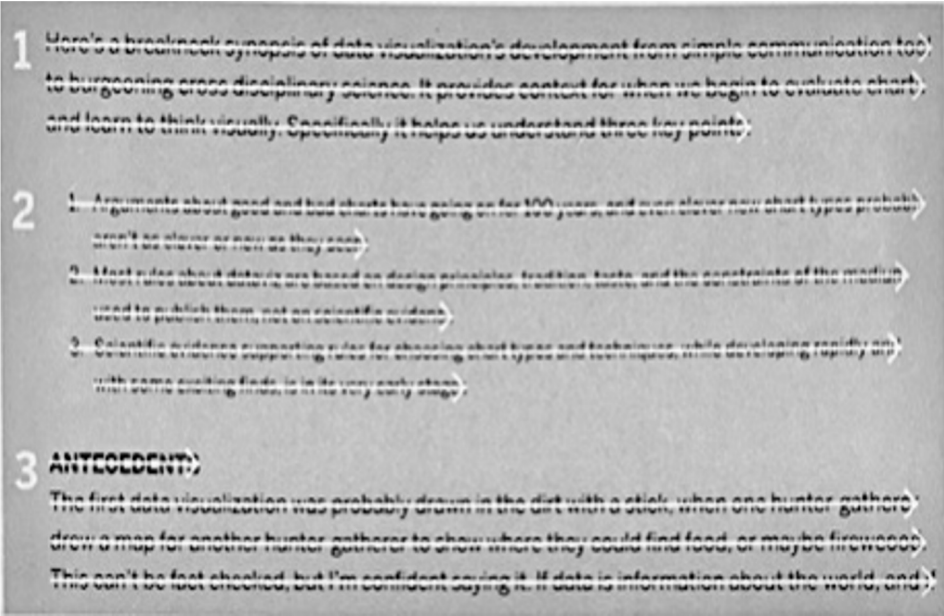
No. 1 | Visual Perception & What we See

When we see a chart, how do we see? Some considerations:

- We don't go in order.
- We see first what stands out.
- We can only see a few things at once.
- We seek meaning and make connections.
- We rely on conventions and metaphors.

No. 1 | Visual Perception & What we See

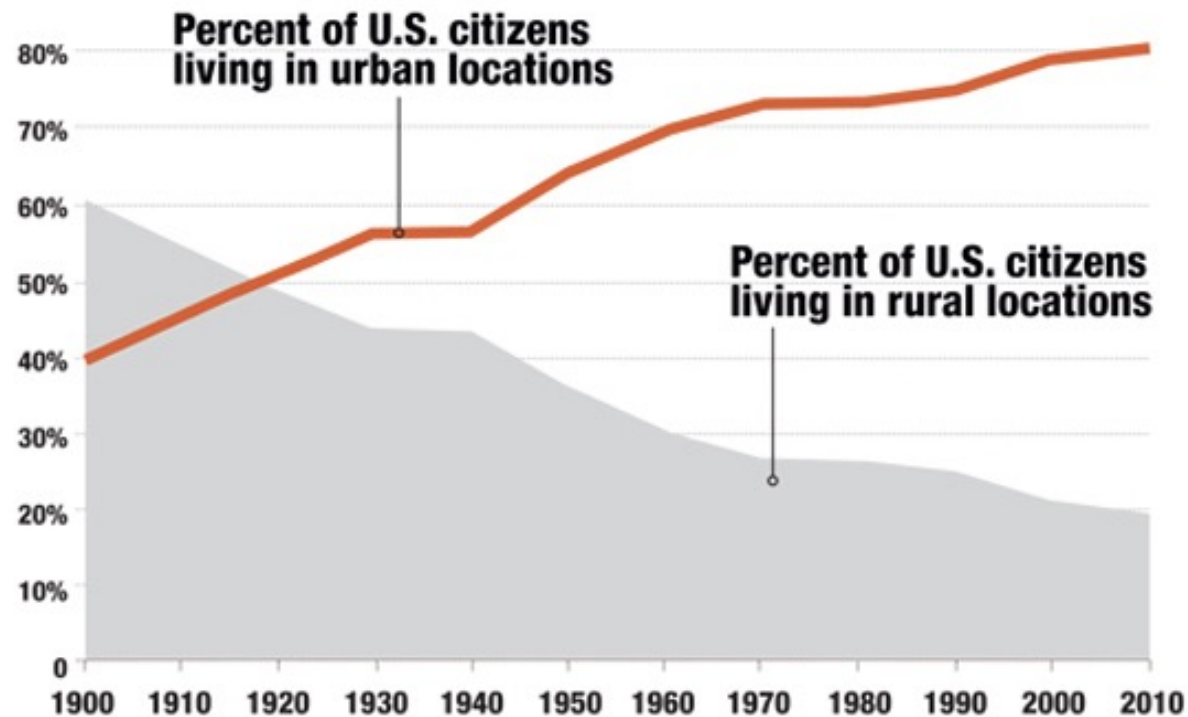
We don't go in order.



No. 1 | Visual Perception & What we See

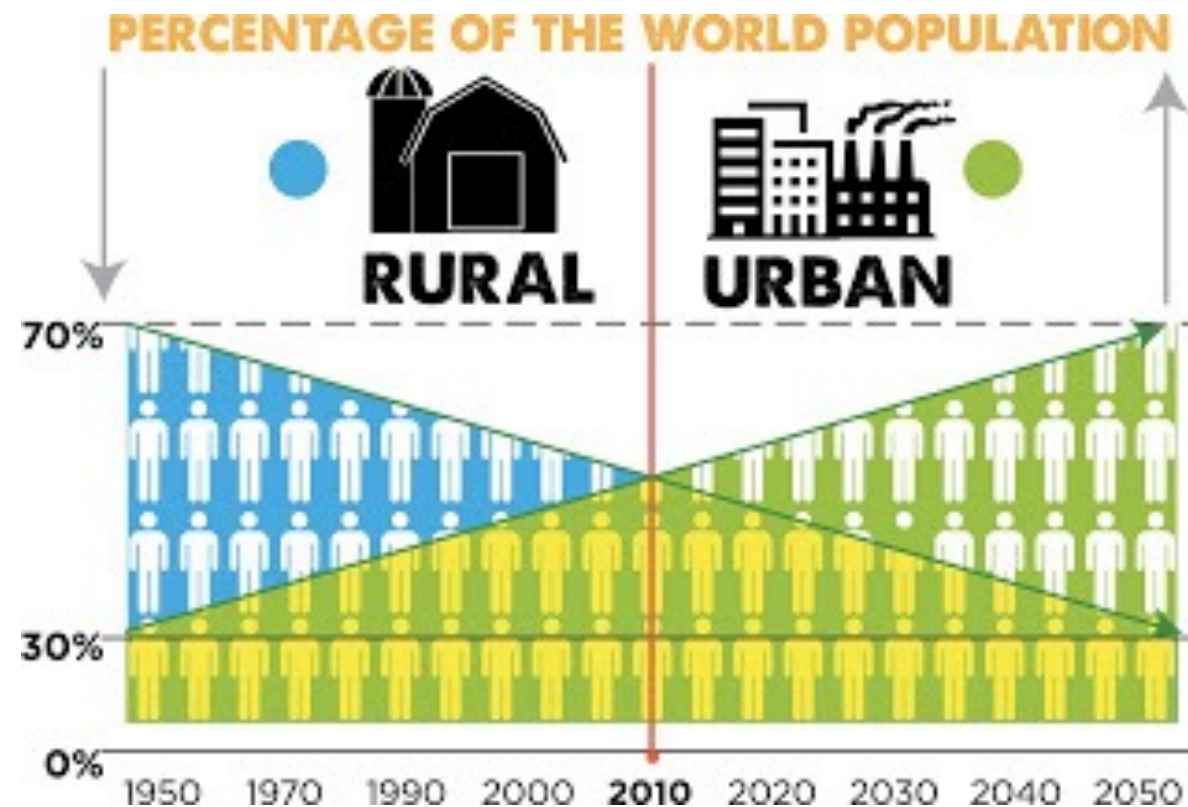
We see first
what stands
out.

Out of the Countryside, Into the City



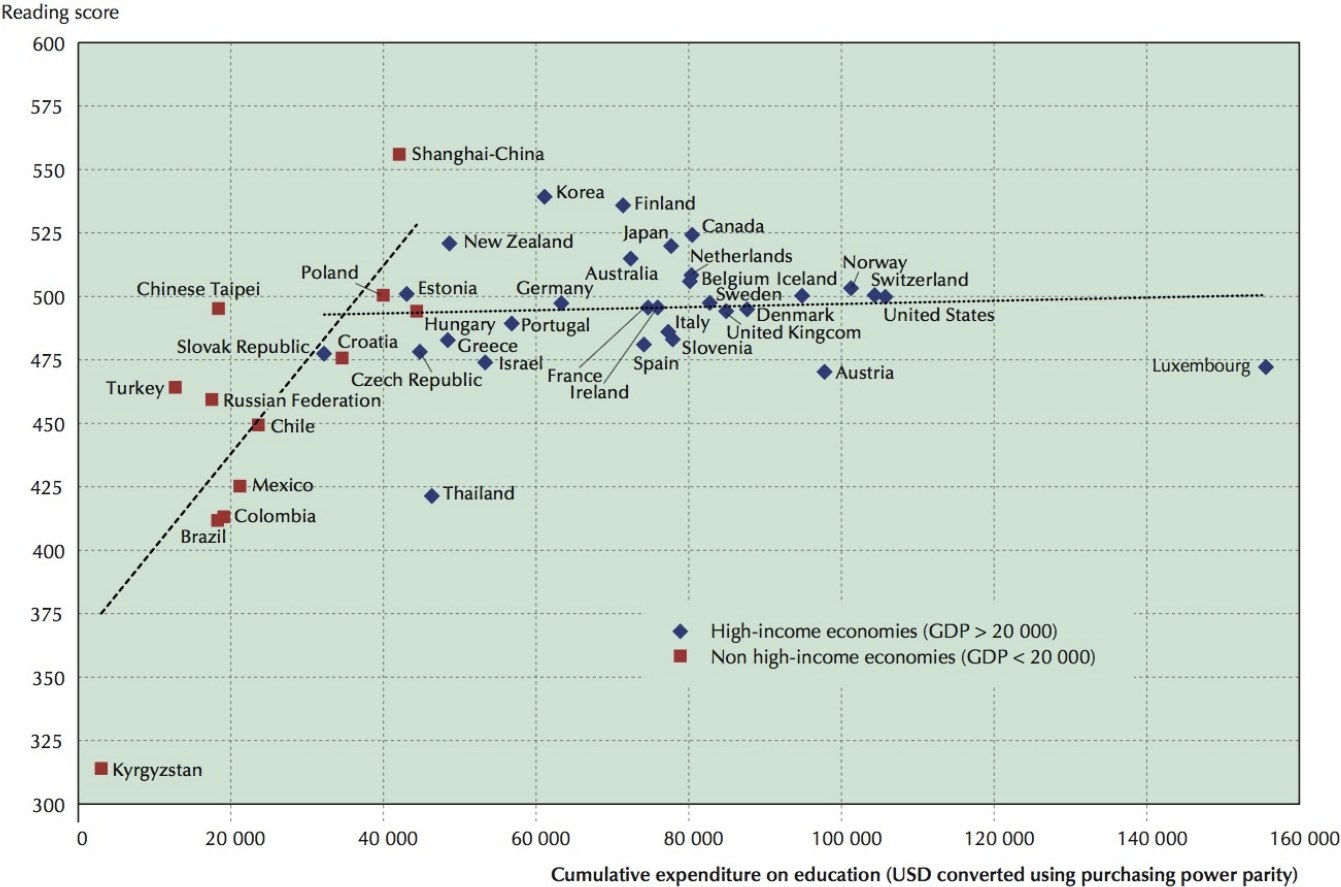
No. 1 | Visual Perception & What we See

We can only
see a few
things at once.



No. 1 | Visual Perception & What we See

We seek meaning and make connections.

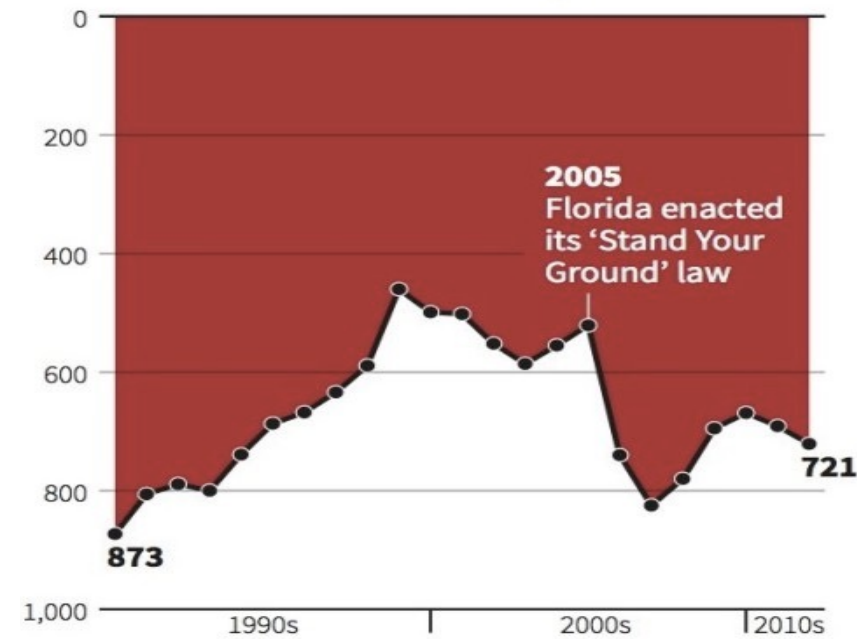


No. 1 | Visual Perception & What we See

We rely on
conventions &
metaphors.

Gun deaths in Florida

Number of murders committed using firearms



Source: Florida Department of Law Enforcement

No. 2



Principles of Visual Perception

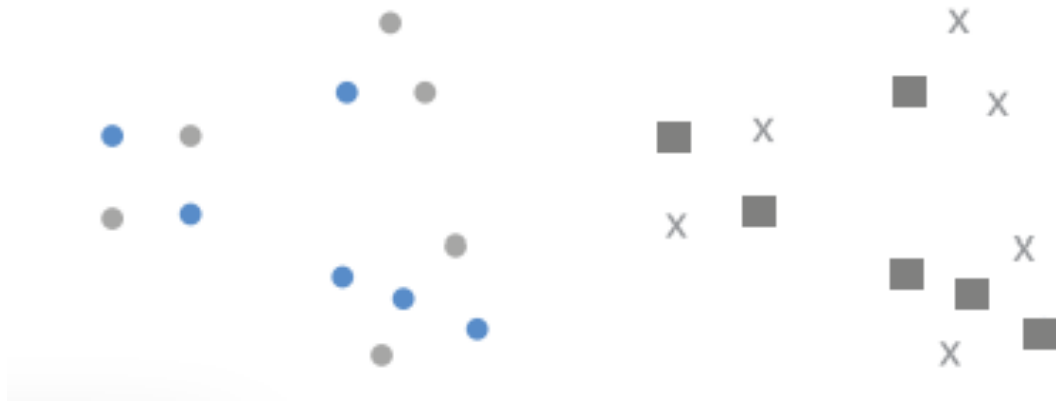
- | | |
|---------------|---------------|
| 1. Proximity | 4. Closure |
| 2. Similarity | 5. Continuity |
| 3. Enclosure | 6. Connection |

No. 2 | Gestalt: Proximity



Objects that are physically close together tend to belong as a group.

No. 2 | Gestalt: Similarity



Objects that are of similar color, shape, size or orientation tend to belong to a group.

No. 2 | Gestalt: Enclosure



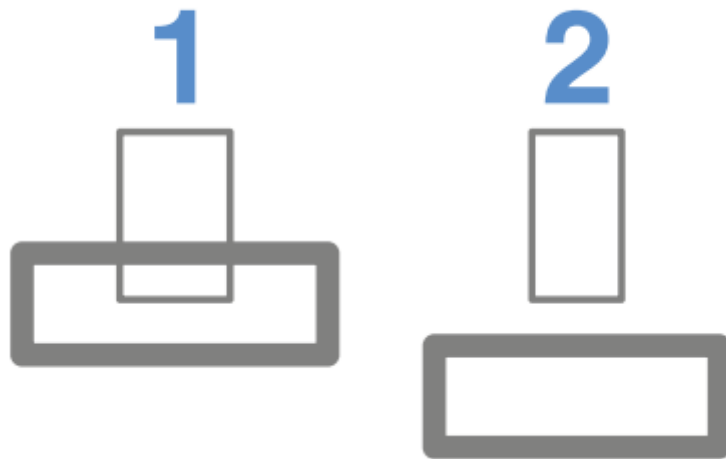
Objects that are physically enclosed together tend to belong together as a group.

No. 2 | Gestalt: Closure



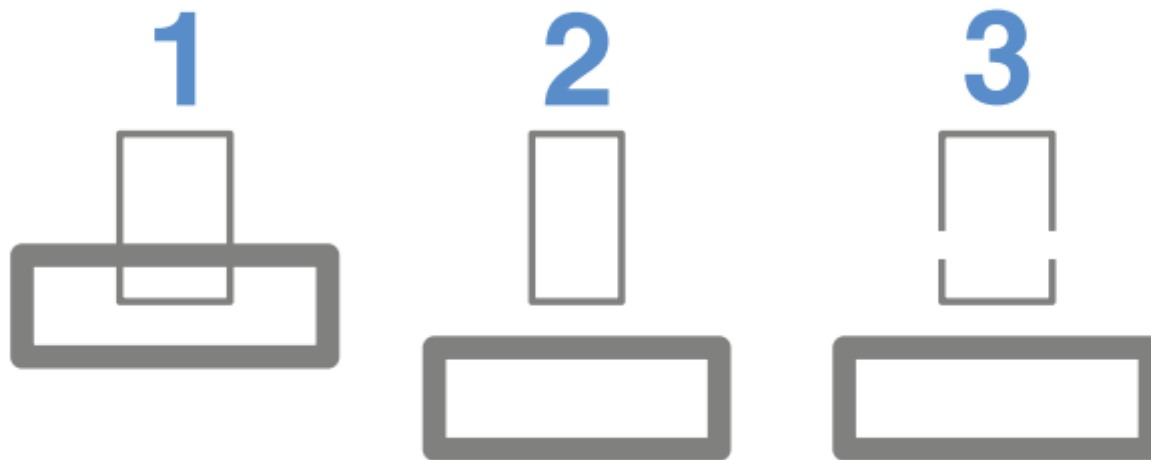
Individual elements will be perceived as a single recognizable shape when possible.

No. 2 | Gestalt: Continuity



Individuals will visually perceive natural continuity regardless of its actual existence.

No. 2 | Gestalt: Continuity



Individuals will visually perceive natural continuity regardless of its actual existence.

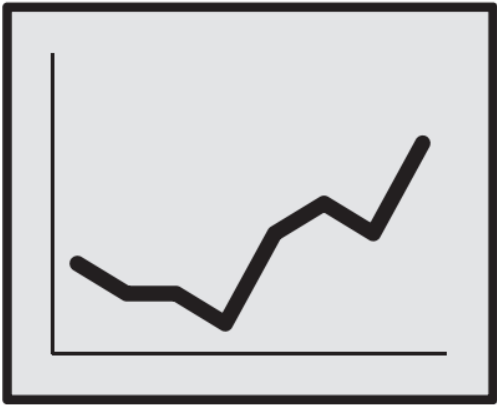
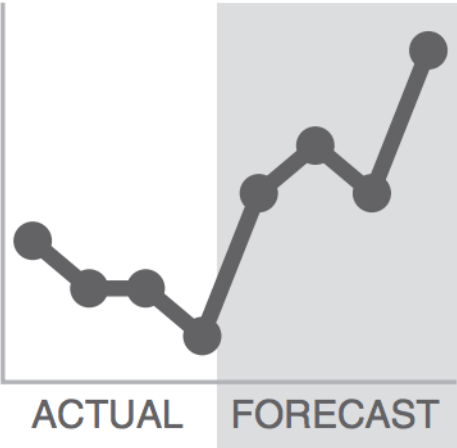
No. 2 | Gestalt: Connection



Objects that are physically connected will be perceived as part of a group.

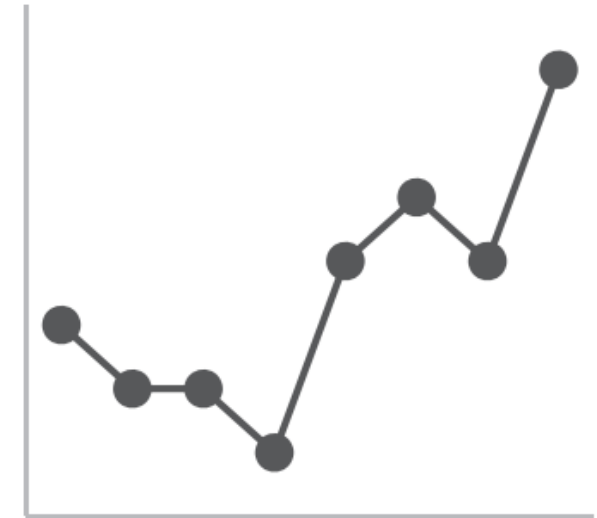
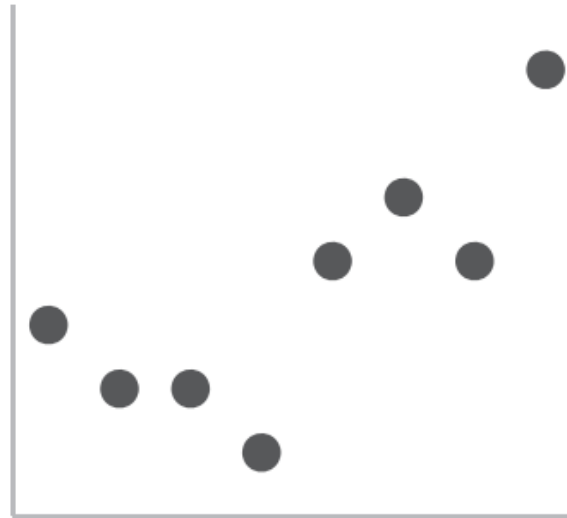
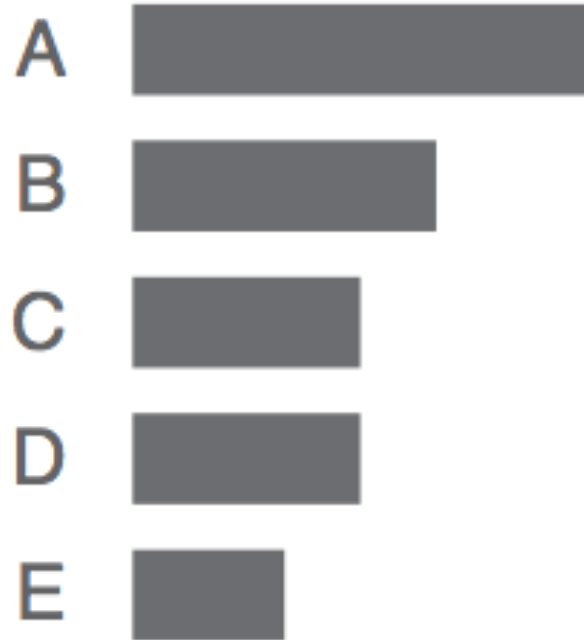
No. 2 | Gestalt + Data Visualization

- Proximity
- Similarity
- Enclosure
- Closure
- Continuity
- Connection



No. 2 | Gestalt + Data Visualization

Proximity
Similarity
Enclosure
Closure
Continuity
Connection



No. 3 | Visual Perception & What we See

Preattentive vs. Attentive Attributes

Attentive Visual Processing

- The conscious, reflective part of perception that allows for deliberate processing and sequential ordering.

Preattentive Visual Processing

- The more automatic form of visual processing that relies on initial perceptions and how those link to existing memories.

No. 3 | Visual Perception & What we See

Preattentive vs. Attentive Attributes

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Preattentive vs. Attentive Attributes

Attentive Visual Processing

- The conscious, reflective part of perception that allows for deliberate processing and sequential ordering.

Preattentive Visual Processing

- The more automatic form of visual processing that relies on initial perceptions and how those link to existing memories.

Key: Preattentive Processing is much faster and can be leveraged to enhance visualizations.

78963291038759

14357865320957

12758392053309

87673986541359

78963291038759

14357865320957

12758392053309

87673986541359

78963291038759

14357865320957

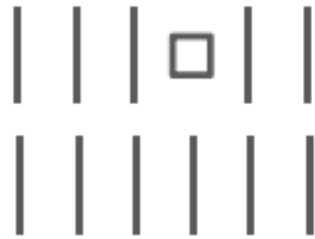
12758392053309

87673986541359

Preattentive Attributes



Orientation



Shape



Line length



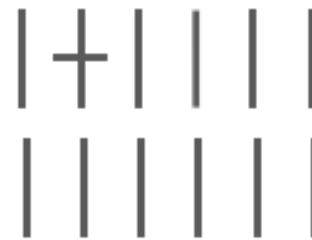
Line width



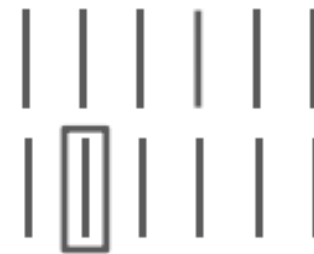
Size



Curvature



Added marks



Enclosure



Hue



Intensity



Spatial position



Motion



Preattentive attributes are to
data visualizations like...

SQUIRREL!

is to Dug from Pixar's Up.

Psychology + Visual Perception

No. 1 | What we See

No. 2 | Gestalt

No. 3 | Attributes

Crafting Impactful Data Stories: Design Principles

No.1 Why we Visualize

No.2 Psychology + Visual Perception

No.3 Data Visualization Process

Think | Sketch | Create | Articulate

No.4 Case Study

No.5 Takeaways

Data Visualization Process Simplified

No. 1 | Think

No. 2 | Sketch

No. 3 | Create

No. 4 | Articulate

Crafting Impactful Data Stories: Design Principles

No.1 Why we Visualize

No.2 Psychology + Visual Perception

No.3 Data Visualization Process

Think | Sketch | Create | Articulate

No.4 Case Study

No.5 Takeaways

No. 1 Think

What's the goal of this visual? What's the main idea?

No. 1 Think

What's the goal of this visual? What's the main idea?

Who is the audience?

No. 1 Think

What's the goal of this visual? What's the main idea?

Who is the audience?

What is the medium of distribution?

No. 1 Think

What's the goal of this visual? What's the main idea?

Who is the audience?

What is the medium of distribution?

Is this visual exploratory or declarative?

No. 1 Think

What's the goal of this visual? What's the main idea?

Who is the audience?

What is the medium of distribution?

Is this visual exploratory or declarative?

Crafting Impactful Data Stories: Design Principles

No.1 Why we Visualize

No.2 Psychology + Visual Perception

No.3 Data Visualization Process

Think | Sketch | Create | Articulate

No.4 Case Study

No.5 Takeaways

No. 2

Sketch

Using your data and main idea as a guide, explore chart type possibilities.

Types of Charts

Chart Types

Comparison

Composition

Distribution

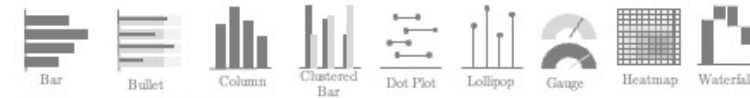
Relationship

Time

Spatial

Comparison

signal words | categories, compare, contrast, rank, types, difference, change



Composition

signal words | components, parts, percentage, proportion, total, subsections, group



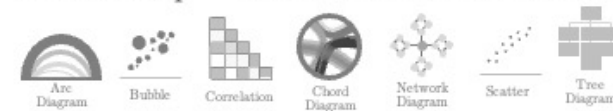
Distribution

signal words | distributed, variation, spread, range, average, median, quartile, quantile



Relationship

signal words | correlation, connection, relationship, relate to, organize, path, structure



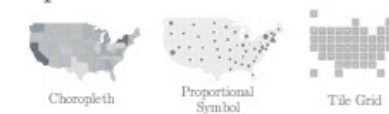
Time

signal words | trend, time, over time, dates, days/weeks/months/quarters/years, pattern, cycle



Spatial

signal words | geography, map, spatial, location, country, state, county, city, regional variation



No. 2

Sketch

Using your data and main idea as a guide, explore chart type possibilities.

Be creative

No. 2

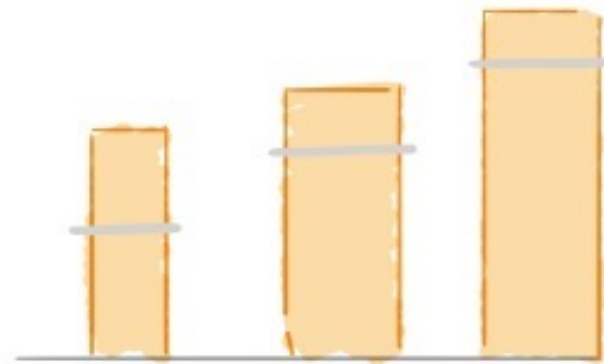
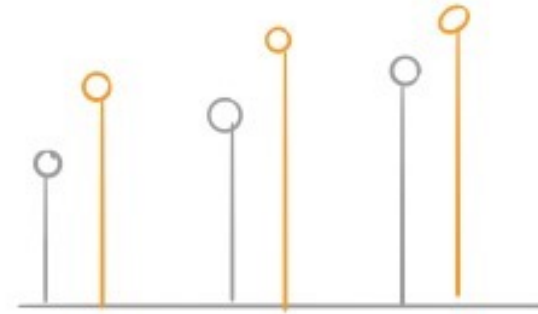
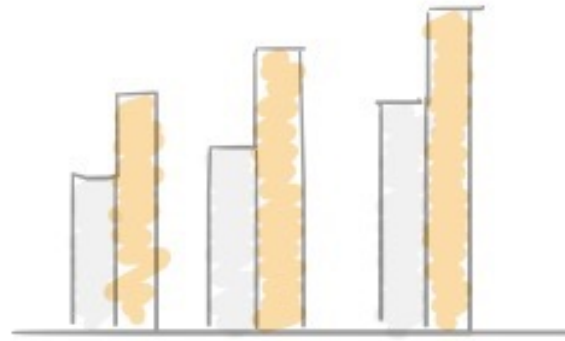
Sketch

Using your data and main idea as a guide, explore chart type possibilities.

Be creative

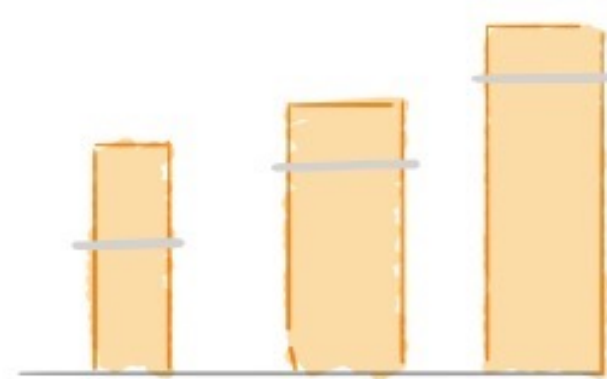
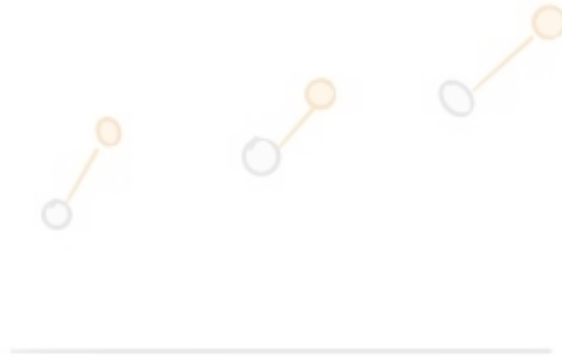
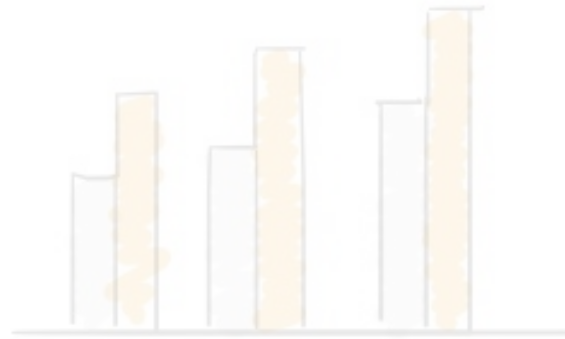
Sketch multiple data visualization possibilities, select the best design to prototype

No. 2 Sketch



No. 2

Sketch



Crafting Impactful Data Stories: Design Principles

No.1 Why we Visualize

No.2 Psychology + Visual Perception

No.3 Data Visualization Process

Think | Sketch | **Create** | Articulate

No.4 Case Study

No.5 Takeaways

No. 3

Create

Create a digital prototype of your sketch

Leverage any and all tools at your disposal

No. 3

Create

Create a digital prototype of your sketch

Leverage any and all tools at your disposal

Structure

No. 3

Create

Structure | Standard

Key Elements

Title

Subtitle

Data Visualization Field

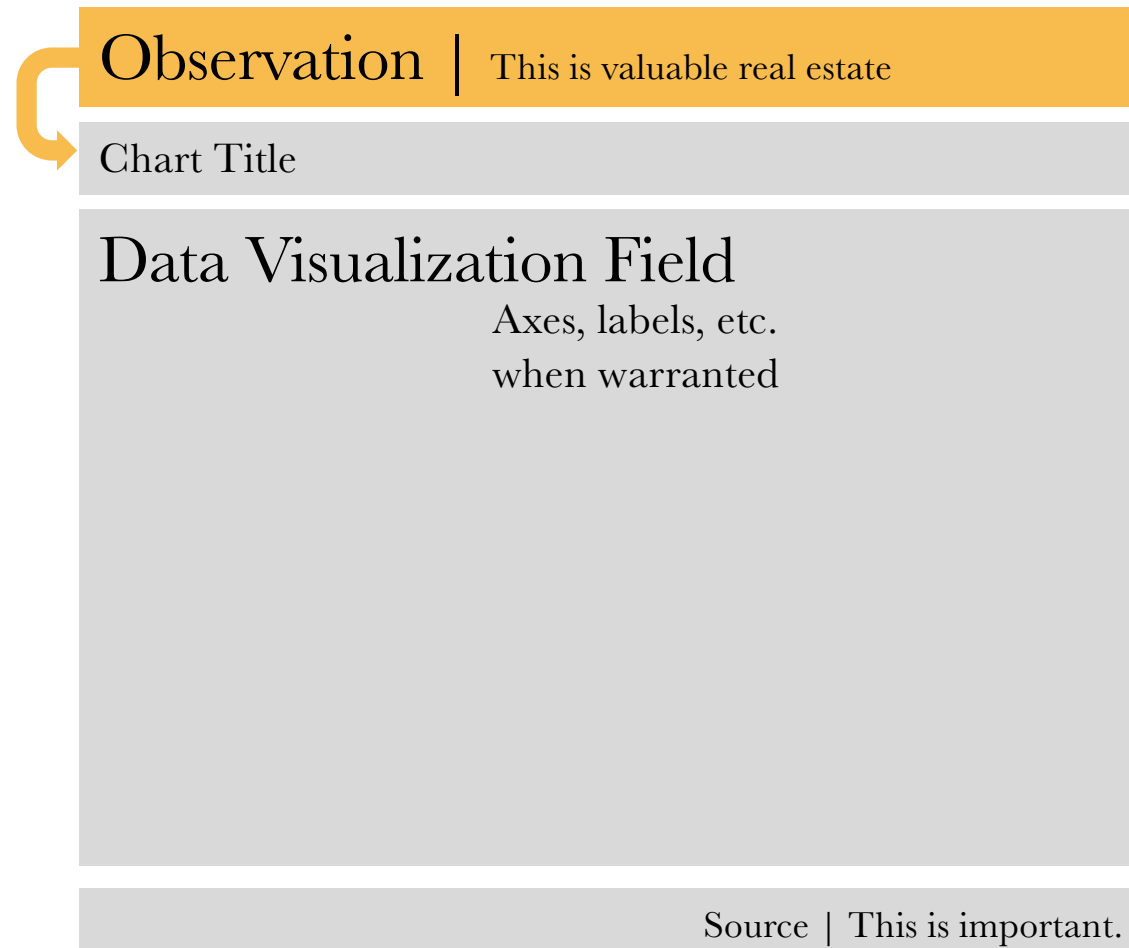
Axes, labels, etc.
when warranted

Source | This is important.

No. 3

Create

Structure | Rethink the use of titles to convey meaning



No. 3 Create

Structure | Rethink the use of titles to convey meaning

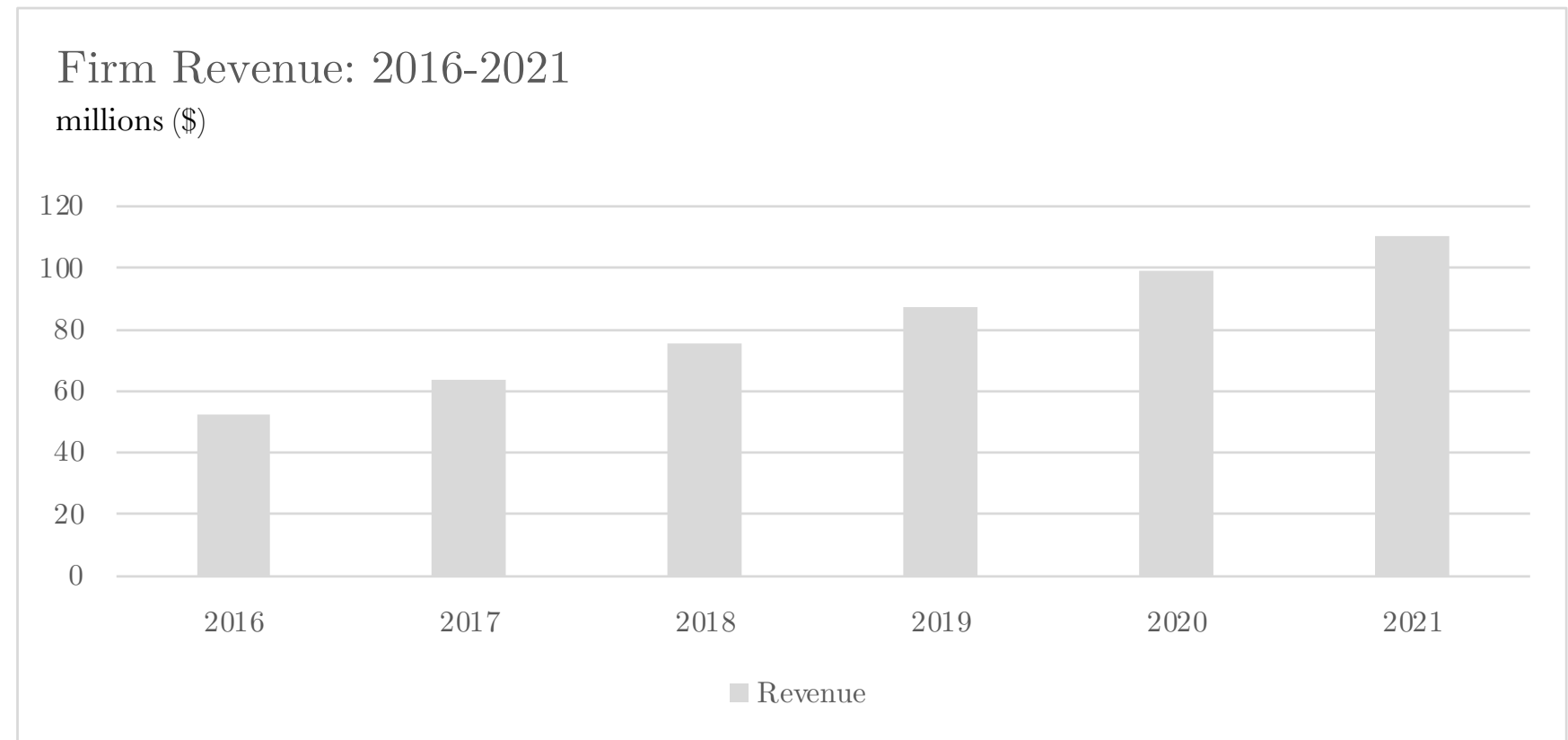
Firm Revenue: 2016-2021

millions (\$)

Year	Revenue
2016	52.6
2017	63.7
2018	75.3
2019	87.1
2020	99.2
2021	110.2

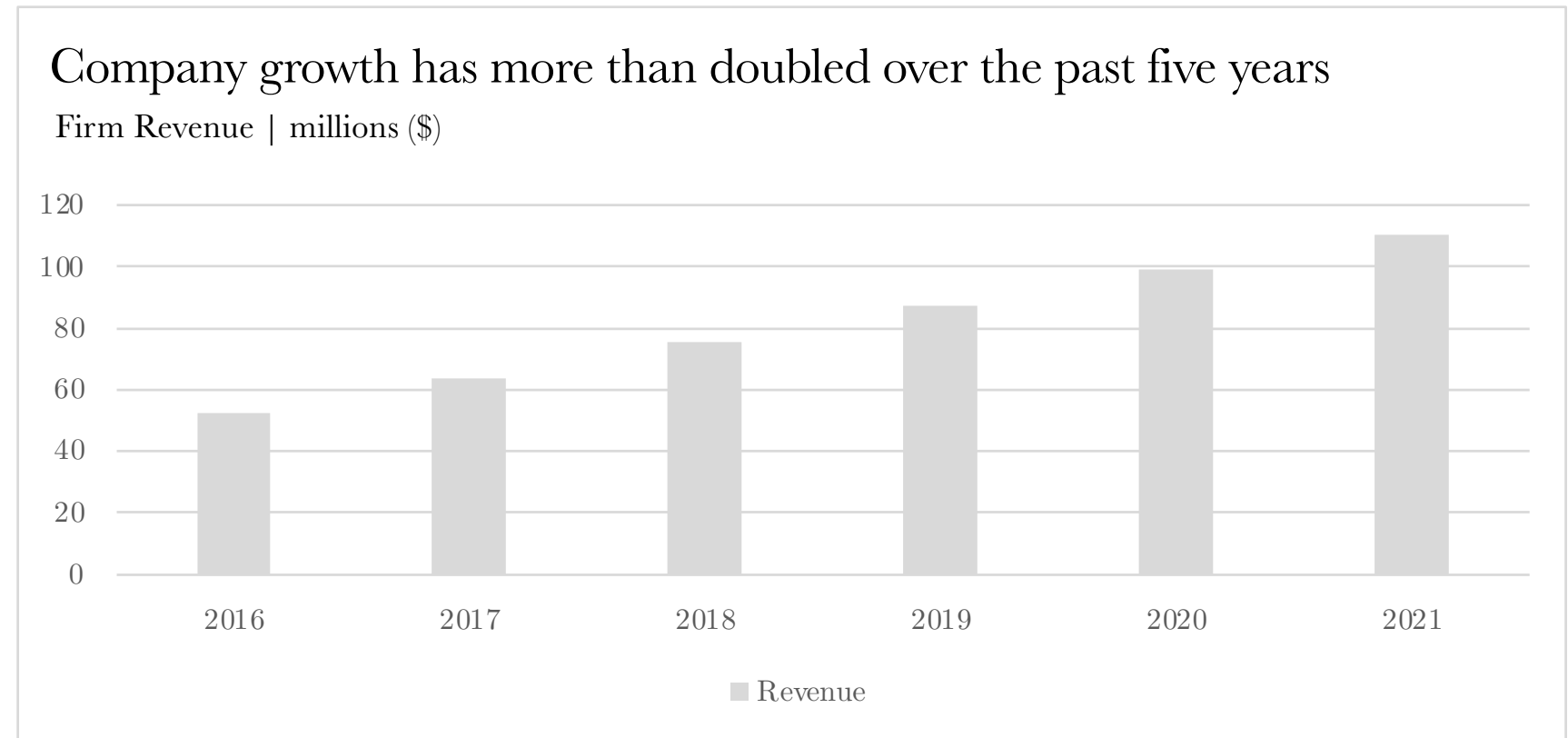
No. 3 Create

Structure | Rethink the use of titles to convey meaning



No. 3 Create

Structure | Rethink the use of titles to convey meaning



No. 3

Create

Create a digital prototype of your sketch

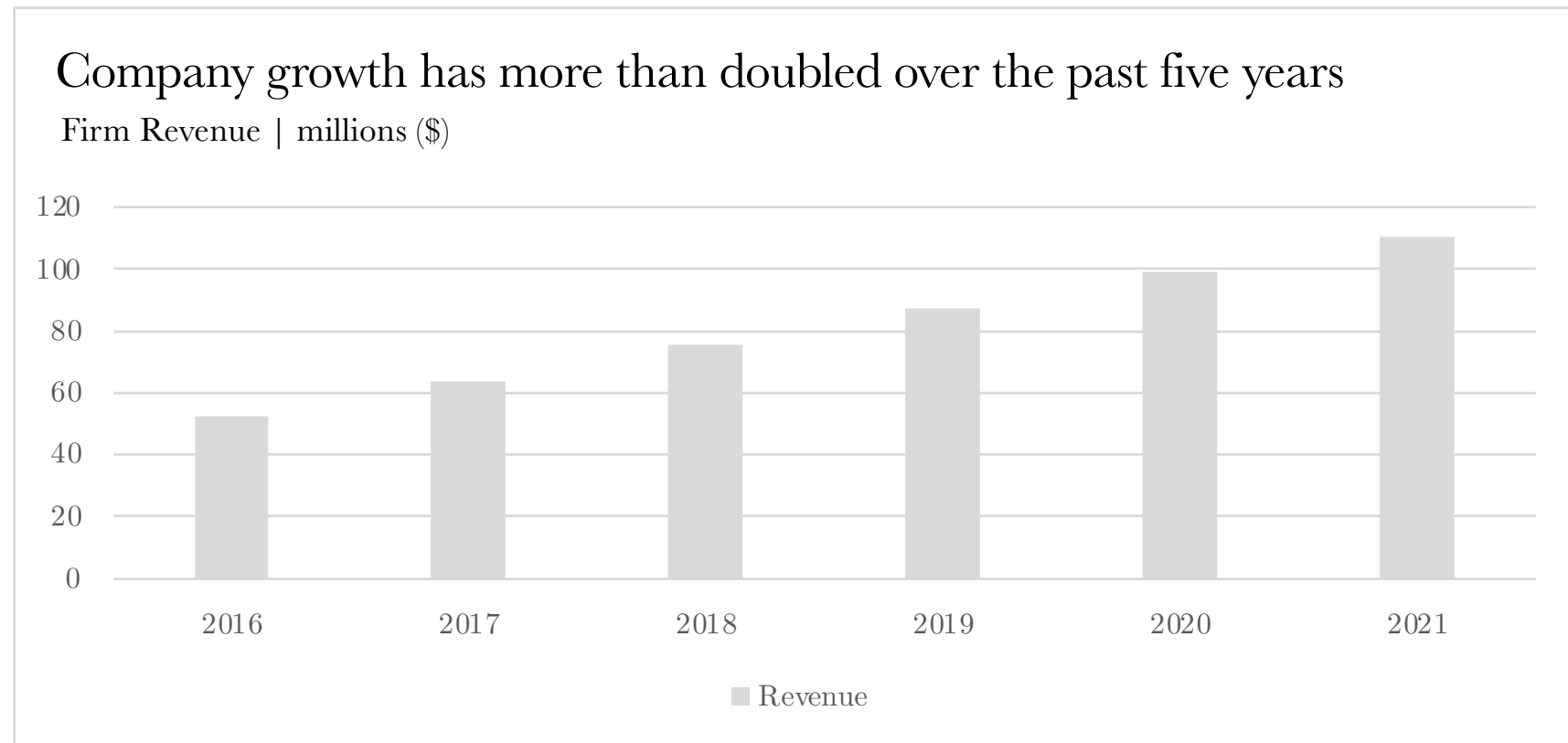
Leverage any and all tools at your disposal

Structure

Simplicity

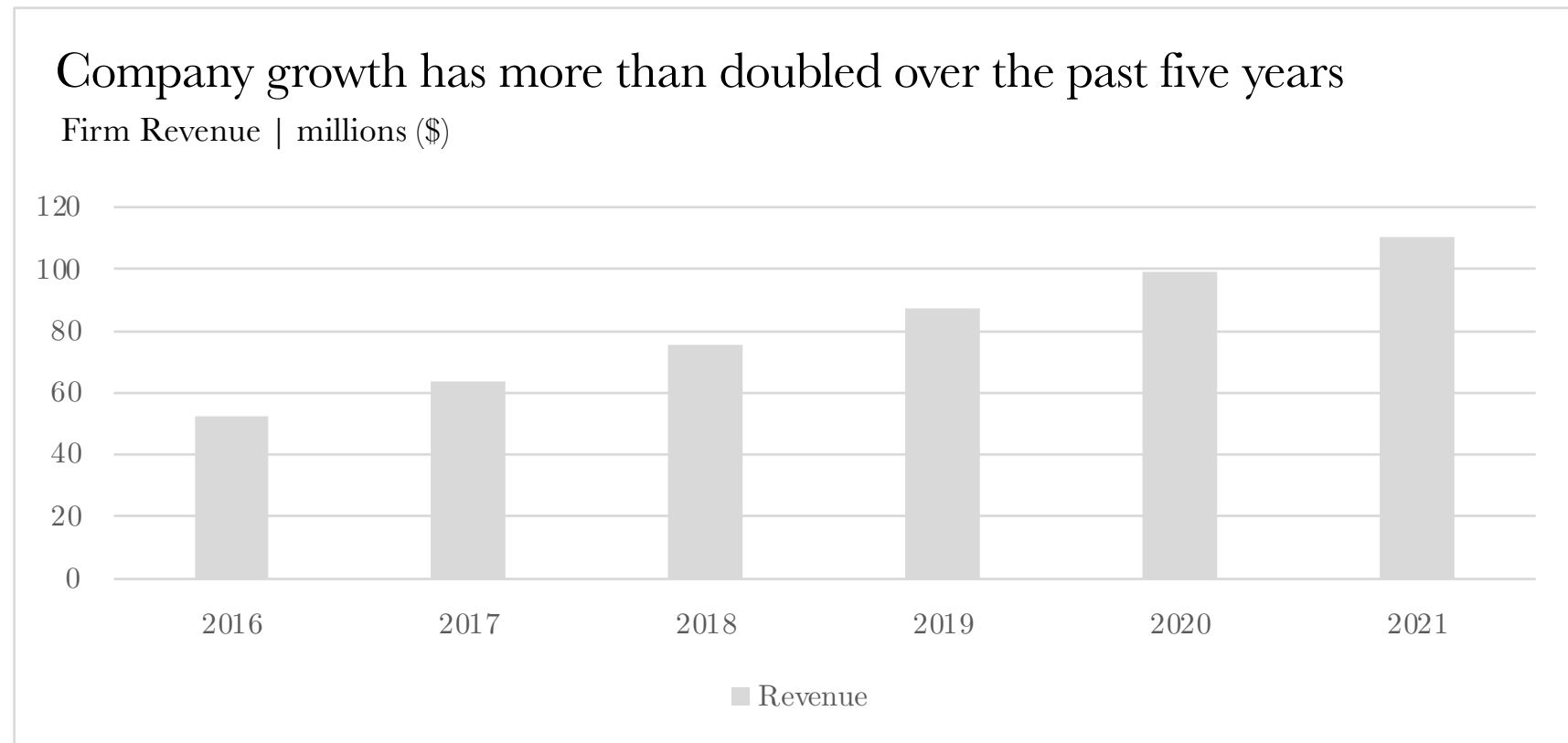
No. 3 Create

Simplicity | Start simple, start with gray (add color to articulate later)



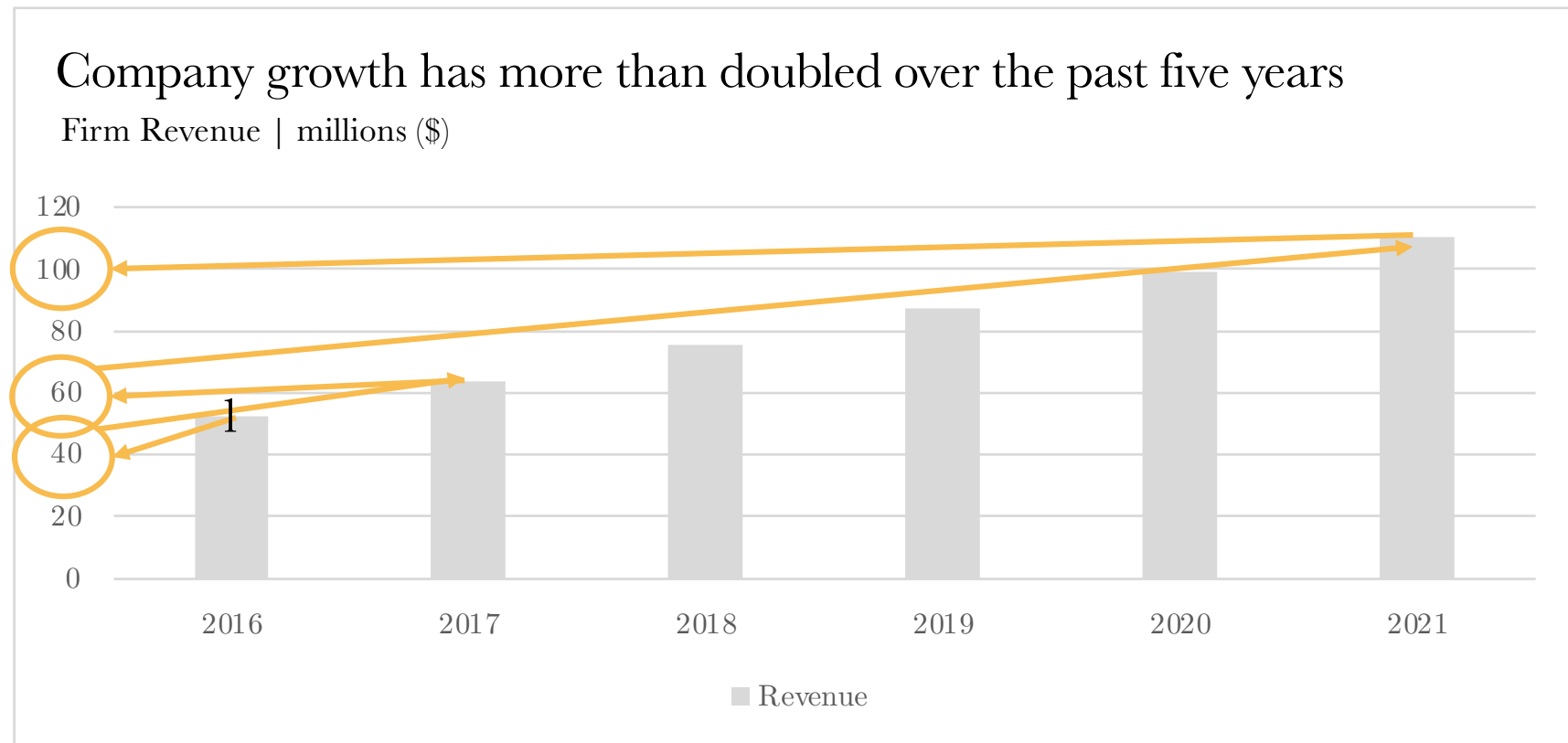
No. 3 Create

Simplicity | Simplify to limit eye travel



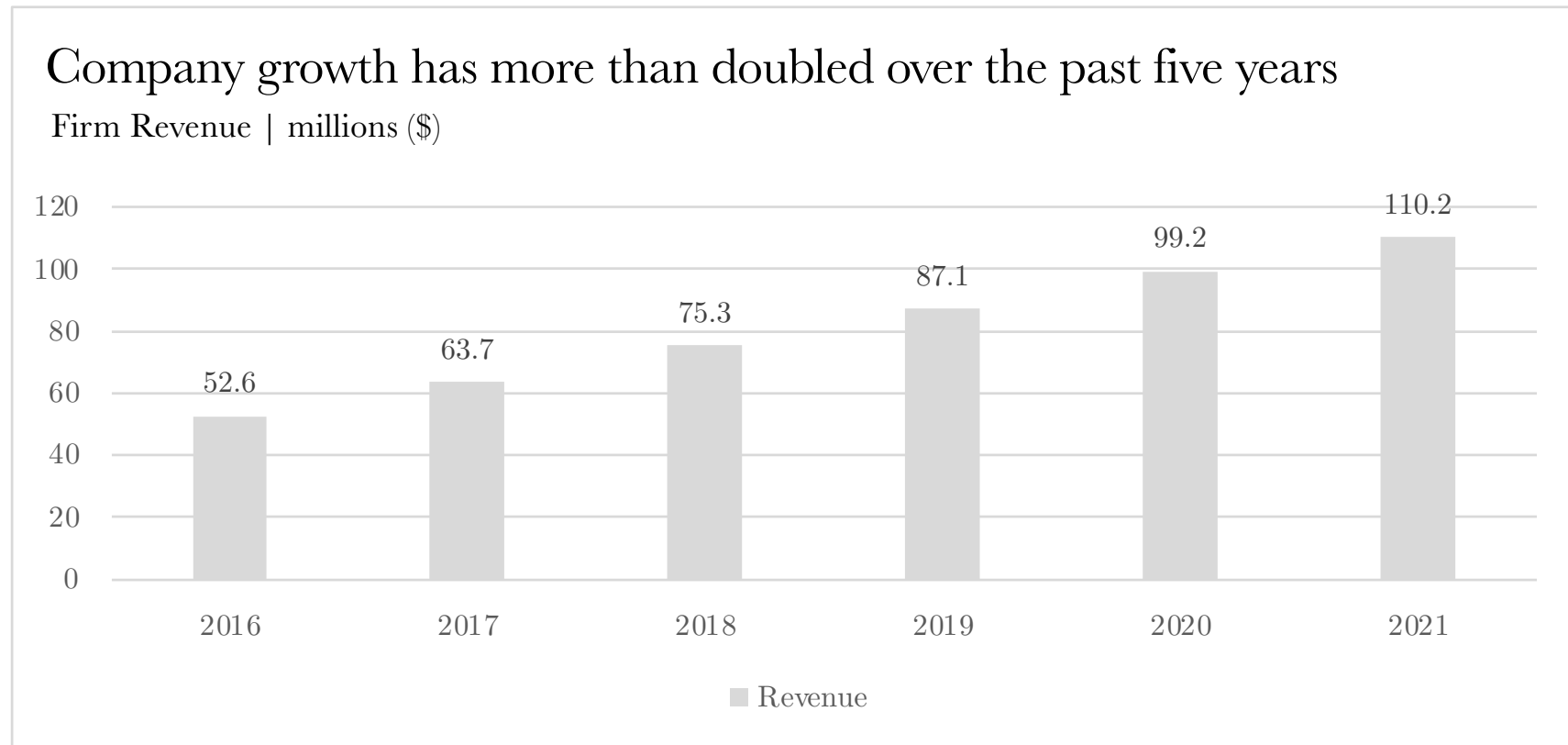
No. 3 Create

Simplicity | Simplify to limit eye travel



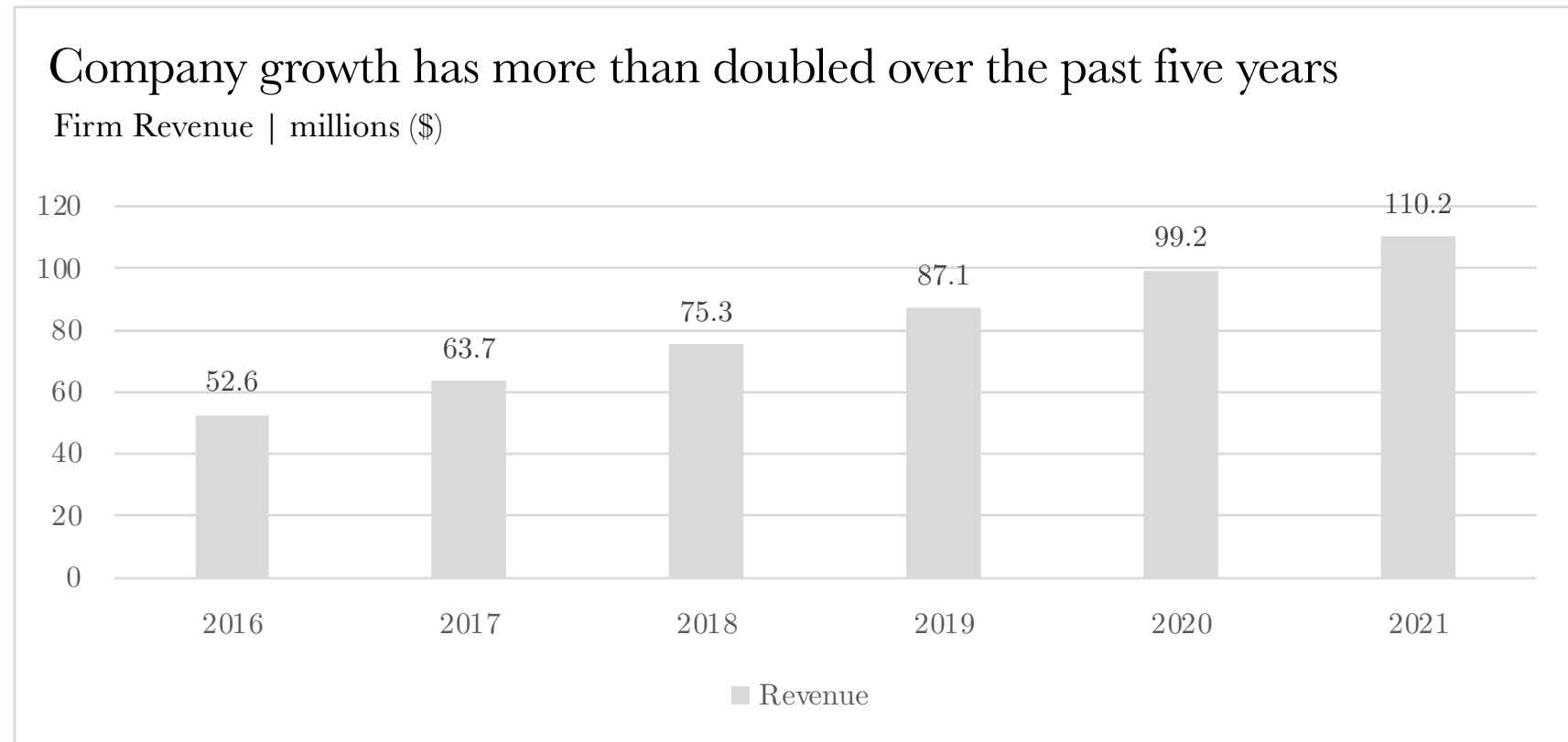
No. 3 Create

Simplicity | Simplify to limit eye travel



No. 3 Create

Simplicity | Everything in the visual must be necessary, remove anything extraneous or redundant | Keep it simple and clean

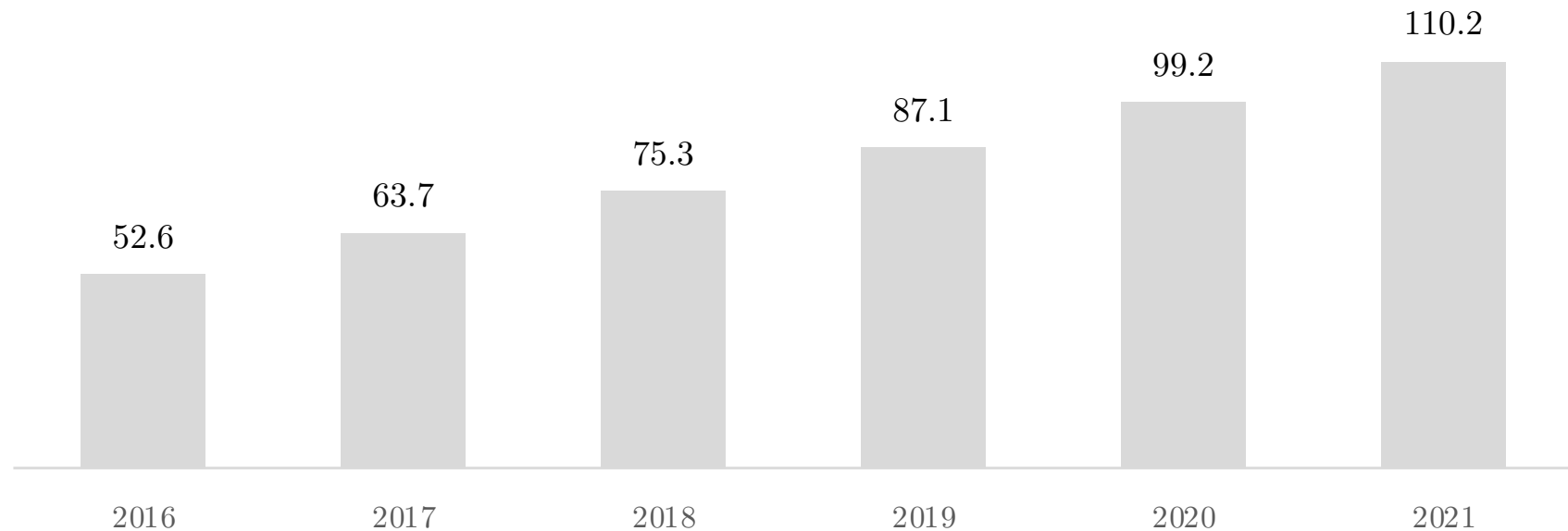


No. 3 Create

Simplicity | Everything in the visual must be necessary, remove anything extraneous or redundant | **Keep it simple and clean**

Company growth has more than doubled over the past five years

Firm Revenue | millions (\$)



No. 3

Create

Create a digital prototype of your sketch

Leverage any and all tools at your disposal

Structure

Simplicity

Crafting Impactful Data Stories: Design Principles

No.1 Why we Visualize

No.2 Psychology + Visual Perception

No.3 Data Visualization Process

Think | Sketch | Create | Articulate

No.4 Case Study

No.5 Takeaways

No. 4

Articulate

Reaffirm the main idea | 5 Second Rule

Refine for impact using the following:

Psychology + Gestalt + Preattentive Attributes

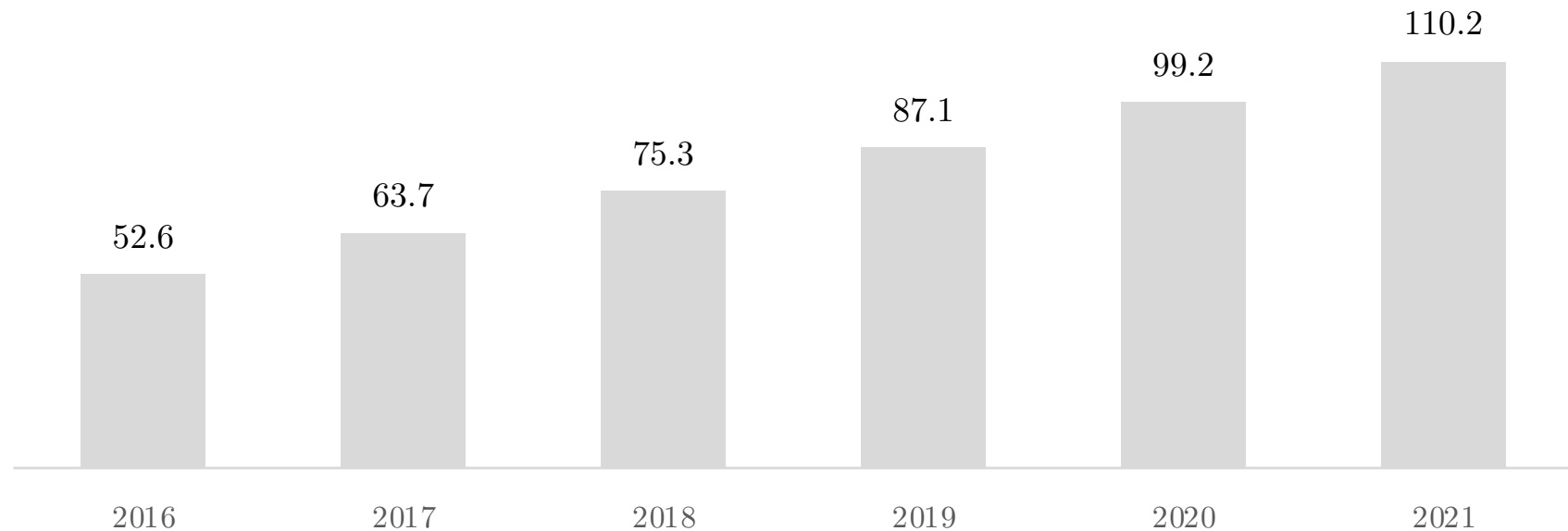
Highlight + Annotate

No. 4 Articulate

Main Idea | Clarify the main takeaway of the visual, is it obvious to the audience? Can they get it in 5 seconds?

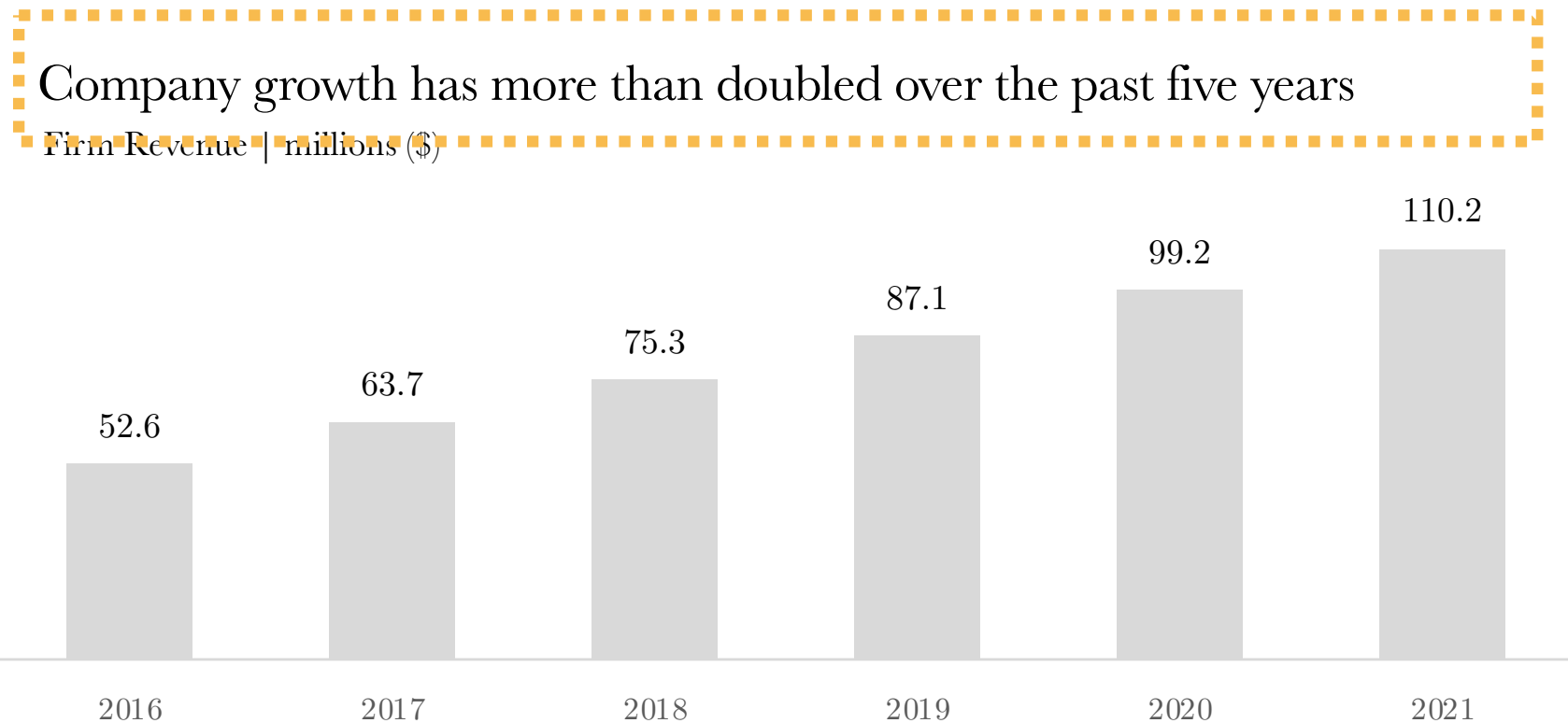
Company growth has more than doubled over the past five years

Firm Revenue | millions (\$)



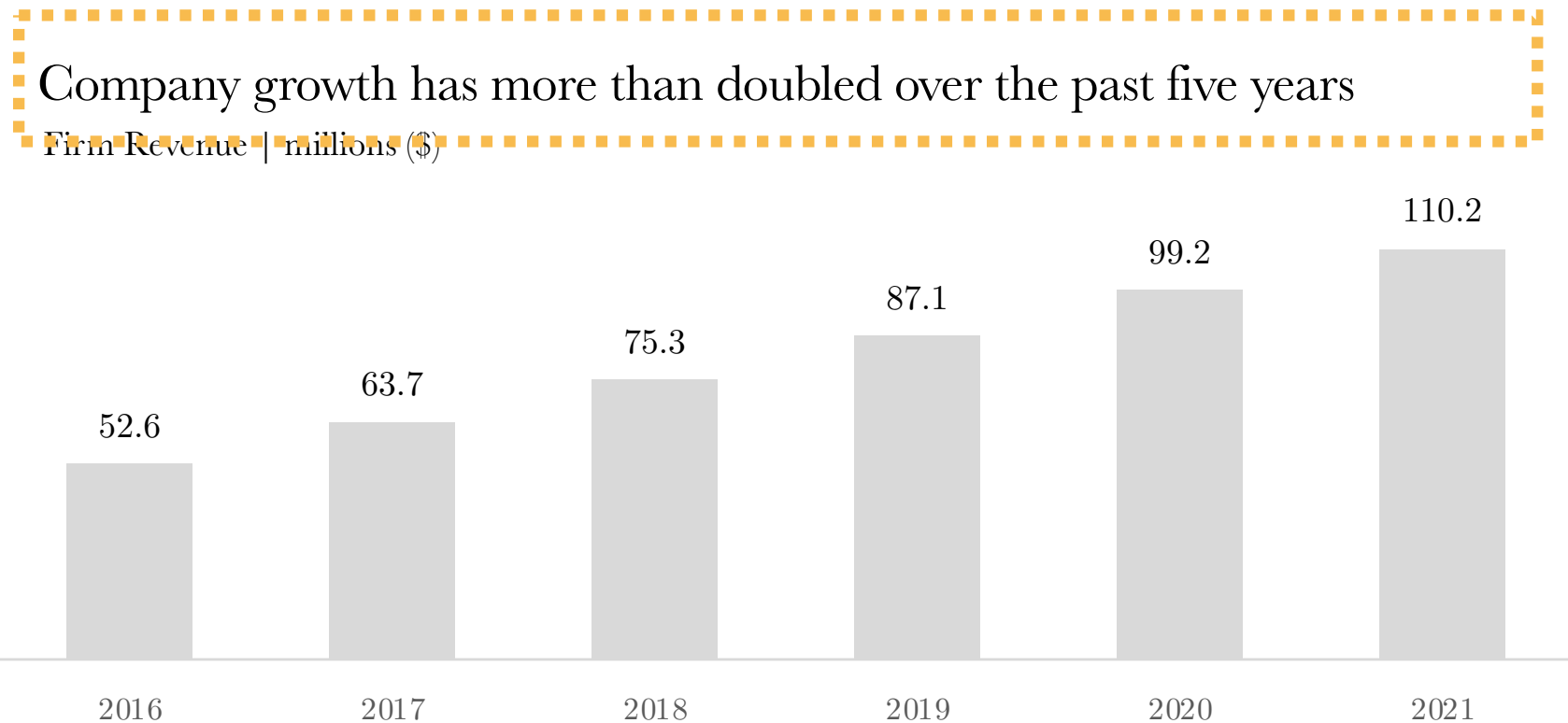
No. 4 Articulate

Main Idea | Clarify the main takeaway of the visual, is it obvious to the audience? Can they get it in 5 seconds?



No. 4 Articulate

Refine for Impact | Leverage psychology, Gestalt, and preattentive attributes to highlight the main idea

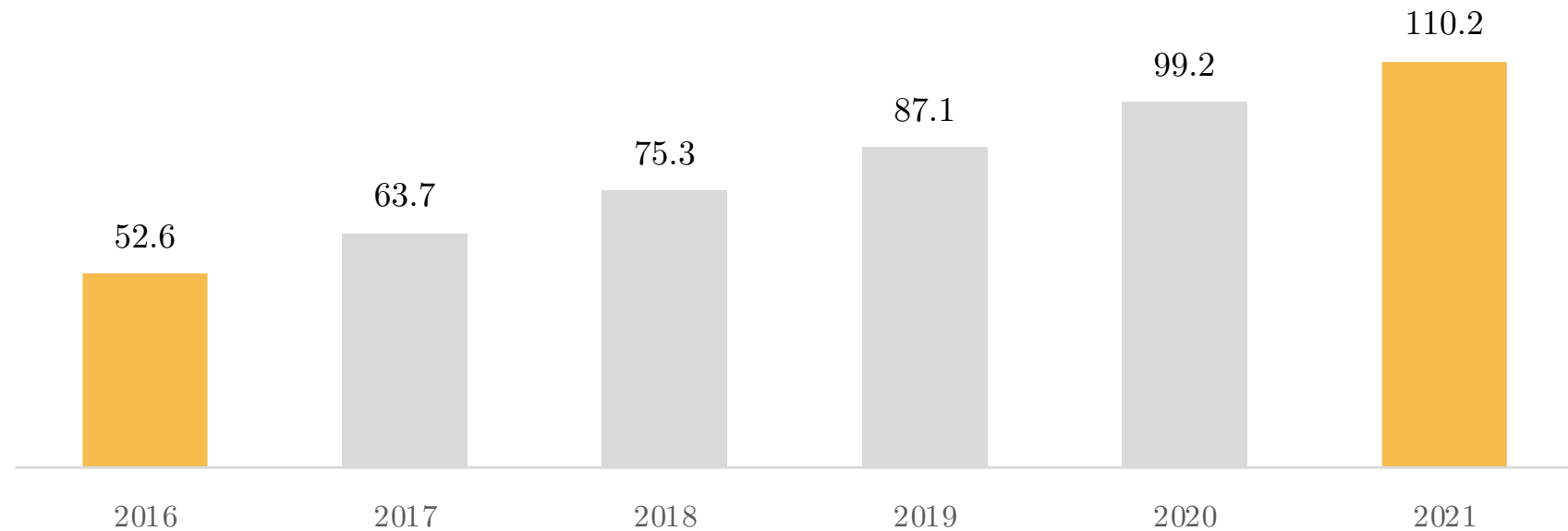


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Refine for Impact | Leverage psychology, Gestalt, and preattentive attributes to highlight the main idea

Company growth has more than doubled over the past five years

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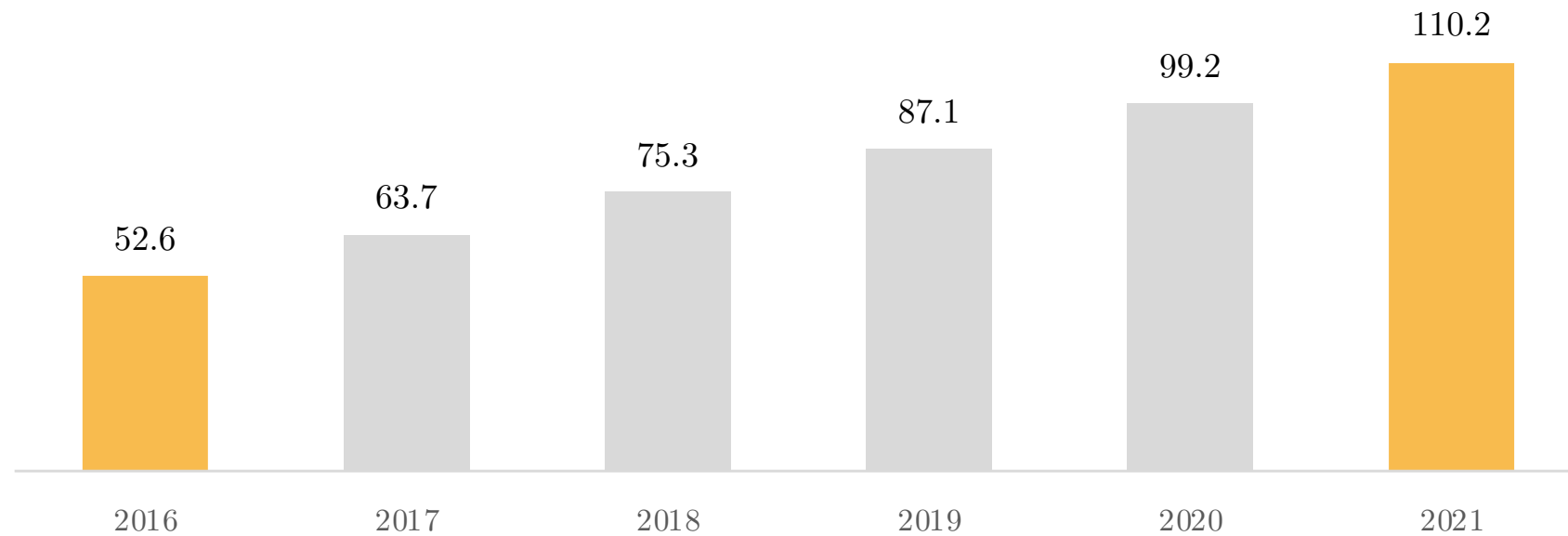


No. 4 Articulate

Refine for Impact | Use annotation and highlighting to provide context and storytelling

Company growth has more than doubled over the past five years

Firm Revenue | millions (\$)

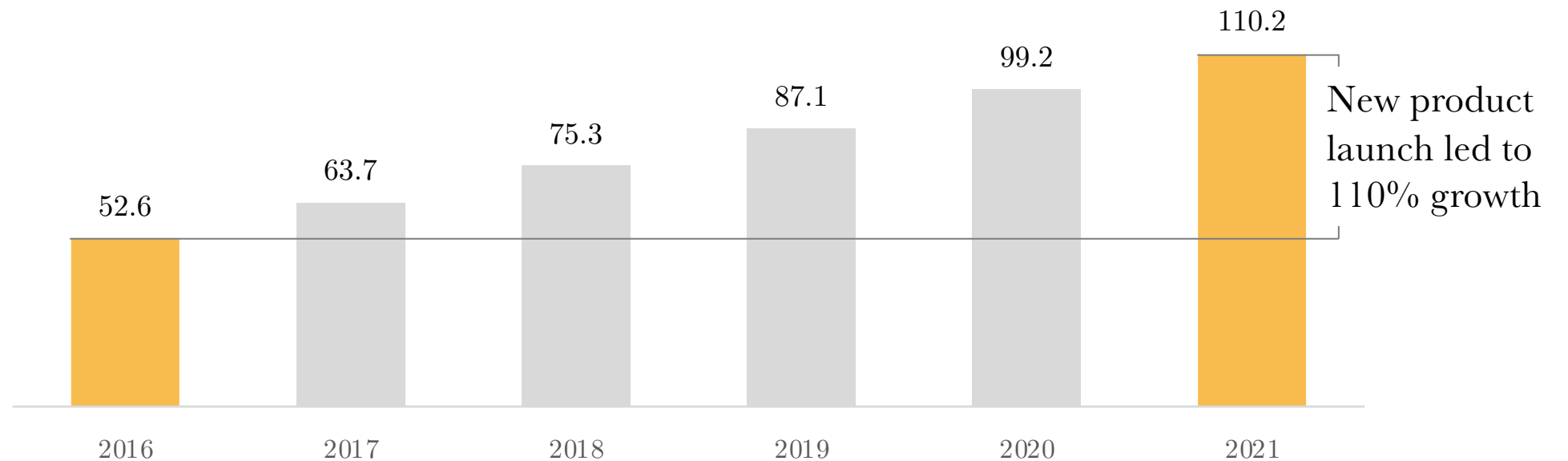


No. 4 Articulate

Refine for Impact | Use annotation and highlighting to provide context and storytelling

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Firm Revenue | millions (\$)



No. 4

Articulate

Reaffirm the main idea | 5 Second Rule

Refine for impact using the following:

Psychology + Gestalt + Preattentive Attributes

Highlight + Annotate

Data Visualization Process | Simplified

No. 1 Think

- What's the main idea of this visual?
- Who is the audience?
- What is the medium of distribution?
- Is this visual exploratory or declarative?

No. 2 Sketch

- Explore chart type possibilities.
- Be creative
- Sketch

No. 3 Create

- Digital prototype
- Leverage tools
- Structure
- Simplicity

No. 4 Articulate

- Main idea | 5 second rule
- Refine for impact:
 - Preattentive attributes
 - Highlight + annotate

Crafting Impactful Data Stories: Design Principles

No.1 Why we Visualize

No.2 Psychology + Visual Perception

No.3 Data Visualization Process

Think | Sketch | Create | Articulate

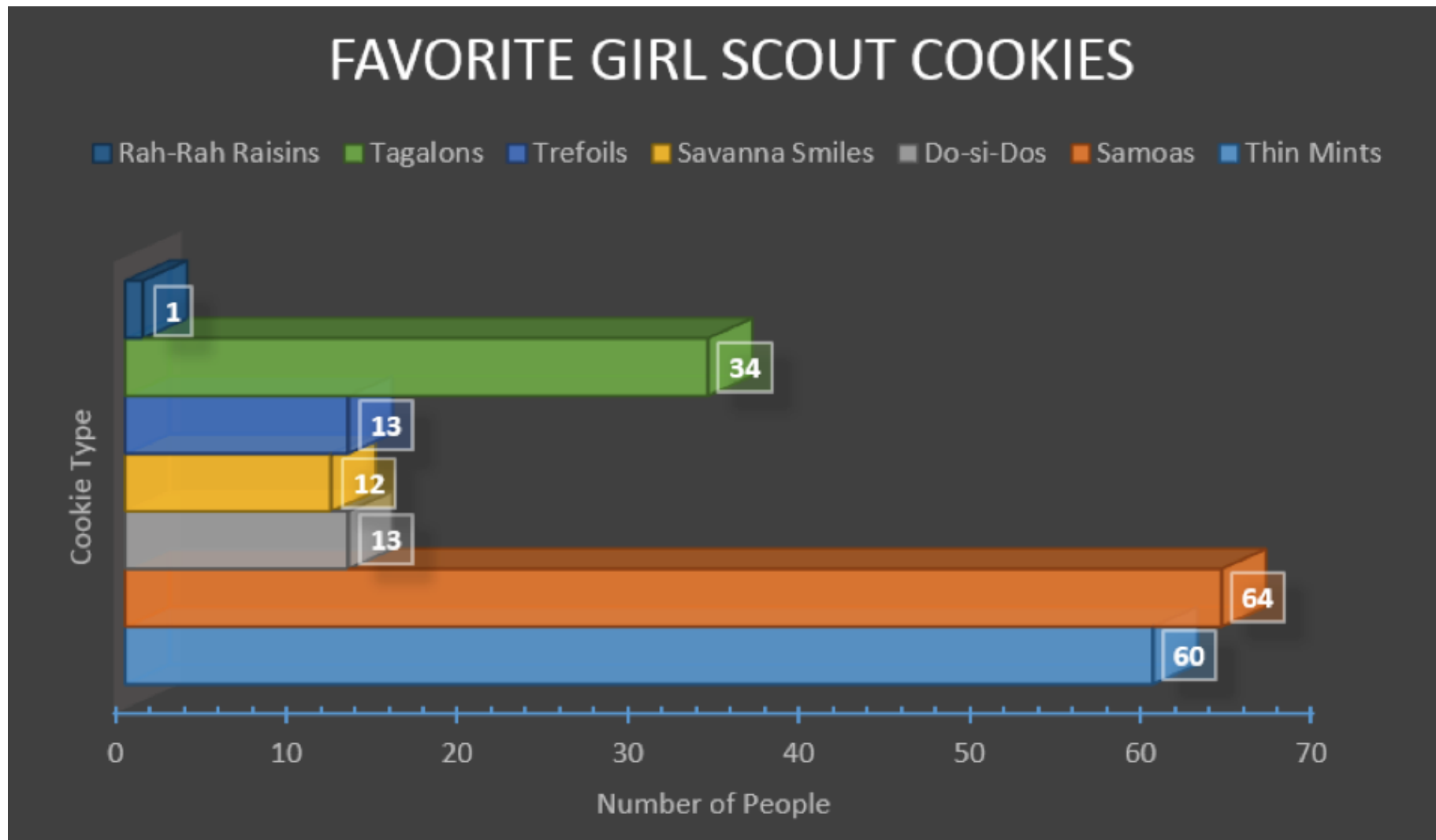
No.4 Case Study

No.5 Takeaways

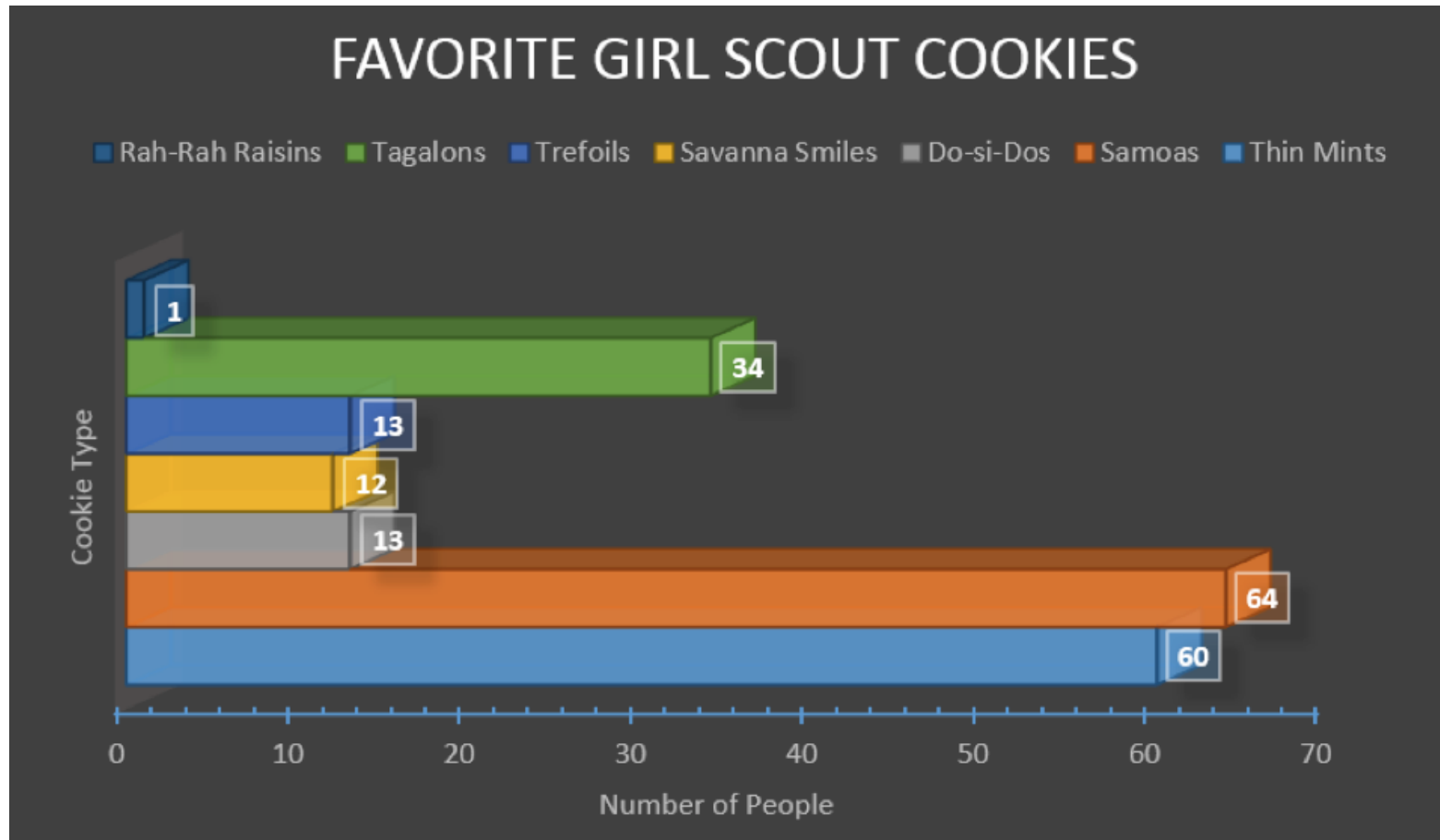
Case Study Redesign Process

- 1 What is your first impression of the visual? First thoughts?
- 2 What do you like?
- 3 What would you improve?
Think in terms of chart type, structure, simplicity, capturing the main idea, refining for impact (preattentive attributes, annotation, highlighting, etc.).
- 4 Sketch potential redesigns of the visual and determine the “best” alternative visualization

Mini Case Study | Practice



Mini Case Study | Practice



1 What is your first impression of the visual? First thoughts?

2 What do you like?

3 What would you improve?
Think in terms of chart type, structure, simplicity, capturing the main idea, refining for impact (preattentive attributes, annotation, highlighting, etc.).

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Crafting Impactful Data Stories: Design Principles

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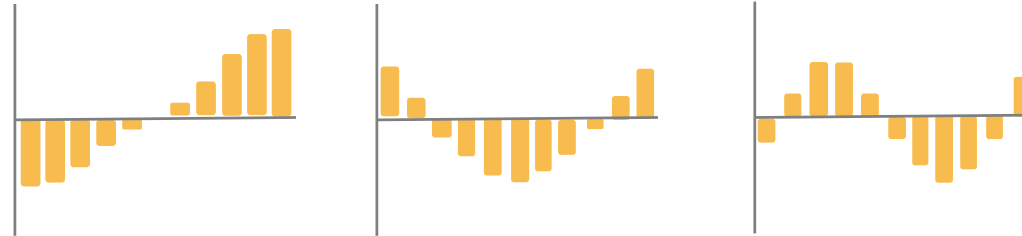
No.3 Data Visualization Process

Think | Sketch | Create | Articulate

No.4 Case Study

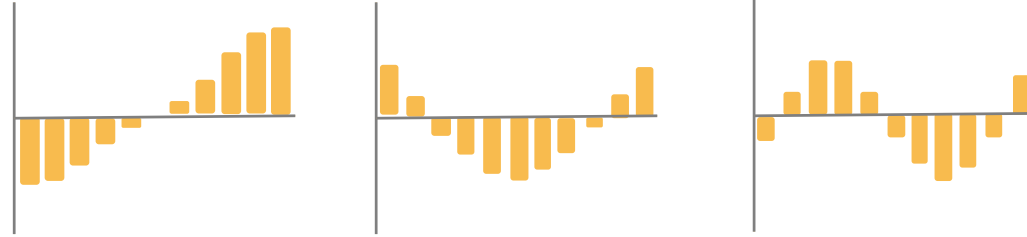
No.5 Takeaways

Takeaways



- 1 Good visualization involves a process
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- 2 Impactful data stories & visuals take into account:
psychology, visual perception, types of charts, structure,
simplicity, + refining for impact
- 3 Data visualization skills are best developed through
critiquing + redesigning using mini-case studies

Takeaways

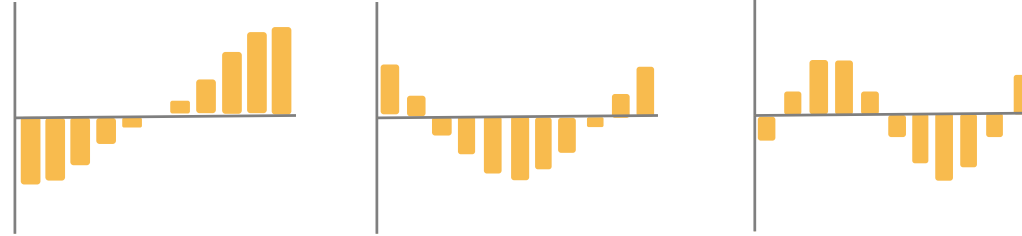


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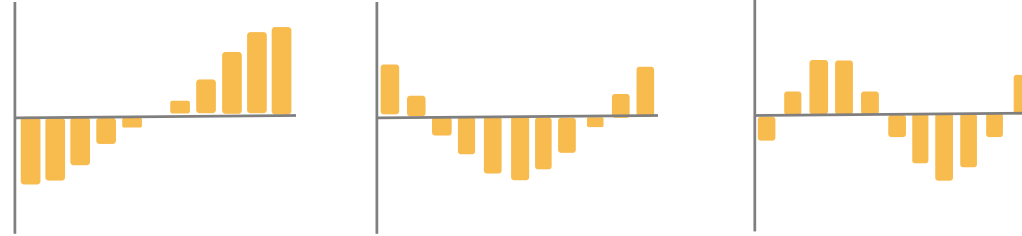
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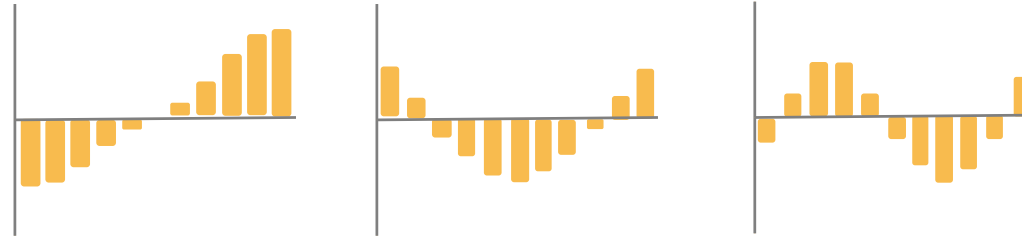
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Data Visualization:

Design Principles

Exploration + Conception

Storytelling



Agenda

Data Visualization Design Principles

Chart Types + EDA

Break

Storytelling

Takeaways

Chart Types | A Selection Framework

No. 1 | Think

No. 2 | Sketch

No. 3 | Create

No. 4 | Articulate

Chart Types | A Selection Framework

No. 1 | Think

No. 2 | Sketch

No. 3 | Create

No. 4 | Articulate



Chart Type Exploration

Chart type selection and exploration should take place in the conceive stage during the sketch phase

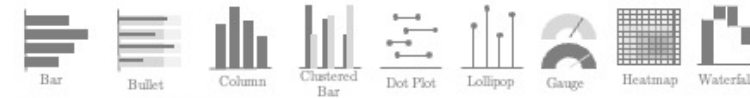
Types of Charts

Selection Framework Chart Types

Comparison
Composition
Distribution
Relationship
Time
Spatial

Comparison

signal words | categories, compare, contrast, rank, types, difference, change



Composition

signal words | components, parts, percentage, proportion, total, subsections, group



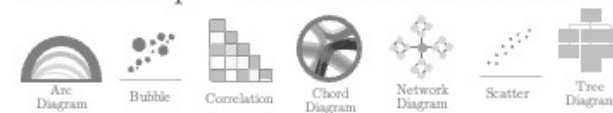
Distribution

signal words | distributed, variation, spread, range, average, median, quartile, quantile



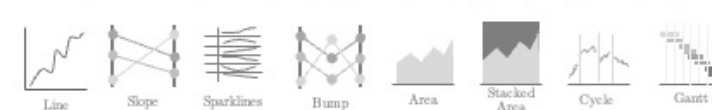
Relationship

signal words | correlation, connection, relationship, relate to, organize, path, structure



Time

signal words | trend, time, over time, dates, days/weeks/months/quarters/years, pattern, cycle



Spatial

signal words | geography, map, spatial, location, country, state, county, city, regional variation

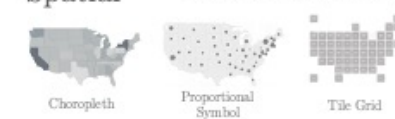


Chart Types | A Selection Framework

State the goal

In one sentence state the goal or objective of your visual.

Look for key words or signal words to guide chart type selection

“ “ I want to compare the difference between...

“ “ I want to show...over time...

“ “ I want to explore the percentage of the total

Chart Types | A Selection Framework

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“ I want to show...**over time**...

“ I want to explore the **percentage** of the **total**

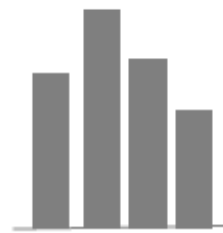
Chart Types | Comparison



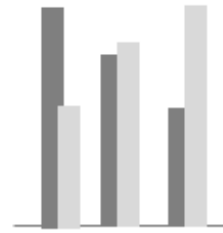
Bar



Bullet



Column



Clustered
Bar



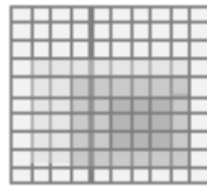
Dot Plot



Lollipop



Gauge



Heatmap



Waterfall

signal words

categories

compare

contrast

rank

types

difference

change

Chart Types | Composition



Pie



Nightingale



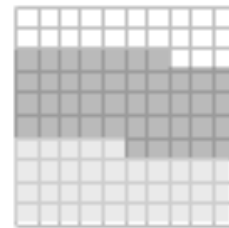
Stacked Bar



Sunburst



Tree Map



Waffle

signal words

components

parts

percentage

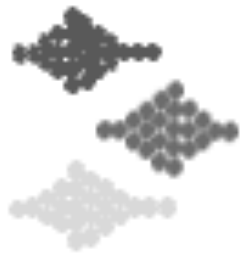
proportion

total

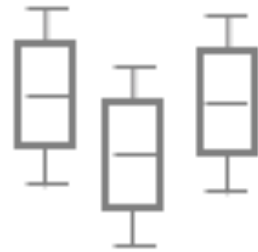
subsections

group

Chart Types | Distribution



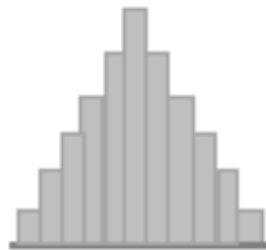
Beeswarm



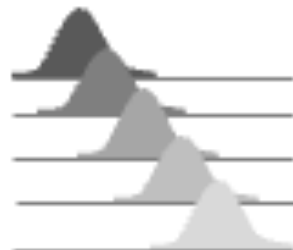
Box-and-Whisker



Dot Plot



Histogram



Ridgeline



Violin

signal words

distributed

variation

spread

range

average

median

quartile

quantile

Chart Types | Relationship



Arc
Diagram



Bubble



Correlation



Chord
Diagram



Network
Diagram



Scatter



Tree
Diagram

signal words

correlation

connection

relationship

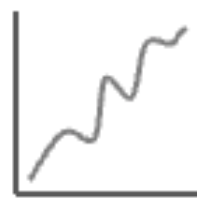
relate to

organize

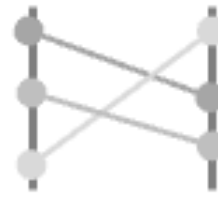
path

structure

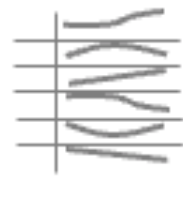
Chart Types | Time



Line



Slope



Sparklines



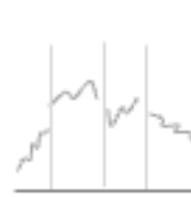
Bump



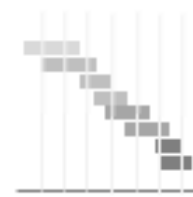
Area



Stacked
Area



Cycle



Gantt

signal words

trend

time

over time

dates

days

weeks

months

quarters

years

pattern

cycle

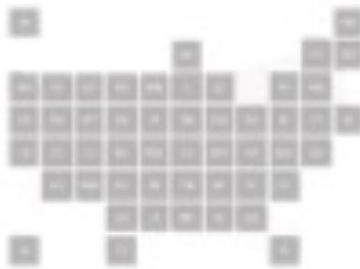
Chart Types | Spatial



Choropleth



Proportional
Symbol



Tile Grid

signal words

geography

map

spatial

location

country

state

county

city

regional variation

Types of Charts

Selection Framework

Chart Types

Comparison

Composition

Distribution

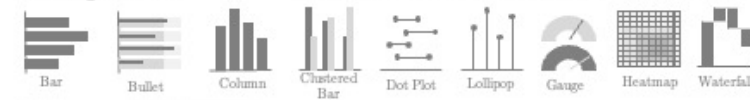
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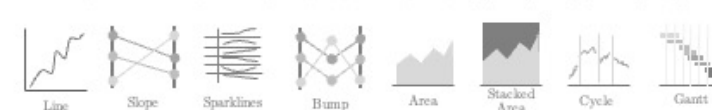
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signal words | correlation, connection, relationship, relate to, organize, path, structure



Time

signal words | trend, time, over time, dates, days/weeks/months/quarters/years, pattern, cycle



Spatial

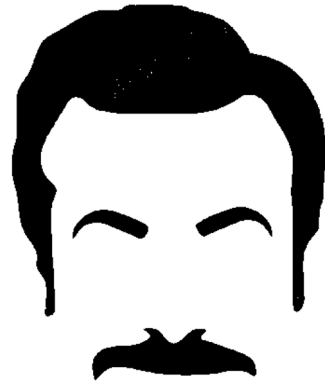
signal words | geography, map, spatial, location, country, state, county, city, regional variation



Exploratory Data
Visualization
via Chart Type
Selection

Exploratory Data
Visualization
via Chart Type
Selection

Ted Lasso Approach to EDA



Be curious,
not judgmental

- Ted Lasso via Walt Whitman

Exploratory Data
Visualization
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Ted Lasso Approach to EDA



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- 1 Use the chart type framework categories as a basis to generate questions about the data
- 2 Explore potential visuals via sketching and prototyping
- 3 Select a visual and story that aligns with objectives and refine

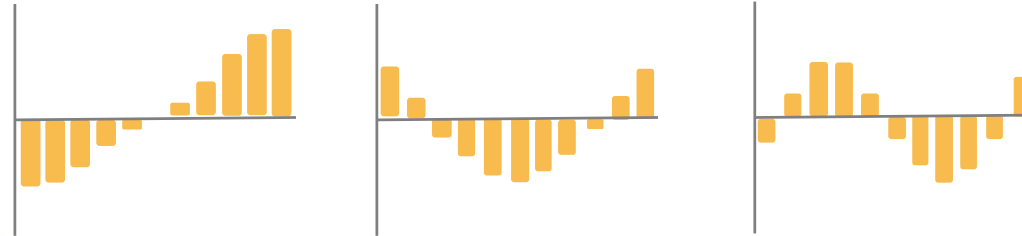
Exploratory Data Visualization via Chart Type Selection Practice

* Using this dataset,
brainstorm three
questions/goal
statements along
with three potential
sketched visuals for
exploration

Tesla Quarterly Vehicle Deliveries by Type

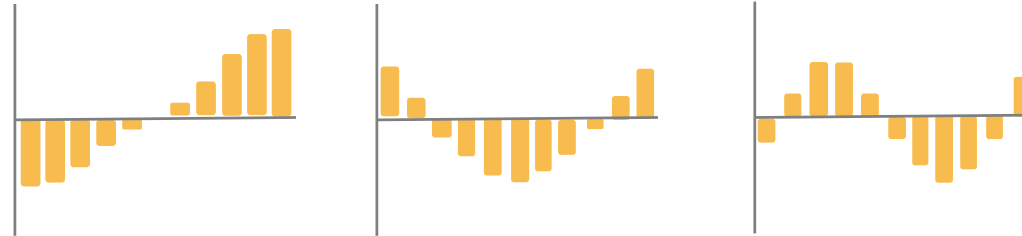
Deliveries	Tesla Model 3	Tesla Model Y	Tesla Model S	Tesla Model X	Total
Q2 2016	0	0	9764	4638	14402
Q3 2016	0	0	16047	8774	24821
Q4 2016	0	0	12700	9500	22200
Q1 2017	0	0	13481	11570	25051
Q2 2017	0	0	12010	10010	22020
Q3 2017	220	0	14065	11865	26150
Q4 2017	1550	0	15200	13120	29870
Q1 2018	8180	0	11730	10070	29980
Q2 2018	18440	0	10930	11370	40740
Q3 2018	55840	0	14470	13190	83500
Q4 2018	63150	0	13500	14050	90700
Q1 2019	50900	0	6000	6100	63000
Q2 2019	77634	0	8422	9300	95356
Q3 2019	79703	0	8383	9100	97186
Q4 2019	92620	0	8375	11100	112095
Q1 2020	73975	2291	4525	7705	88496
Q2 2020	63793	16484	3927	6687	90891
Q3 2020	94049	30269	4583	10693	139594
Q4 2020	126624	35123	6060	12860	180667
Q1 2021	115077	67780	1010	1010	184877
Q2 2021	110054	89360	890	1000	201304
Q3 2021	111225	120800	9000	275	241300
Q4 2021	140000	156850	4050	7700	308600
Q1 2022	129764	165560	7362	7362	310048

Takeaways



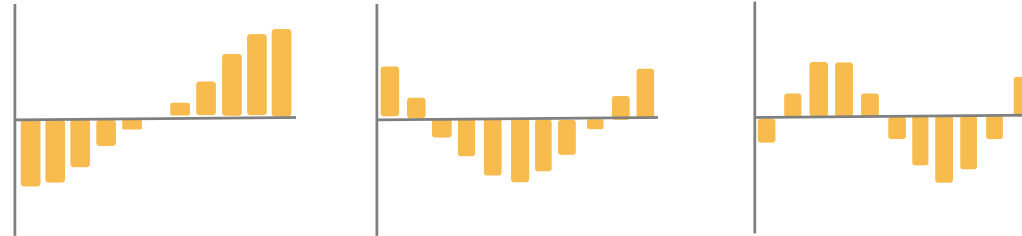
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- 4 Be curious...use potential chart types and selection process
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Takeaways



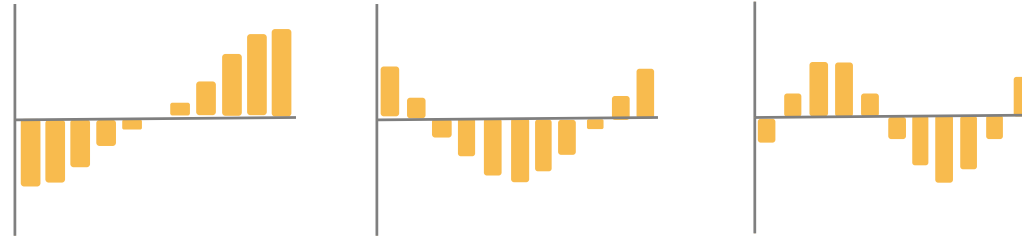
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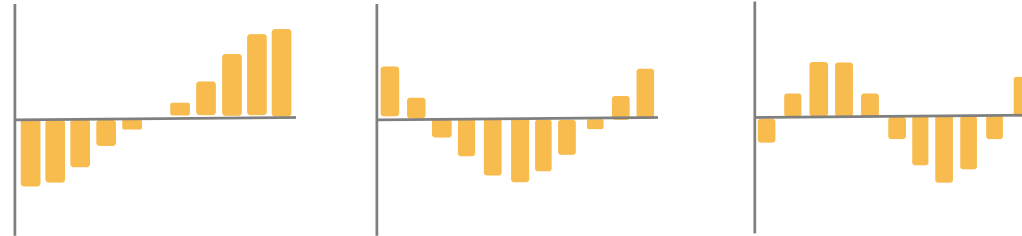
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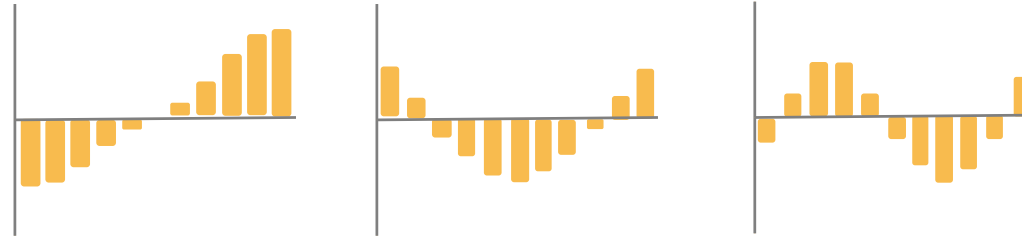
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- 3 Data visualization skills are best developed through
critiquing + redesigning using mini-case studies
- 4 Be curious...use potential chart types and selection process
to spur creativity and exploration of data

Crafting Impactful Data Stories:

Design Principles
Exploration + Conception
Storytelling



Agenda

Data Visualization Design Principles

Chart Types + EDA

Break

Storytelling

Takeaways

Crafting Impactful Data Stories:

Design Principles
Exploration + Conception
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Agenda

Data Visualization Design Principles

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Takeaways

Overview

No. 1 Starting Premise

No. 2 The Power of Stories

No. 3 Stories + Data

No. 4 Strategies for Storytelling

No. 5 Jack of all Tools

No. 6 Takeaways

Crafting Impactful Data Stories: Storytelling

- # No. 1 Starting Premise
- ## No. 2 The Power of Stories
- ## No. 3 Stories + Data
- ## No. 4 Strategies for Storytelling
- ## No. 5 Jack of all Tools
- ## No. 6 Takeaways

No. 1

Starting Premise

Higher Education + Interdisciplinary Shortcomings

Presenting Documents vs. Giving a Presentation

Tools Don't Dictate Design

No. 1

Starting Premise

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Crafting Impactful
Data Stories:
Storytelling

No. 1 Starting Premise

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No. 6 Takeaways

March 29th, 2020

6,149,000

weekly initial unemployment claims

Power of Stories

5%

Percentage of audience members that
could remember a single statistic

Power of Stories

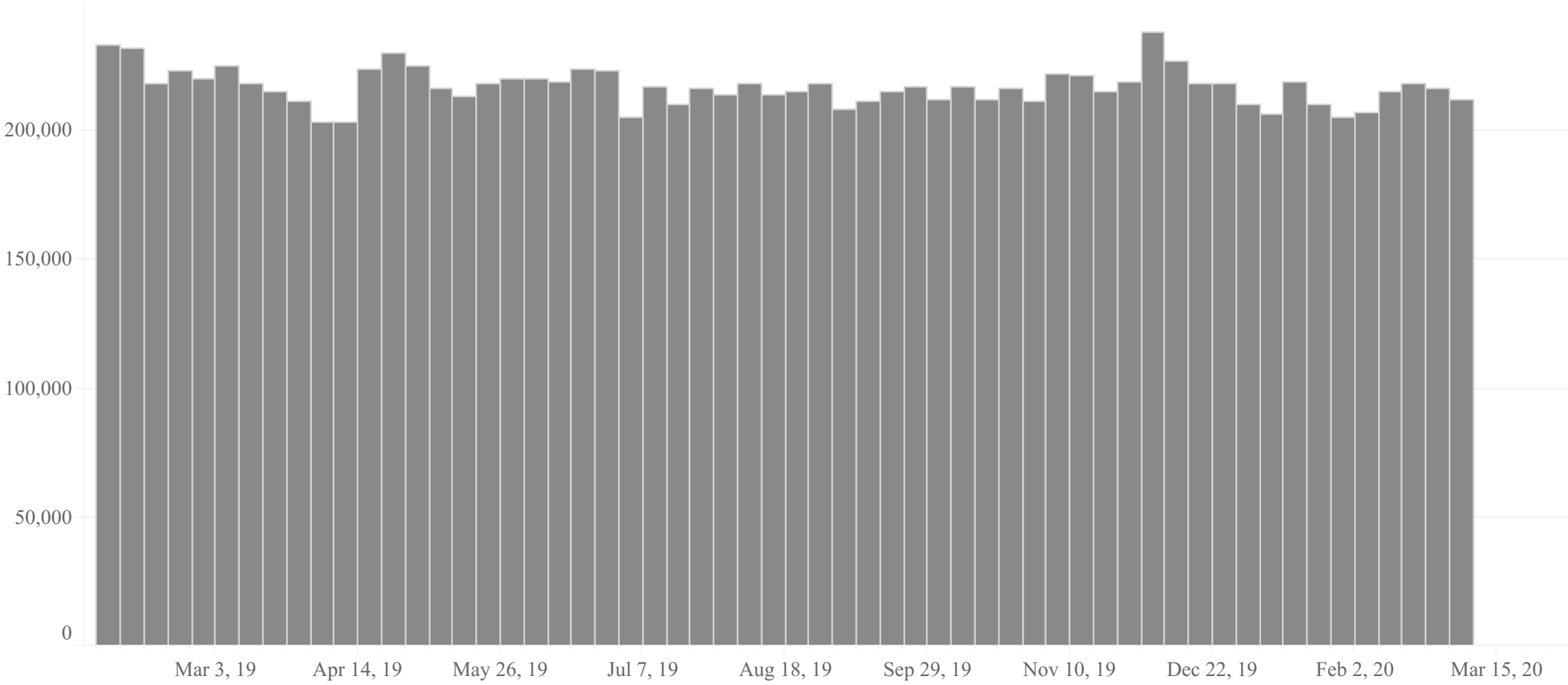
5%

Percentage of audience members that could remember a single statistic

63%

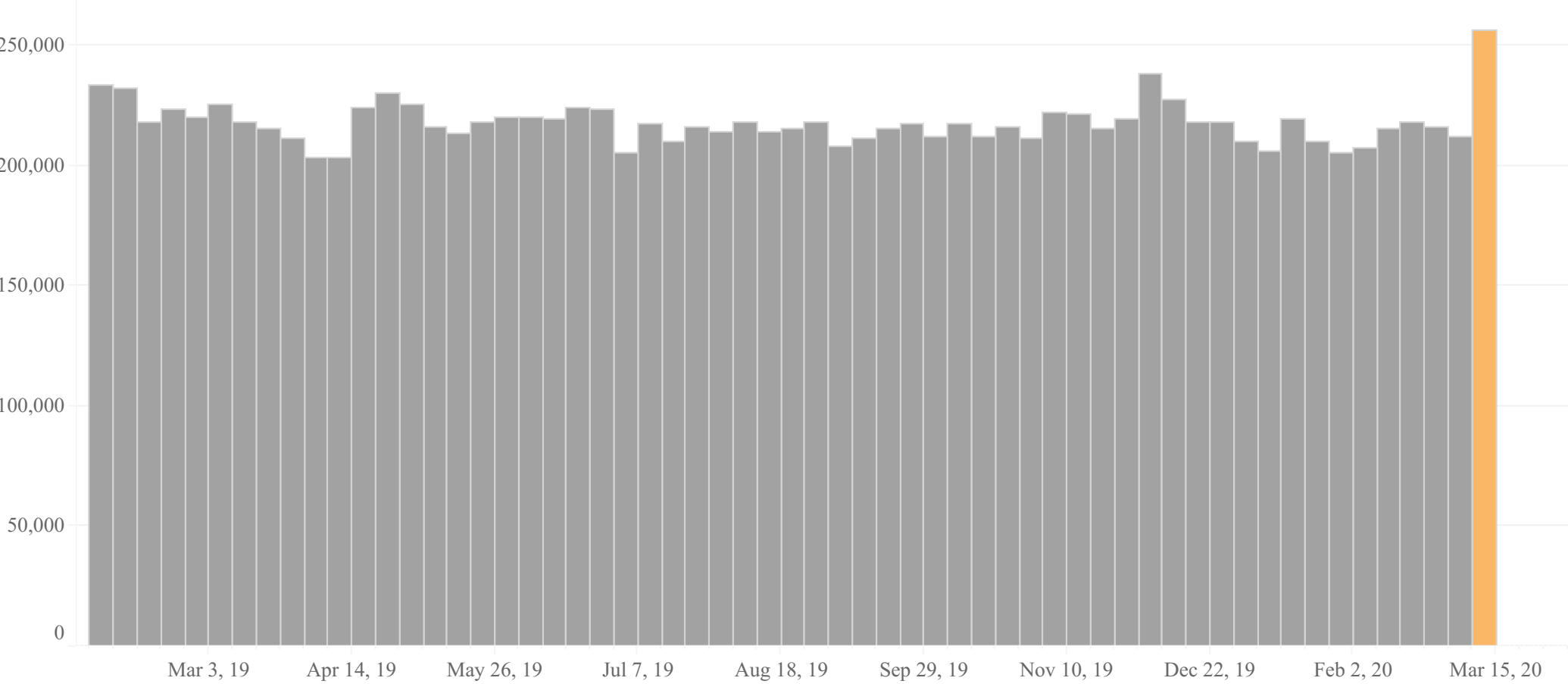
Percentage of audience members that could remember stories

Weekly Initial Unemployment Claims Prior to the Pandemic



Source: Bureau of Labor Statistics

Weekly Initial Unemployment Claims Slowly Rise due the Pandemic in mid-March 2020



Source: Bureau of Labor Statistics

Weekly Initial Unemployment Claims Reach Unprecedented Levels by April 2020

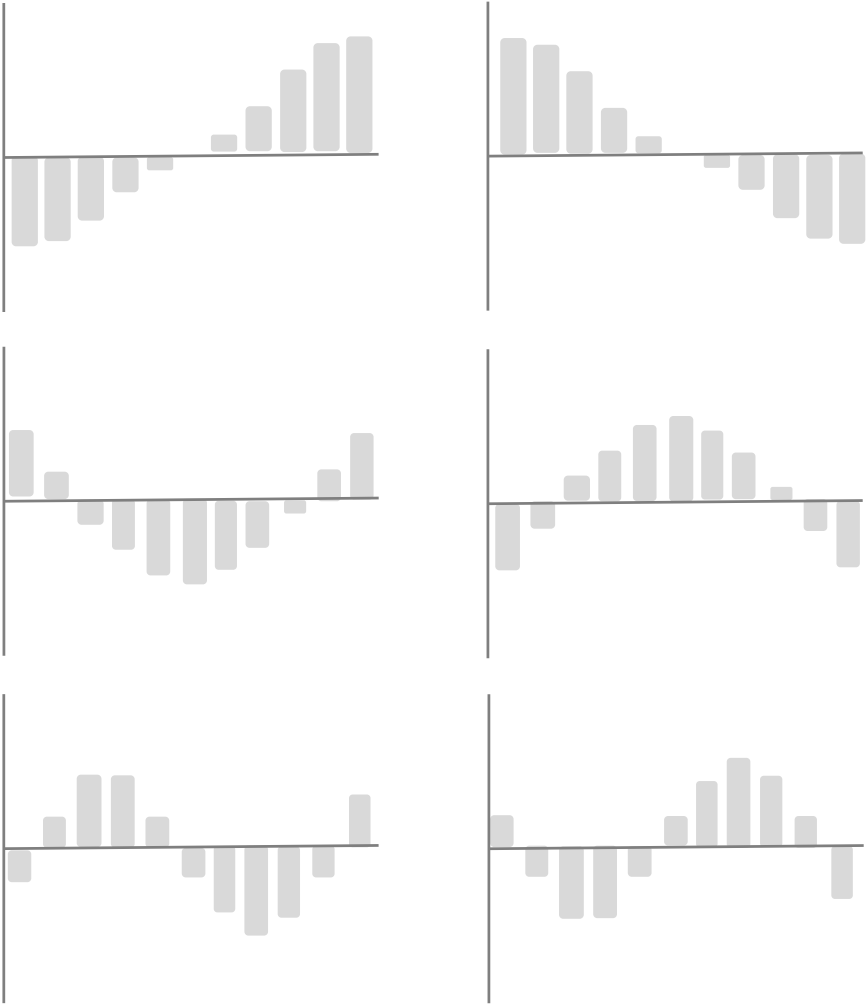


Source: Bureau of Labor Statistics

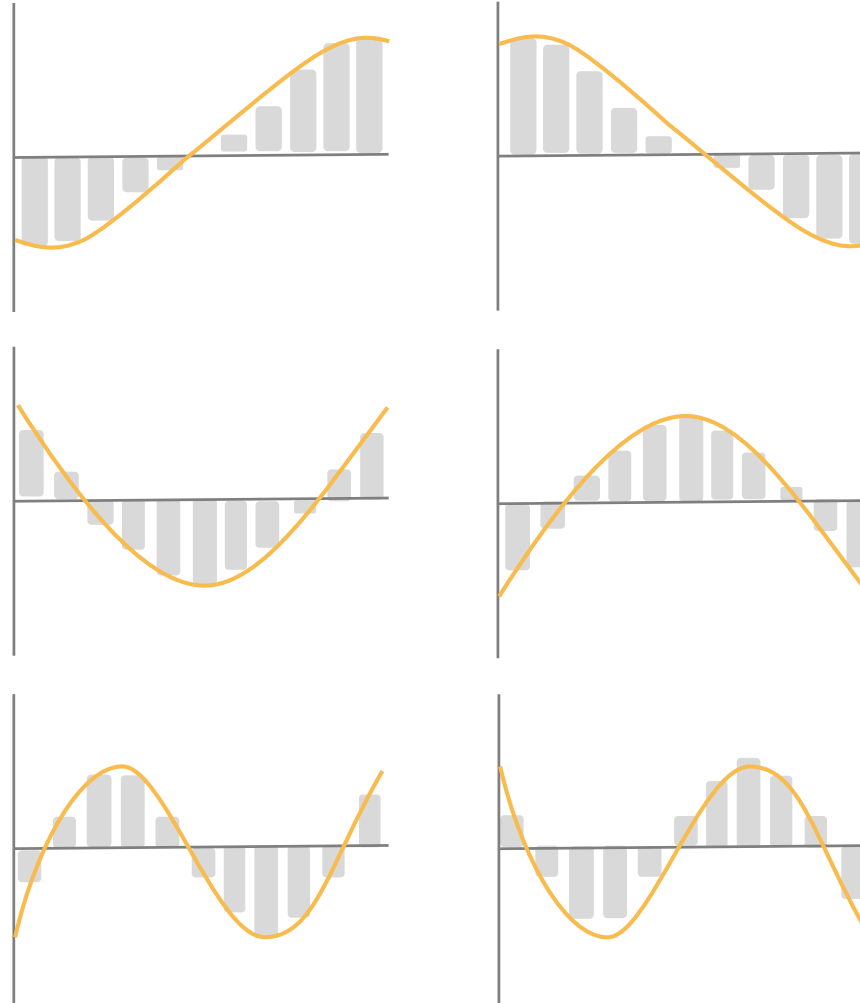
Crafting Impactful
Data Stories:
Storytelling

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- No. 1 Starting Premise
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- No. 5 Jack of all Tools
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- No. 6 Takeaways
- .
- .

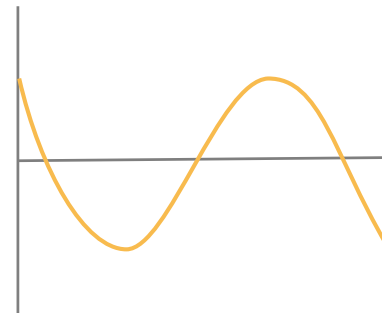
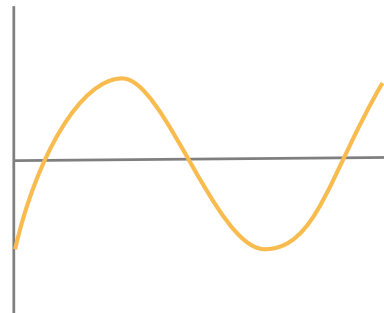
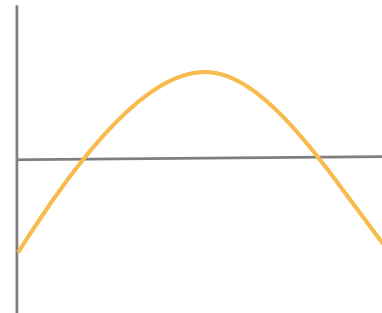
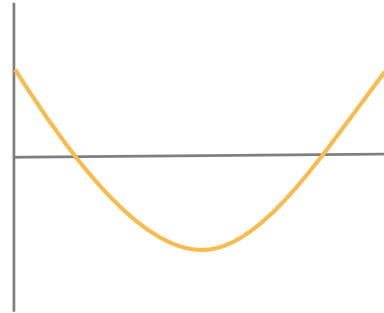
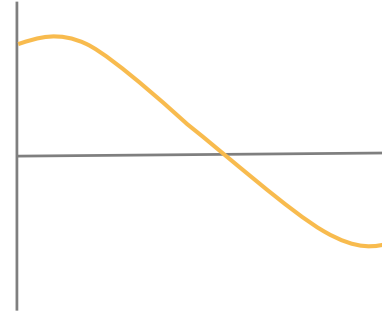
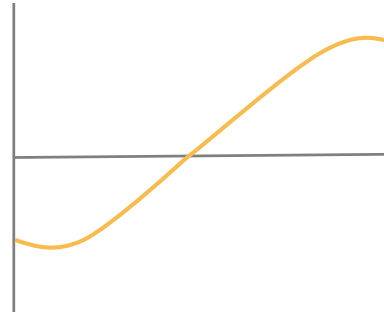
Data...



The Patterns of Data...



The Patterns
of Data...

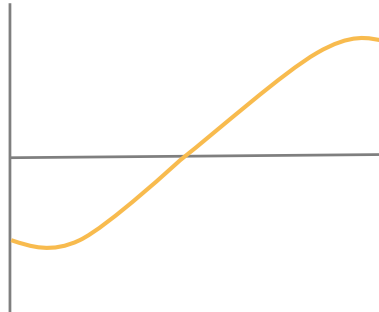


Resemble the “Arcs”
of Stories.

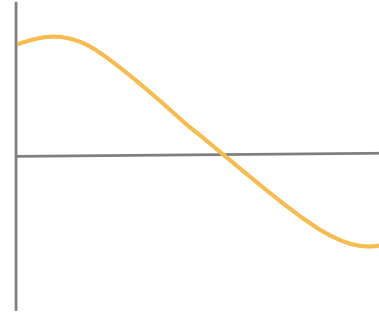
Six Common Story Arcs

Rags to Riches

rise

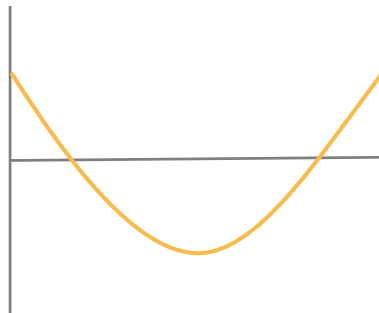


Riches to Rags fall



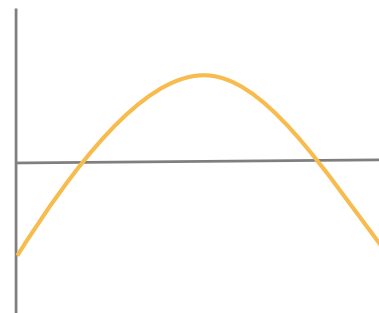
Man-in-Hole

fall-rise



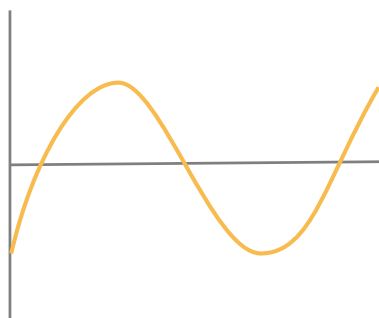
Icarus

rise-fall



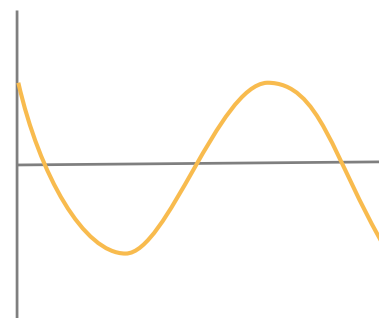
Cinderella

rise-fall-rise

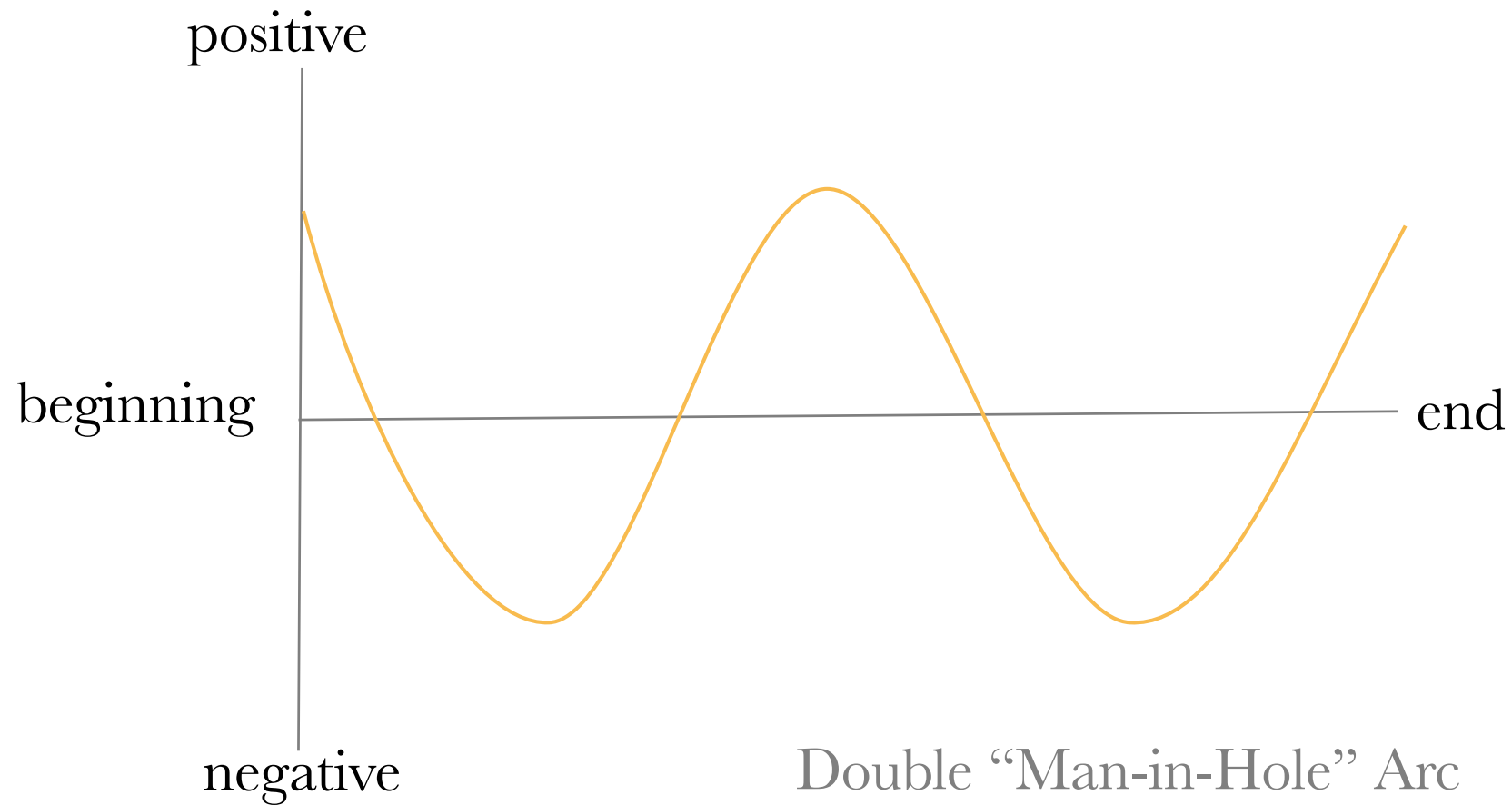


Oedipus

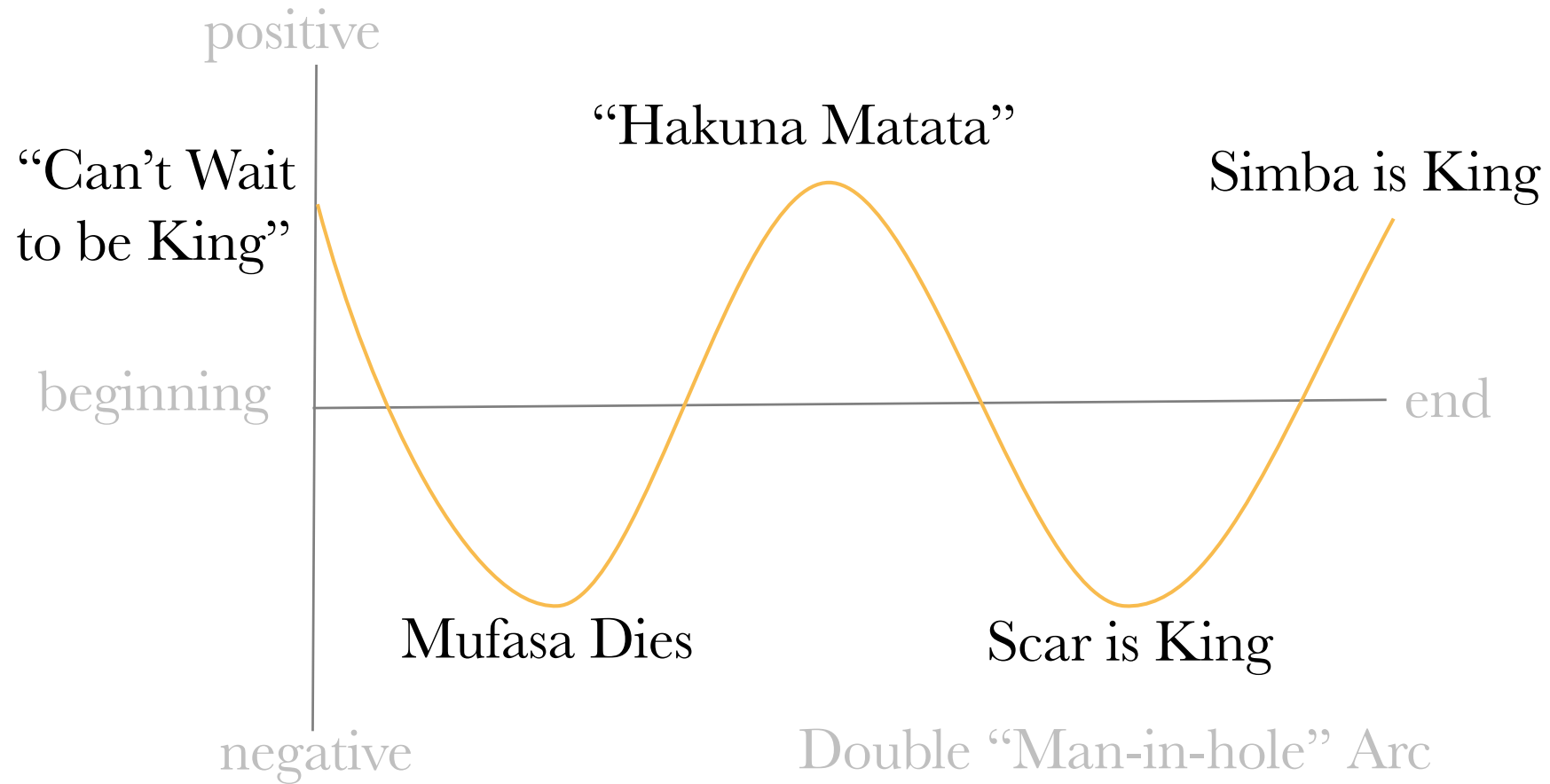
fall-rise-fall

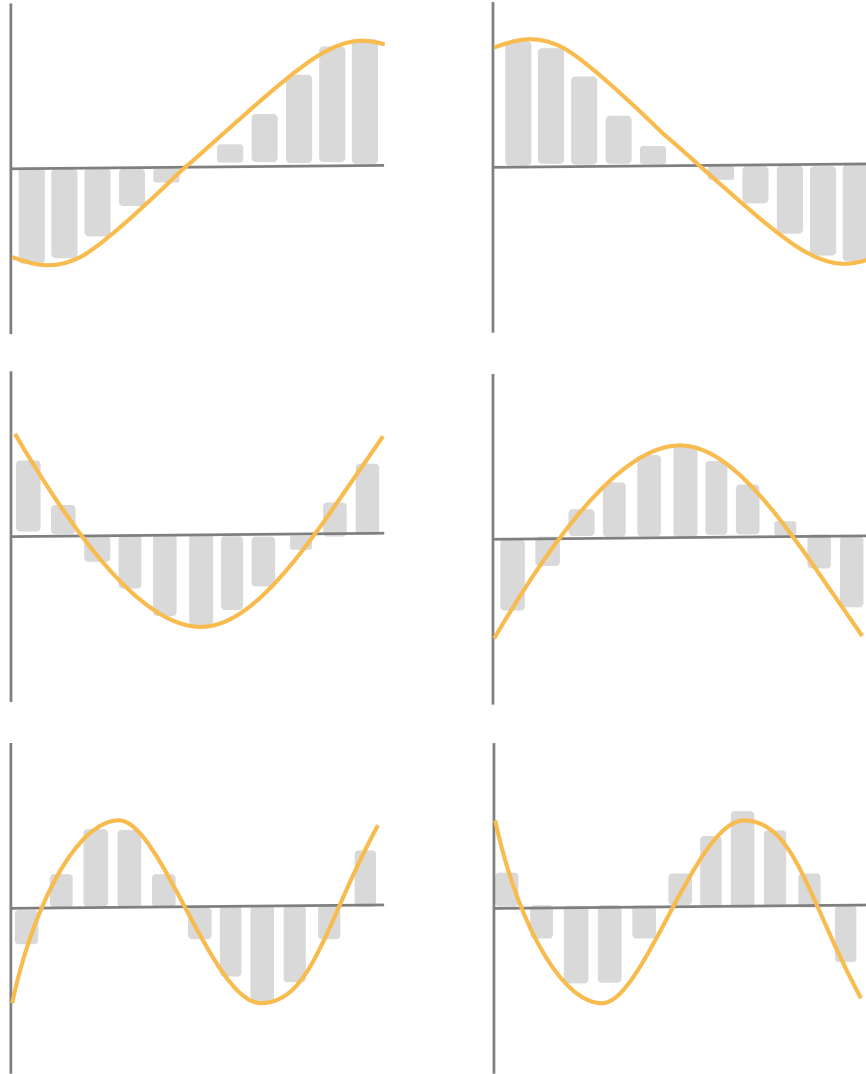


Story Arc | The Lion King



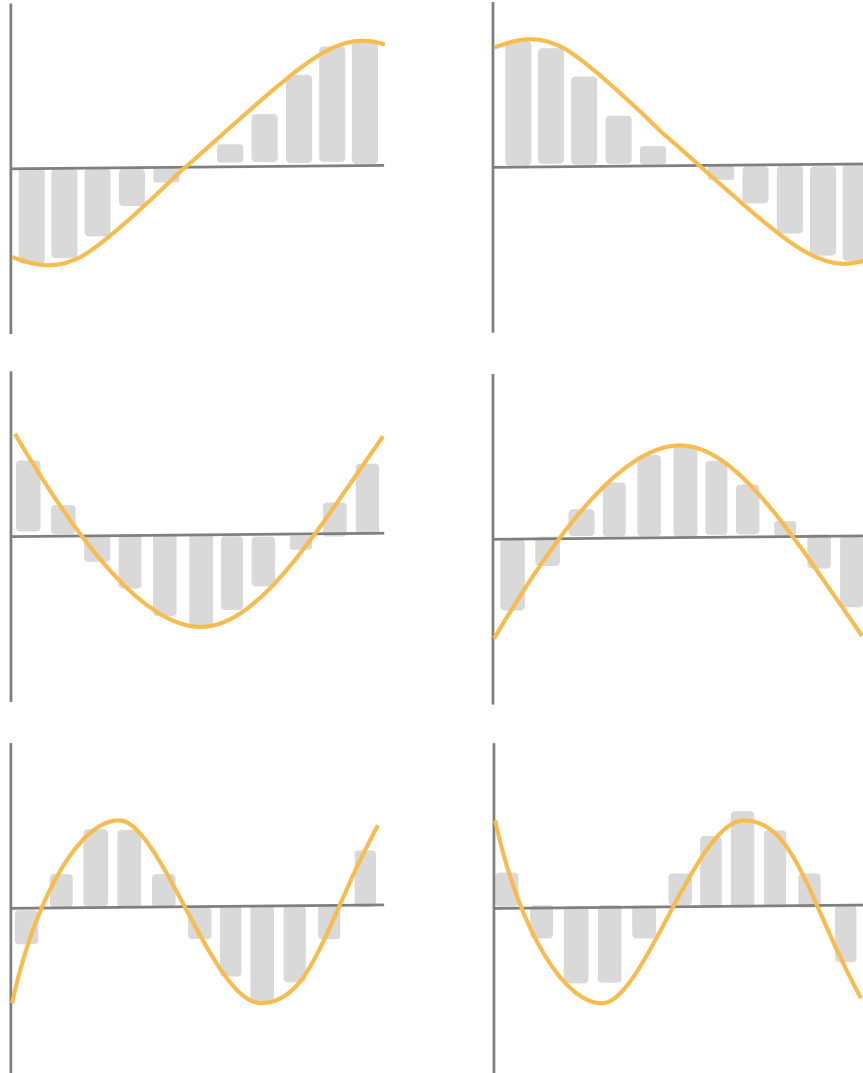
Story Arc | The Lion King





Stories + Data

- 1 Explore Data for Arcs**
Are there patterns in your data that resemble story arcs?
- + Presentation Strategy**
2 Context Storytelling
Can you display your data in stages by adding context? Zoom in or out? Highlight? Annotate?
- 3 Hide-n-Reveal Storytelling**
Thinking in arcs, can you build up to the punchline? Hide data with sudden reveal?



Stories + Data

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Are there patterns in your data that resemble story arcs?

+ Presentation Strategies
2 Context Storytelling
Can you display your data in stages by adding context? Zoom in or out? Highlight? Annotate?

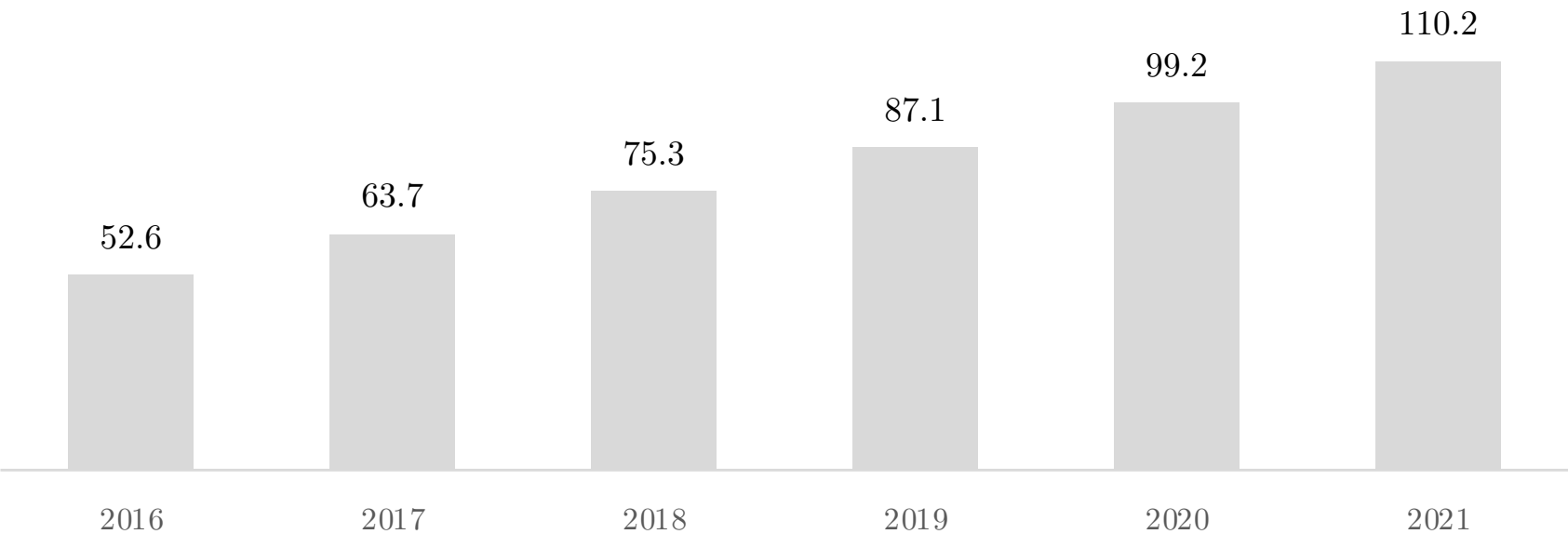
3 Hide-n-Reveal Storytelling
Thinking in arcs, can you build up to the punchline? Hide data with sudden reveal?

Context

Storytelling

Company growth has more than doubled over the past five years

Firm Revenue | millions (\$)

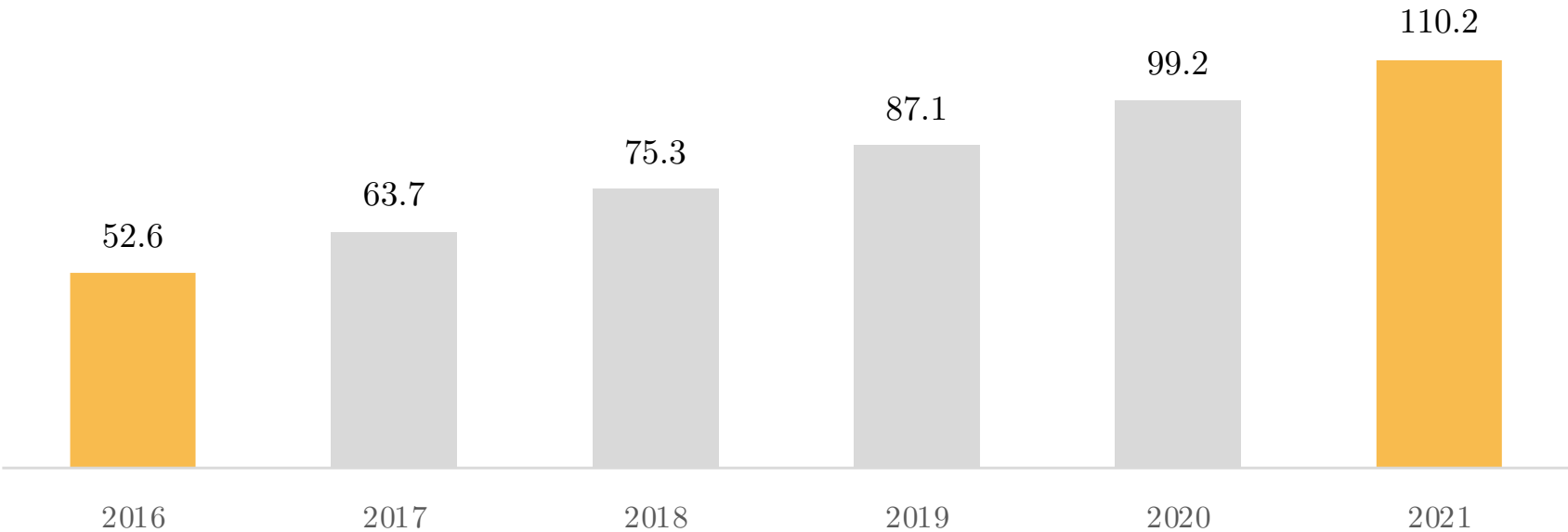


Context

Storytelling

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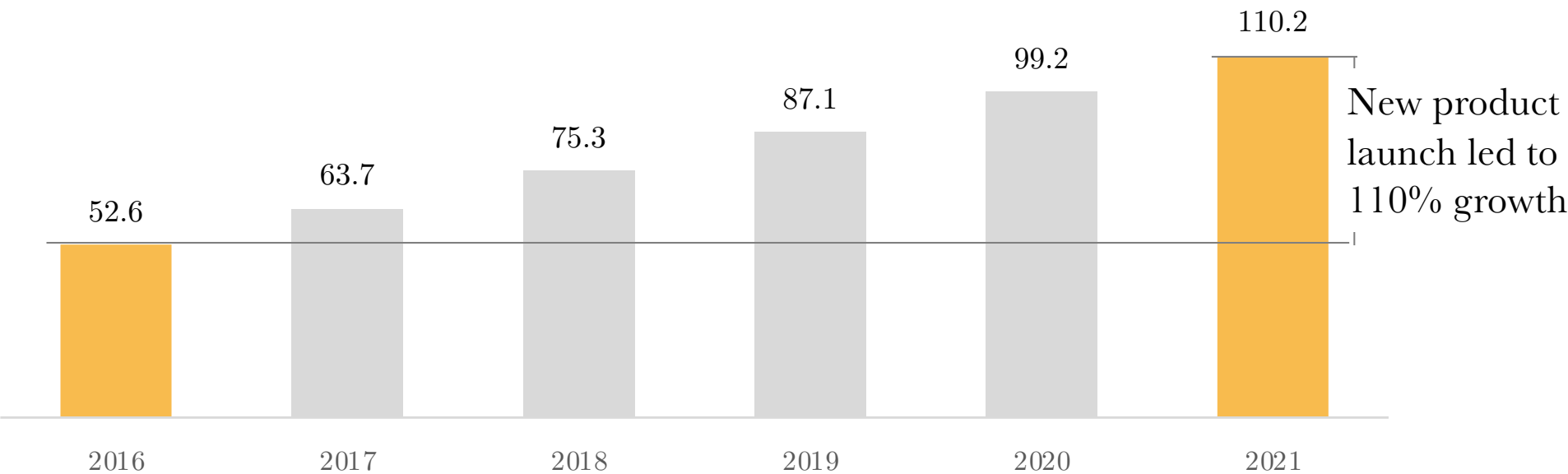


Context

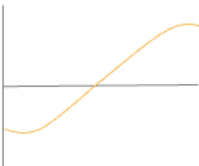
Storytelling

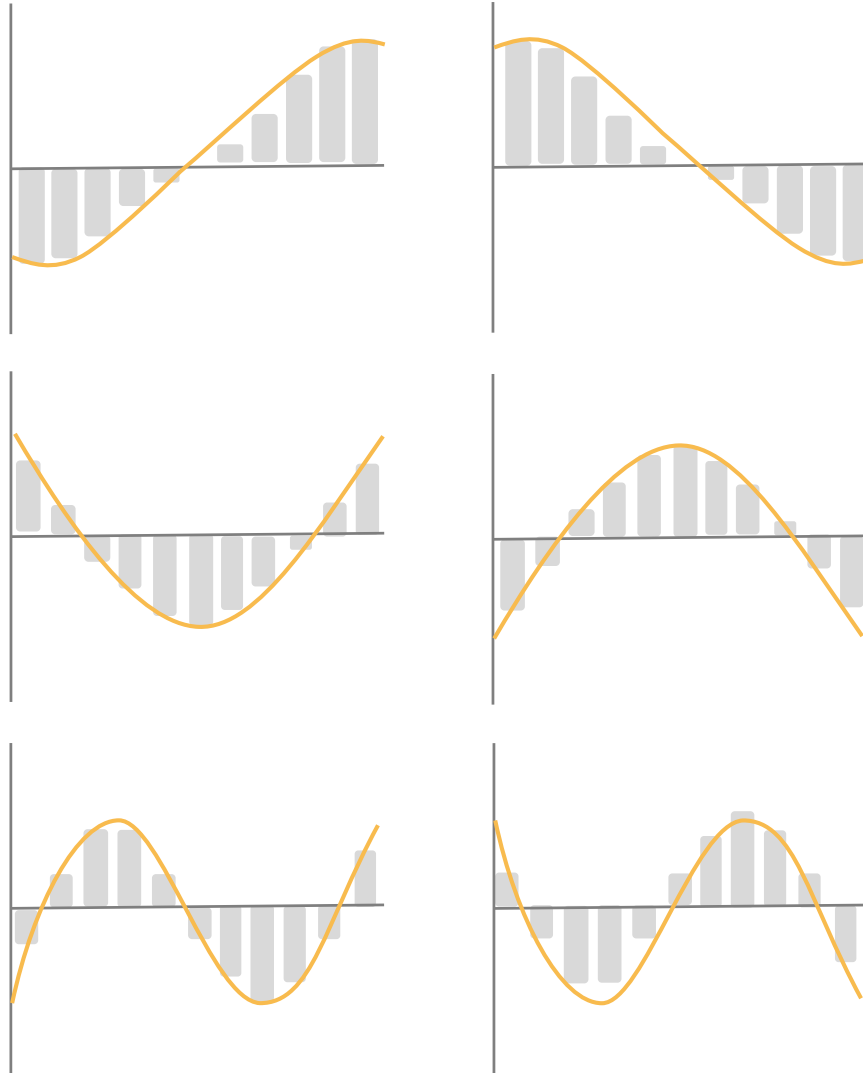
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Firm Revenue | millions (\$)



Rags to Riches
rise





Stories + Data

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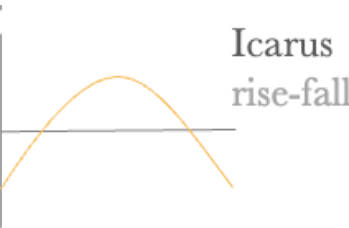
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Thinking in arcs, can you build up to the punchline? Hide data with sudden reveal?

Hide-n-
Reveal
Storytelling



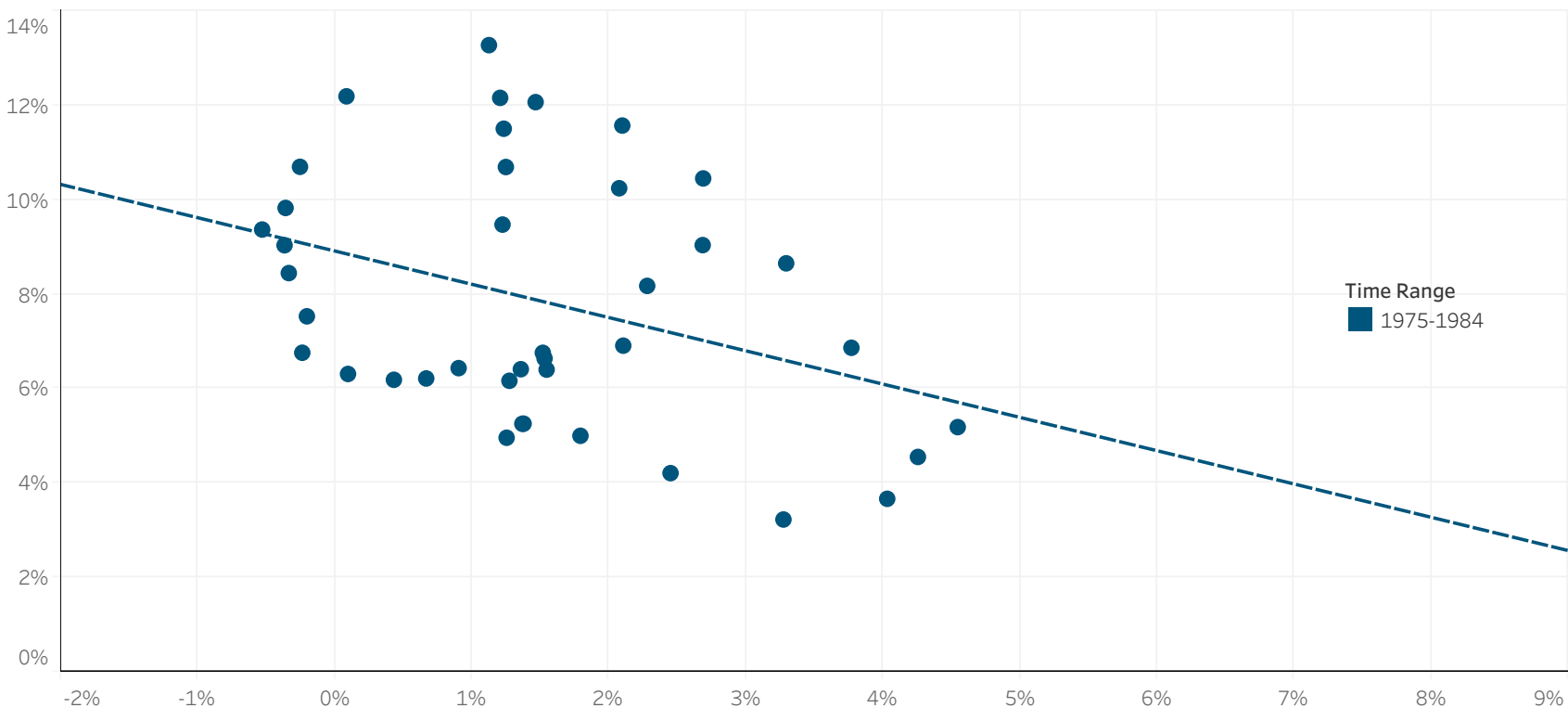
Hide-n- Reveal Storytelling



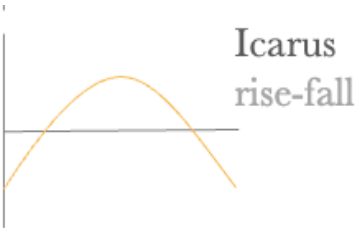
Historically, the Phillips Curve demonstrated a "close" (inverse) relationship between inflation and unemployment

Phillips Curve: A Retrospective

Inflation and Cyclical Unemployment in the US, quarterly



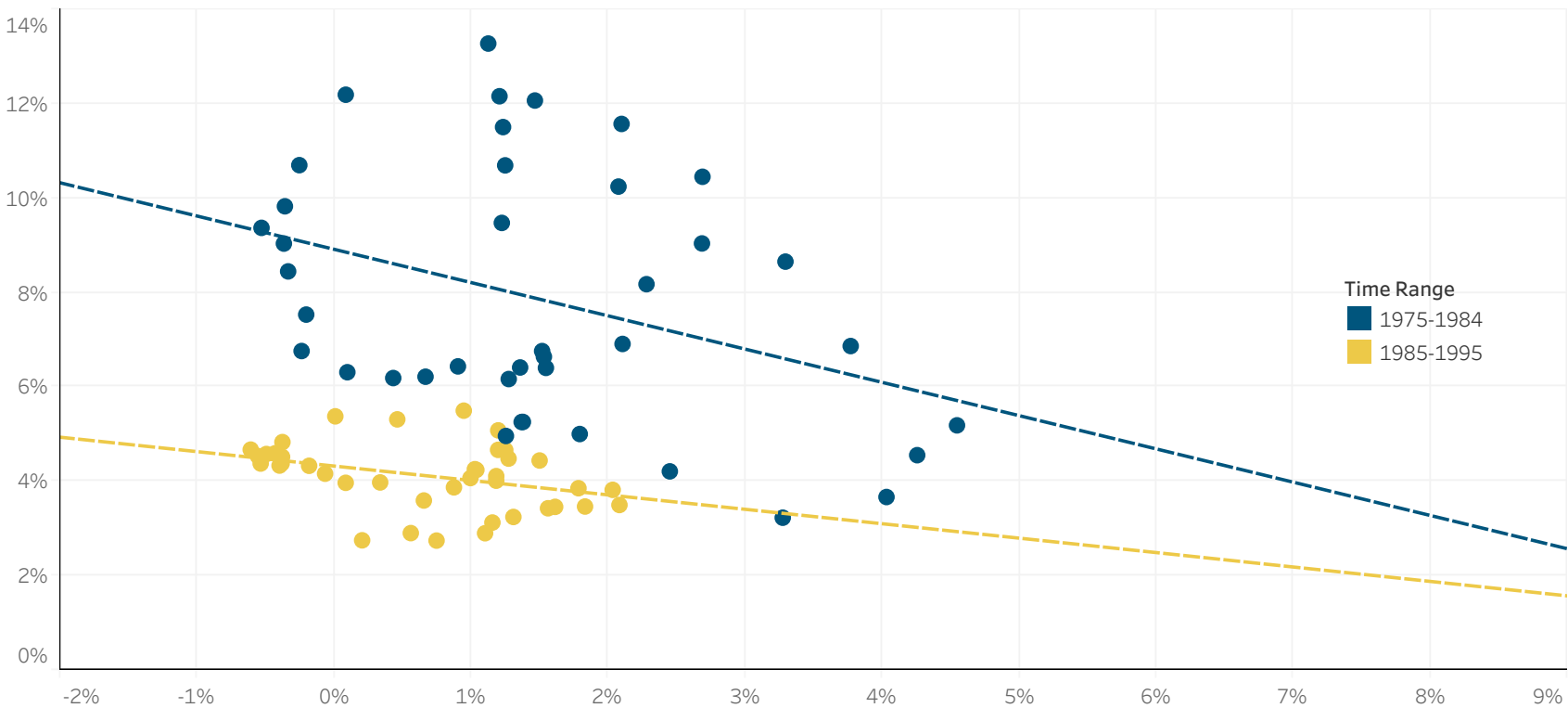
Hide-n- Reveal Storytelling



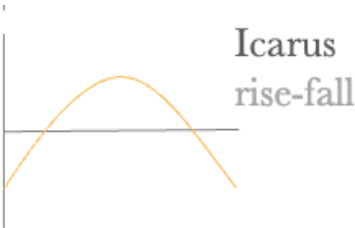
Fast forwarding a decade, the inverse relationship still exists, but weakens

Phillips Curve: A Retrospective

Inflation and Cyclical Unemployment in the US, quarterly



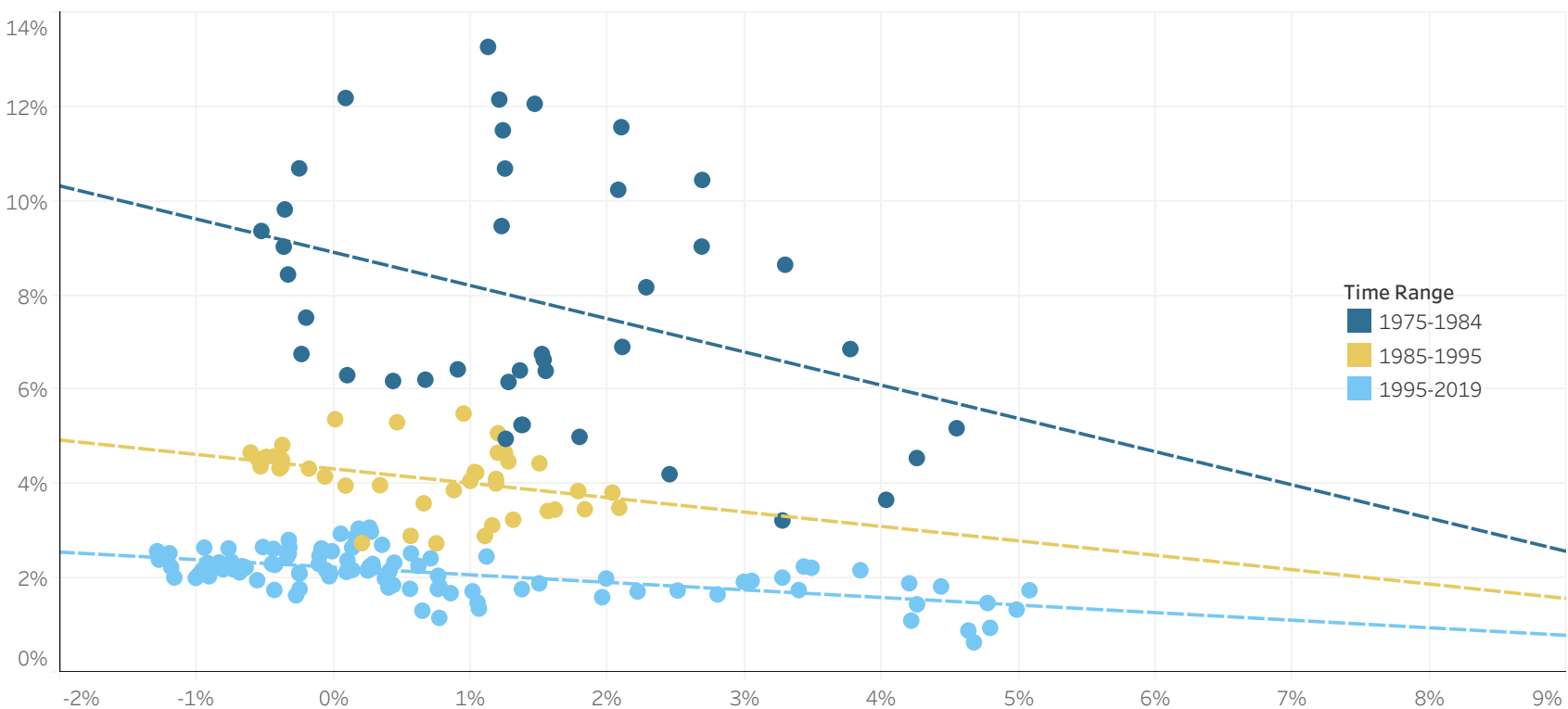
Hide-n-Reveal Storytelling

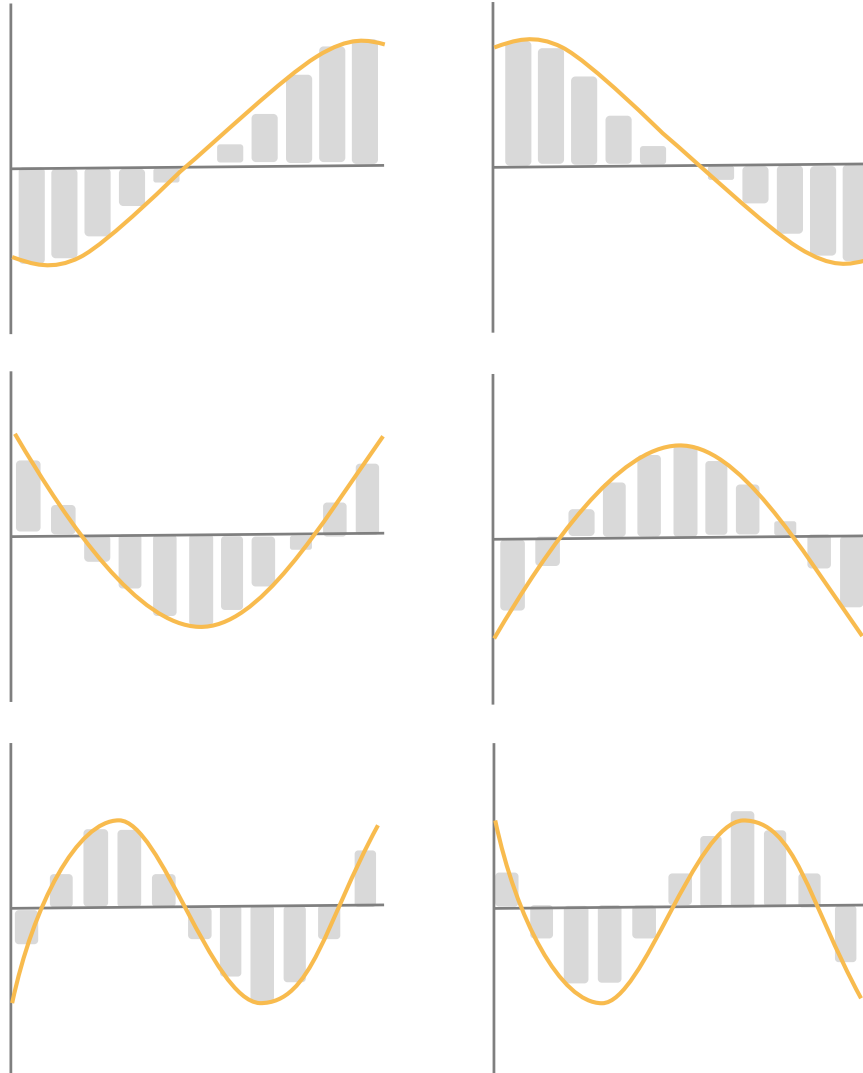


Phillips curve relationship flatlines in pre-pandemic decades...

Phillips Curve: A Retrospective

Inflation and Cyclical Unemployment in the US, quarterly



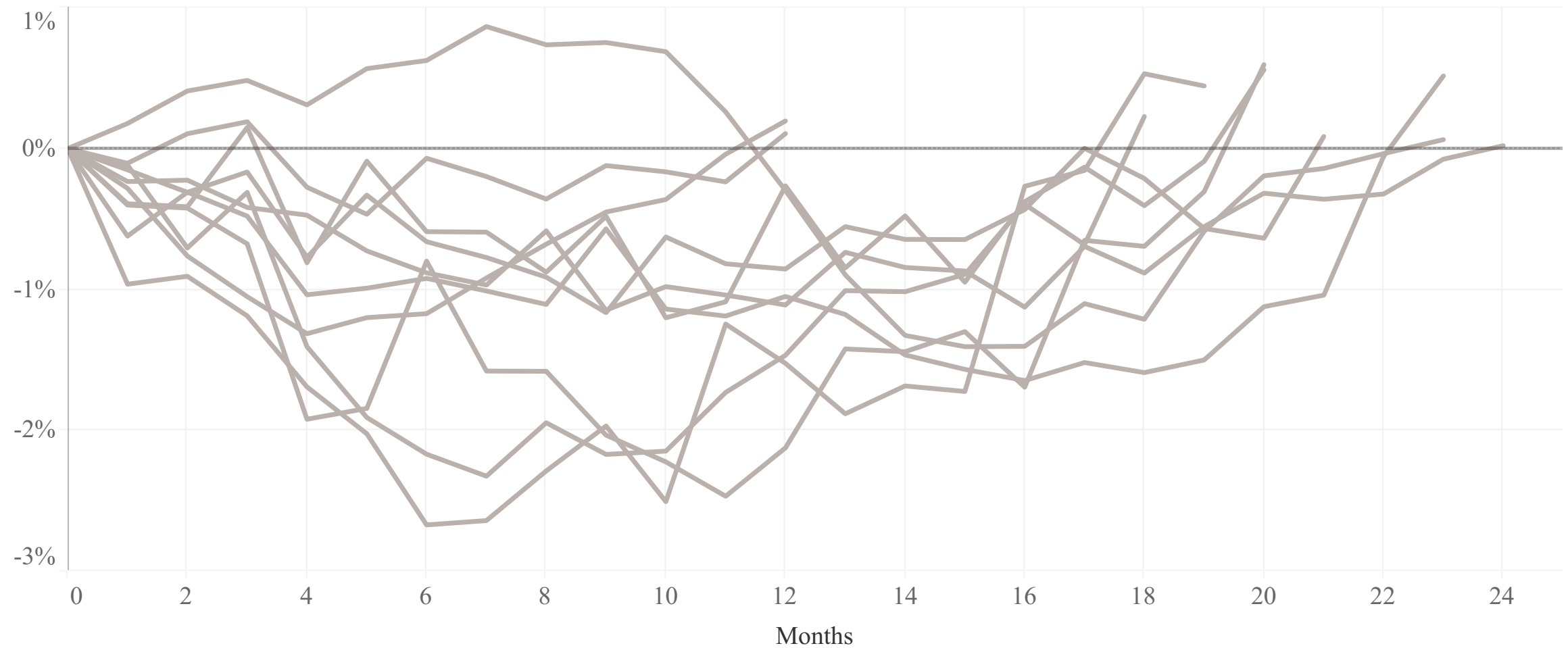


Stories + Data

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Job Losses during post-WWII Recessions

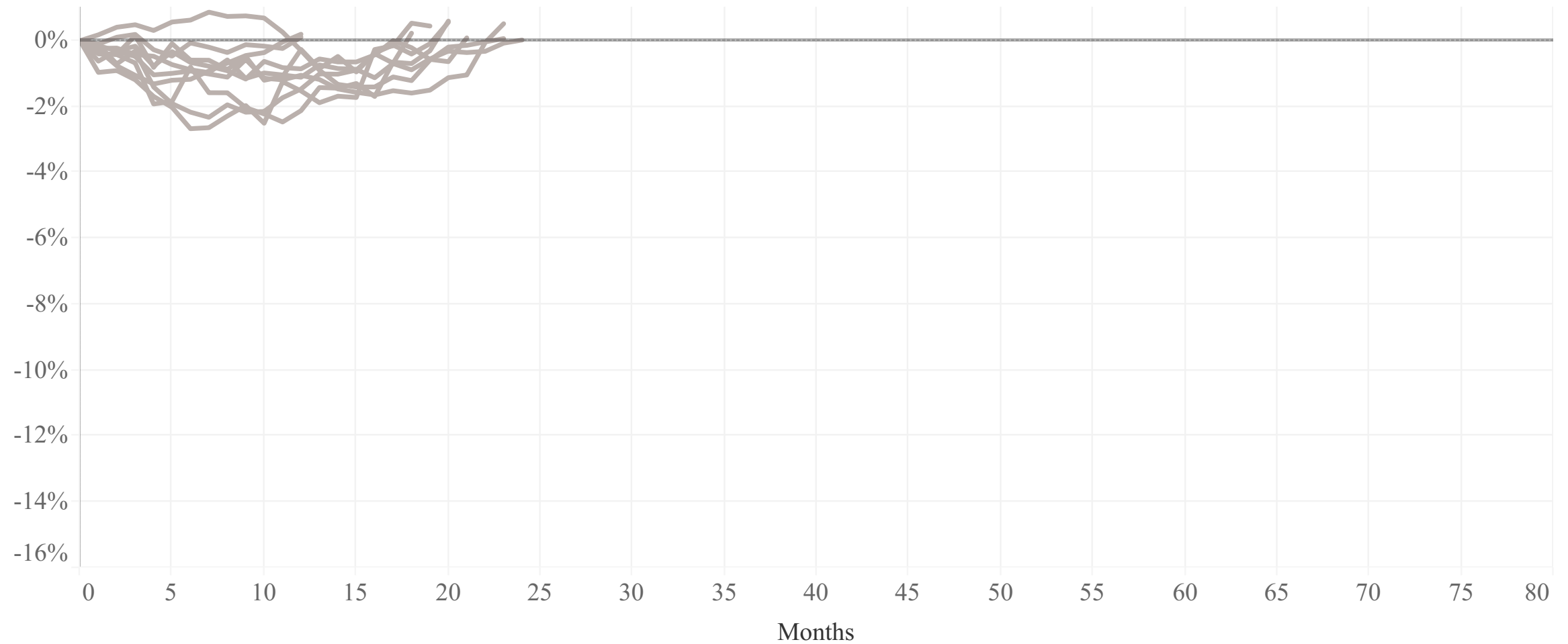
Percent change relative to first month of a recession through the beginning of positive trend (updated through July 2021)



Source: Bureau of Labor Statistics

Job Losses during post-WWII Recessions | Typical recessions last between 18-24 months

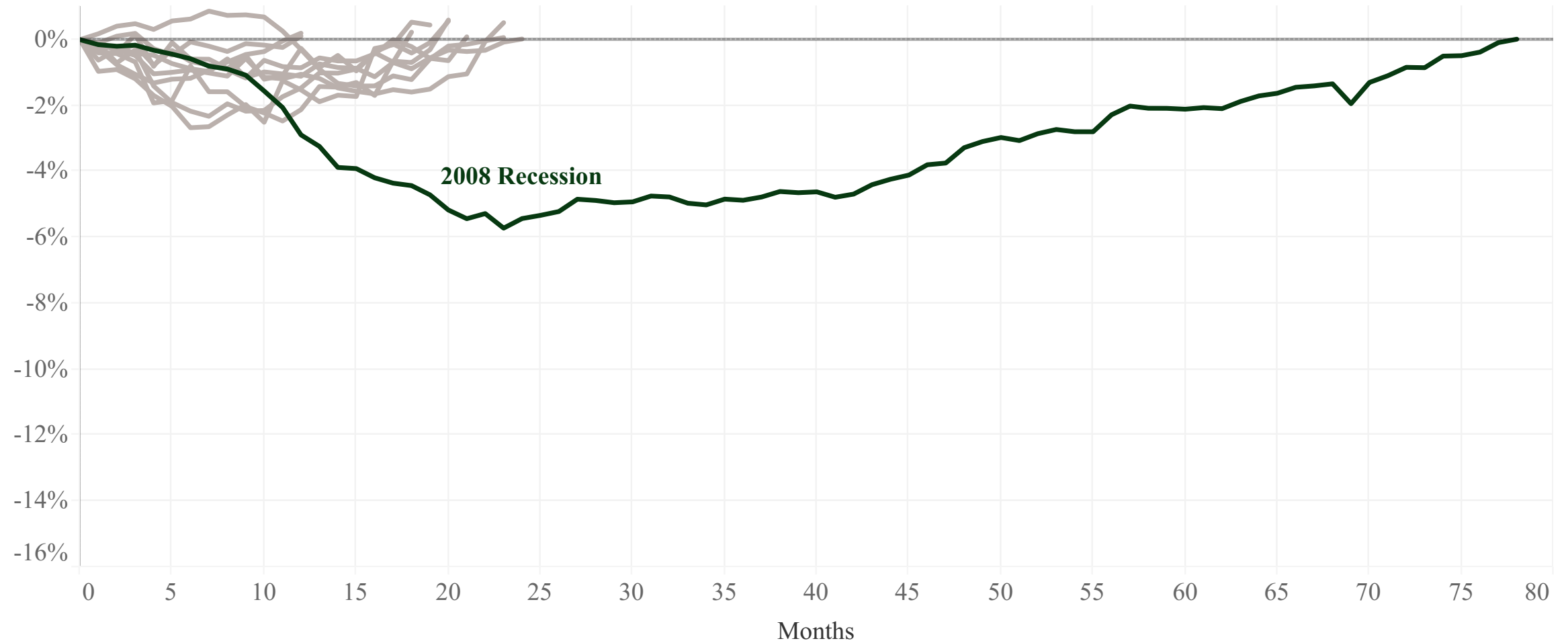
Percent change relative to first month of a recession through the beginning of positive trend (updated through July 2021)



Source: Bureau of Labor Statistics

Job Losses during post-WWII Recessions | The 2008 recession added length

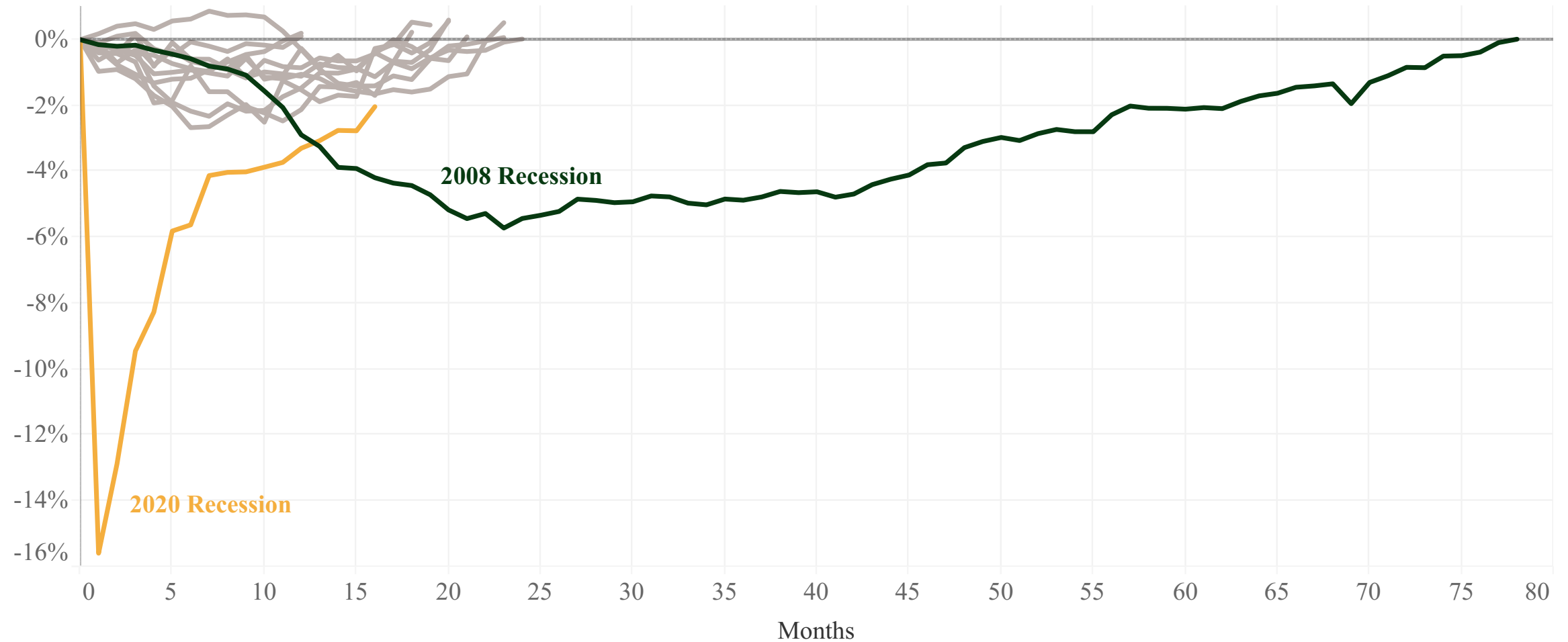
Percent change relative to first month of a recession through the beginning of positive trend (updated through July 2021)



Source: Bureau of Labor Statistics

Job Losses during post-WWII Recessions | The 2020 recession added depth

Percent change relative to first month of a recession through the beginning of positive trend (updated through July 2021)



Source: Bureau of Labor Statistics

Crafting Impactful
Data Stories:
Storytelling

- No. 1 Starting Premise
- No. 2 The Power of Stories
- No. 3 Stories + Data
- No. 4 Strategies for Storytelling**
- No. 5 Jack of all Tools
- No. 6 Takeaways

No. 4
Strategies
for
Storytelling

Searching for Stories

Make it Human

Scale + Perspective

Shock + Awe

No. 4
Strategies
for
Storytelling

Searching for Stories

Make it Human

Scale + Perspective

Shock + Awe

“There is magic in graphs. The profile of a curve reveals in a flash a whole situation - the life history of an epidemic, a panic, or an era of prosperity. The curve informs the mind, awakens the imagination, convinces.”

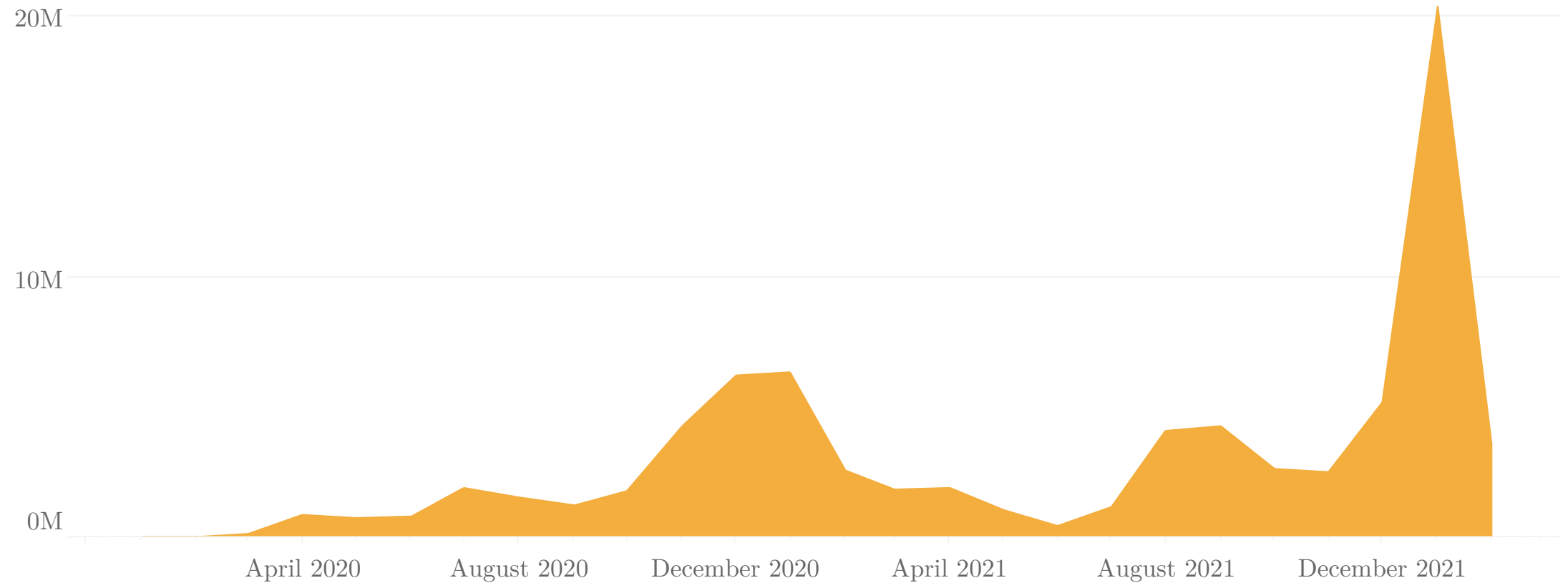
.....

Henry Hubbard, National Bureau of Standards

excerpt from Brinton(1939). Graphical Presentation

The COVID Curve

US COVID 7-day Moving Average Cases



Source: CDC

No. 4
Strategies
for
Storytelling

Searching for Stories

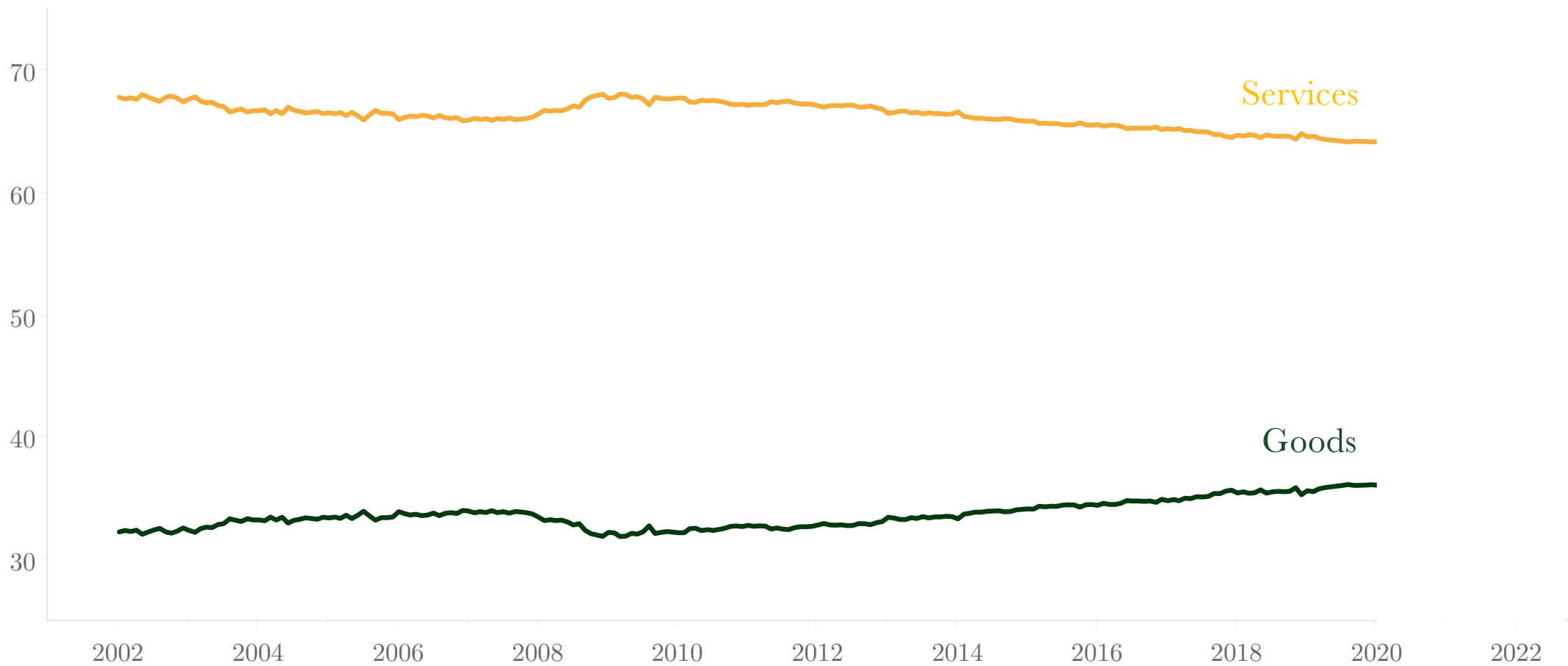
Make it Human

Scale + Perspective

Shock + Awe

Shares of consumer spending on goods and services have been relatively stable

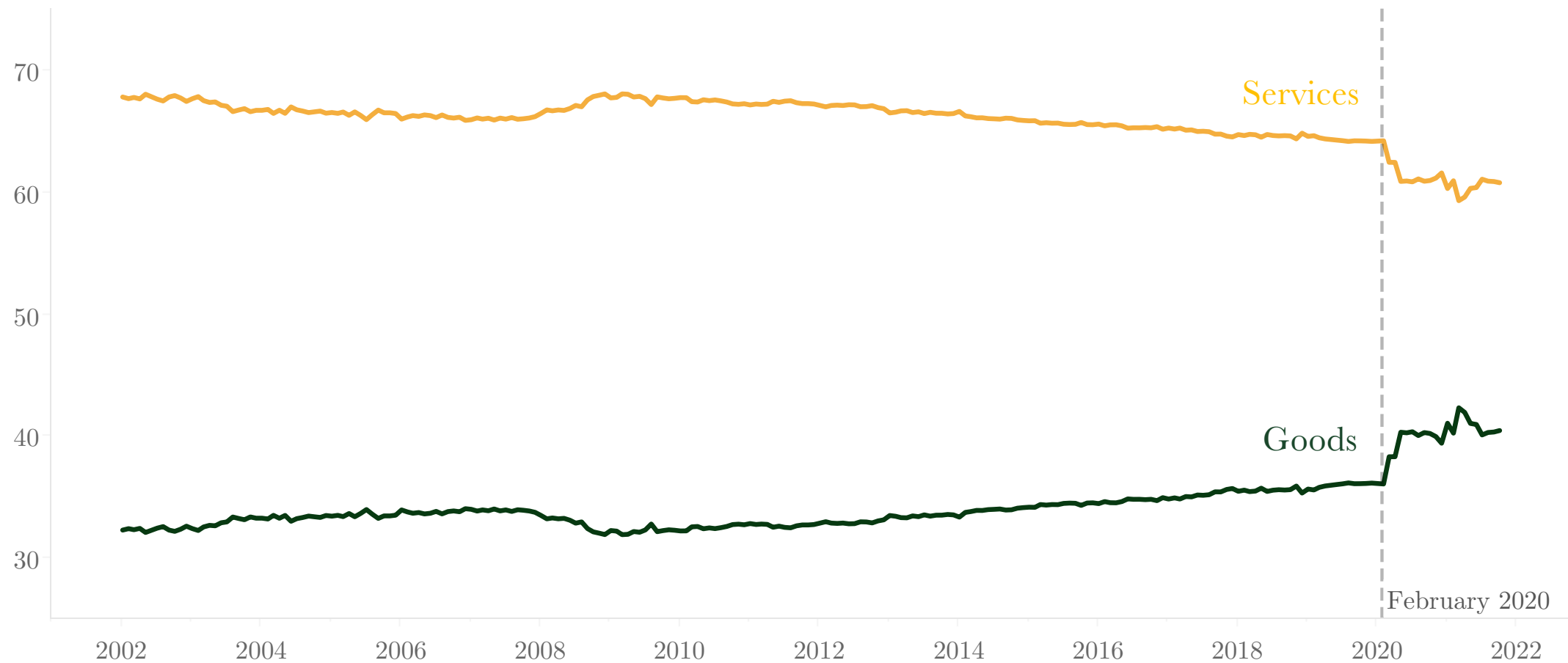
Share of Real Personal Consumption Expenditures
Goods vs. Services



The pandemic shifted preferences away from services to goods

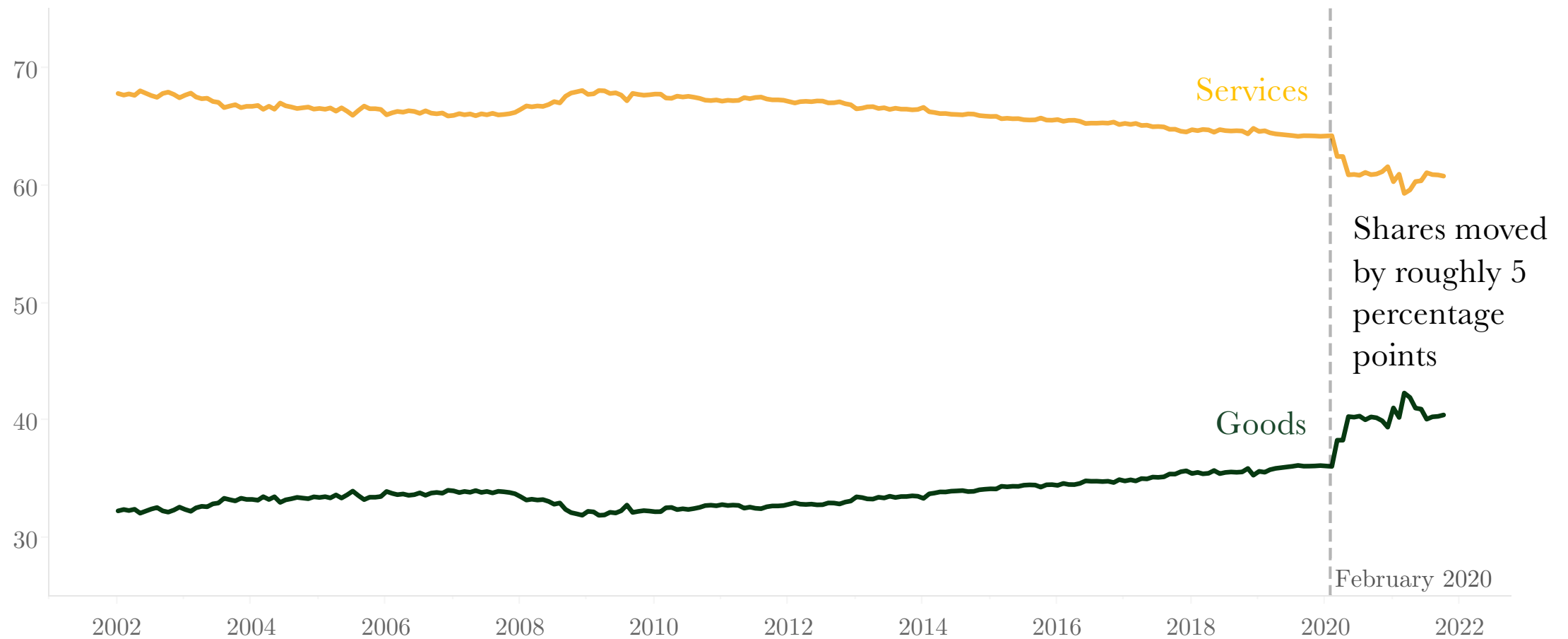
Share of Real Personal Consumption Expenditures

Goods vs. Services

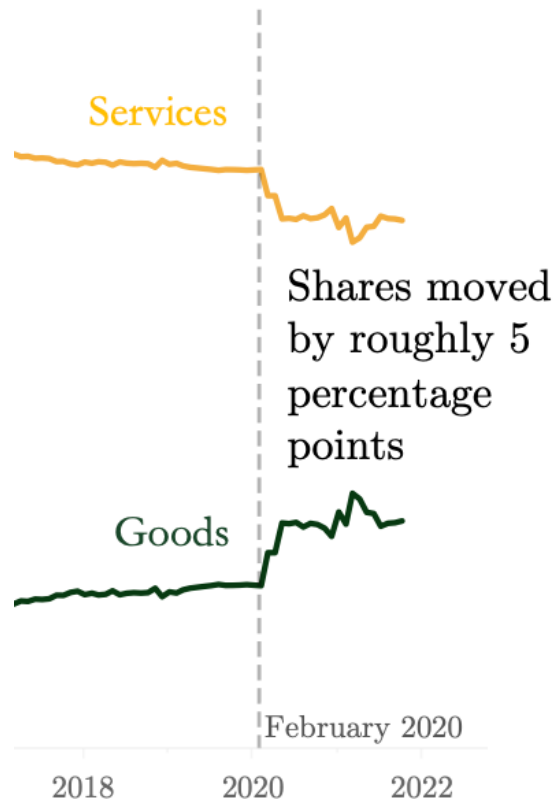


The pandemic shifted preferences away from services to goods

Share of Real Personal Consumption Expenditures
Goods vs. Services



This shift helped to kickstart supply chain challenges



Perspective

GDP 2019Q4 | Personal Consumption Expenditures

\$14.7 trillion

No. 4
Strategies
for
Storytelling

Searching for Stories

Make it Human

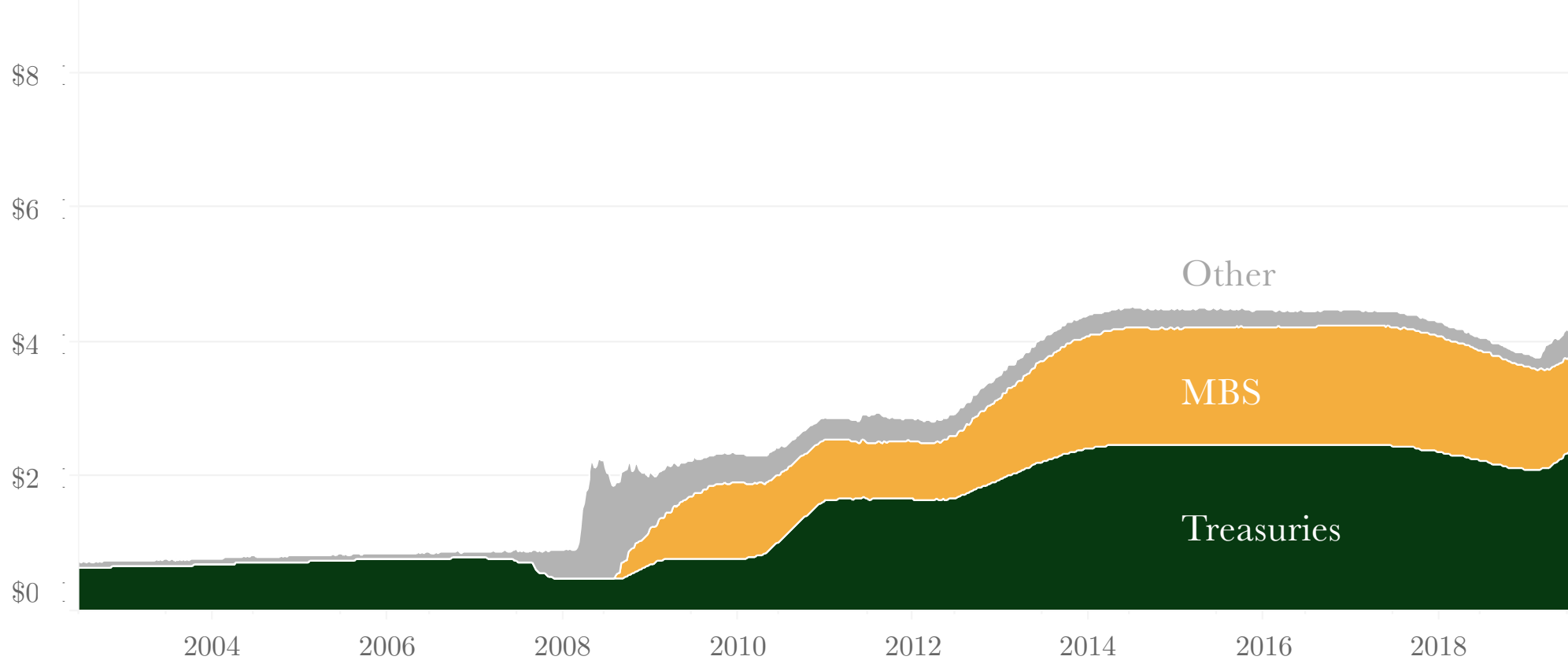
Scale + Perspective

Shock + Awe

Quantitative Easing has been a new policy tool of the Fed beginning in the Great Recession

Federal Reserve Balance Sheet | USD trillions

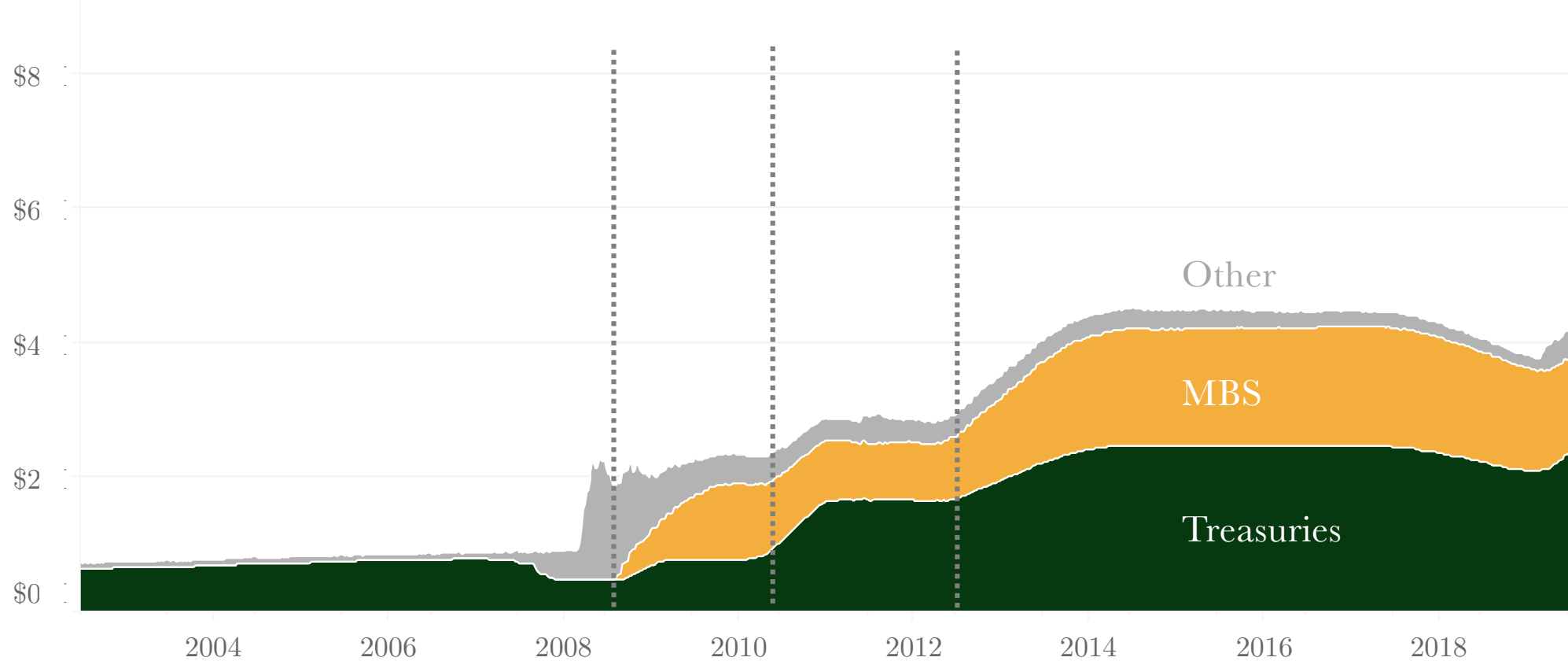
Assets



Source: Federal Reserve

The first rounds of QE are evident when looking at the Federal Reserve assets

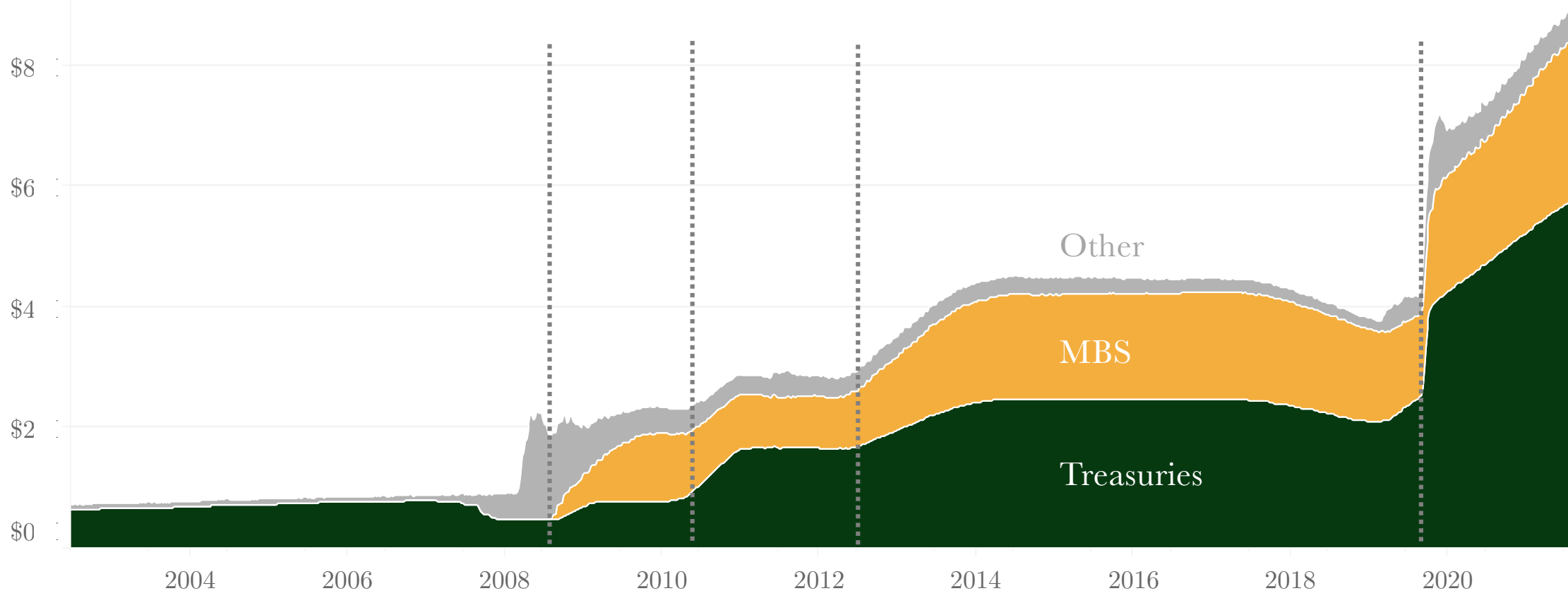
Federal Reserve Balance Sheet | USD trillions
Assets



The Fed pulled out the Great Recession playbook for their pandemic response with another round of QE

Federal Reserve Balance Sheet | USD trillions

Assets



Source: Federal Reserve

No. 4
Strategies
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Make it Human

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Overview

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No. 6 Takeaways

No. 5
Jack of
all Tools

“Jack of all trades, master of none

No. 5

Jack of
all Tools

“ Jack of all trades, master of none,
Oftentimes better than a master of one

No. 5
Jack of
all Tools

Leverage any and all tools at your disposal to
create visuals + stories

Visualize

Excel, Tableau, Power BI,
R, Python, etc



Tell the Story

Illustrator, Photoshop,
Powerpoint, etc.

No. 5
Jack of
all Tools

Leverage any and all tools at your disposal to
create visuals + stories

Visualize

Excel, Tableau, Power BI,
R, Python, etc

+

Tell the Story

Illustrator, Photoshop,
Powerpoint, etc.

Be Creative

Overview

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No. 6 Takeaways

No. 6 Takeaways

1 Presenting with storytelling techniques improves audience retention – use strategically

2 Explore your data for story arcs and patterns – use context + hide-n-reveal presentation techniques along with storytelling strategies: make the data human, provide scale, shock and awe

3 Leverage the power of multiple tools to tell your story

4 Data + Data Visualization Design | Impact
+ Storytelling

No. 6 Takeaways

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4 Data + Data Visualization Design + Storytelling | Impact

Case Study

Practice

* Using your assigned visual:

1. Redesign the visual as needed
2. Tell a two-three slide story of the visual for a presentation

Data Visualization

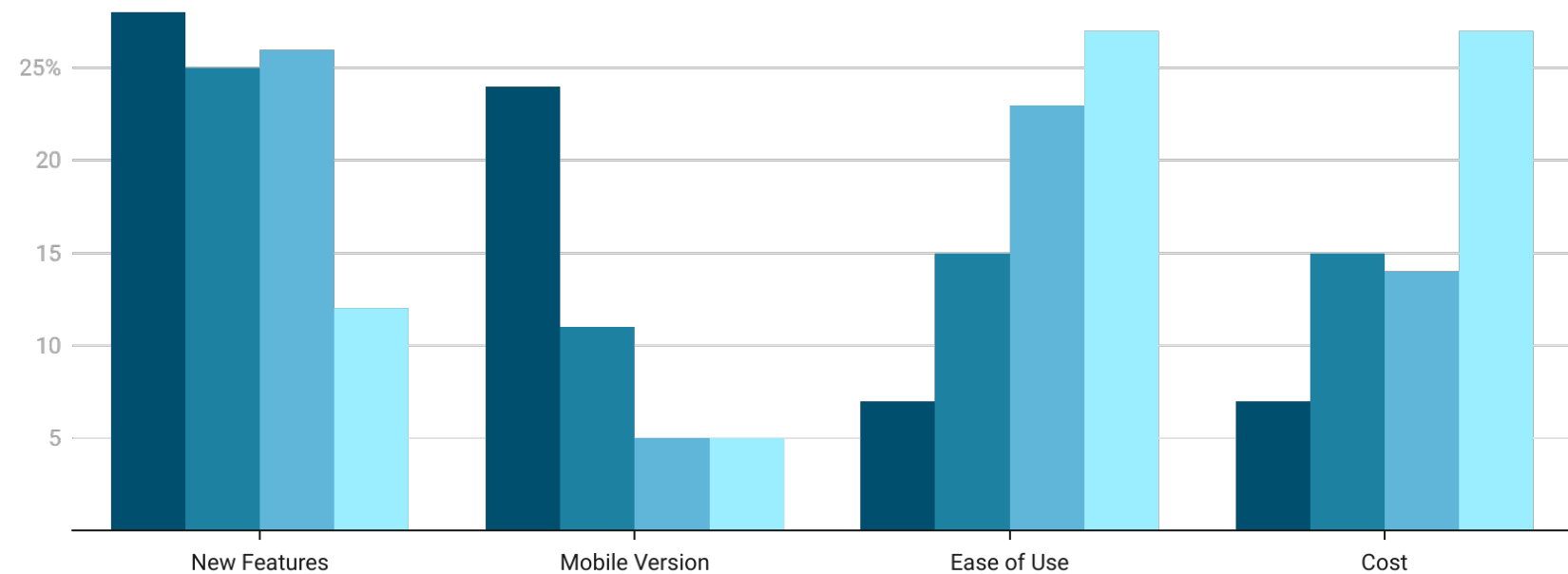
Design Principles | Exploration + Conception | Storytelling



What are the most important aspects of this product that make you want to buy it?

Percentage saying it's important

Under 35 35-54 55-64 65+



Crafting Impactful Data Stories:

Design Principles
Exploration + Conception
Storytelling



Agenda

Data Visualization Design Principles

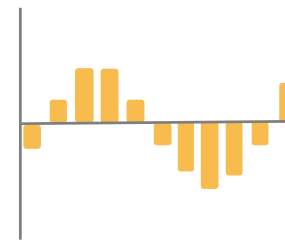
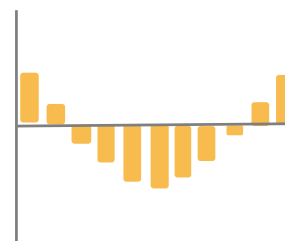
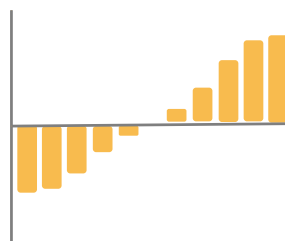
Chart Types + EDA

Break

Storytelling

Takeaways

So...what just
happened?



No. 1

Data Visualization Design Process

1 Think

What's the main idea of this visual?

Who is the audience?

What is the medium of distribution?

Is this visual exploratory or declarative?

2 Sketch

Explore chart type possibilities

State the goal + signal words

Be creative

Sketch

3 Create

Digital prototype

Leverage tools

Structure

Simplicity

4 Articulate

Main idea | 5 second rule

Refine for impact:

- Preattentive attributes
- Highlight + Annotate + Frame

No. 2

Storytelling Presenting for Impact

Stories + Data + Strategy

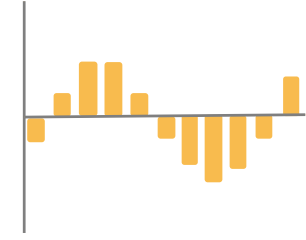
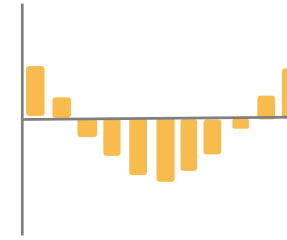
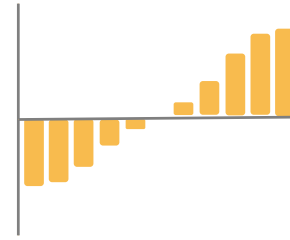
- 1 Explore Data for Arcs
- 2 Context Storytelling
- 3 Hide-n-Reveal Storytelling

Searching for Stories

- 1 Make it Human
- 2 Scale + Perspective
- 3 Shock + Awe

Crafting Impactful Data Stories

Design Principles | Exploration + Conception | Storytelling



No. 1 Data Visualization Design Process

1

Think

Main idea
Audience
Medium
Purpose

2

Sketch

Explore chart types
State the goal +
signal words
Be creative
Sketch

3

Create

Digital prototype
Leverage tools
Structure
Simplicity

4

Articulate

Refine for impact:
Preattentive attributes
Highlight + Annotate
+ Frame
Five-second rule

No. 2 Storytelling Presenting for Impact

1

Stories + Strategy

Explore for arcs
Context
Hide-n-Reveal

2

Searching for Stories

Make it human
Scale + Perspective
Shock + awe