Today's Agenda

What drives economic investment in US states?

- Introduce Dataset 1
- Begin univariate analyses

Justin Leinaweaver (Spring 2022)



Scientific models are:

- Neither true nor false
- Limited in their accuracy
- Partial representations
- Useful for only some uses
- A reflection of the interests of the designer

Dataset 1: The Motivating Problem

What drives economic investment in US states?

Why do some states attract greater investment by companies and individuals than others?

Dataset 1: The Motivating Problem

What drives economic investment in US states?

- Literature Review
- Exploratory Data Analysis

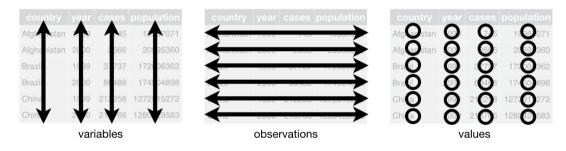
Dataset 1: Literature Review

What are the important causal mechanisms that explain business investment in states?

- A focus group of educated, engaged and dynamic undergraduates interested in business
- Girsch-Bock, Mary. (2021, Jan 19). Top 10 Best States to Start Your Small Business in 2021. *The Blueprint by The Motley Fool*.

	Α	В	С	D	E	F	G	Н
1	State	abbrev	year	min_wage	gdp_millions	unemployment	population_thousands	rental_vacancy_rate
2	Alabama	AL	2020		224870.6	6	4921.532	13.6
3	Alaska	AK	2020	10.19	50246.7	7.9	731.158	7
4	Arizona	AZ	2020	12	372461	7.9	7421.401	5.5
5	Arkansas	AR	2020	10	129073.9	6.1	3030.522	8.4
6	California	CA	2020	12	3091871.5	10.2	39368.078	4
7	Colorado	CO	2020	12	390098.7	7.3	5807.719	4
8	Connecticut	CT	2020	12	280900.3	7.9	3557.006	5.6
9	Delaware	DE	2020	9.25	75512.5	7.9	986.809	6.1
10	Florida	FL	2020	8.56	1095888.2	7.9	21733.312	7.3
11	Georgia	GA	2020	7.25	619240	6.6	10710.017	7.1
12	Hawaii	HI	2020	10.1	89856.2	11.8	1407.006	7.5
13	Idaho	ID	2020	7.25	84032.2	5.4	1826.913	4.4
14	Illinois	IL	2020	10	863516.7	9.6	12587.53	7.9
15	Indiana	IN	2020	7.25	372636.7	7.2	6754.953	9.3
16	Iowa	IA	2020	7.25	192710.2	5.3	3163.561	8.9
17	Kansas	KS	2020	7.25	173298.3	5.9	2913.805	12.1
18	Kentucky	KY	2020	7.25	210024.2	6.6	4477.251	6.1

"Three Rules of Tidy Data"



Source: Wickham (2018) R for Data Science. O'Reilly.

	Α	В	С	D	E	F	G	Н
1	State	abbrev	year	min_wage	gdp_millions	unemployment	population_thousands	rental_vacancy_rate
2	Alabama	AL	2020		224870.6	6	4921.532	13.6
3	Alaska	AK	2020	10.19	50246.7	7.9	731.158	7
4	Arizona	AZ	2020	12	372461	7.9	7421.401	5.5
5	Arkansas	AR	2020	10	129073.9	6.1	3030.522	8.4
6	California	CA	2020	12	3091871.5	10.2	39368.078	4
7	Colorado	CO	2020	12	390098.7	7.3	5807.719	4
8	Connecticut	CT	2020	12	280900.3	7.9	3557.006	5.6
9	Delaware	DE	2020	9.25	75512.5	7.9	986.809	6.1
10	Florida	FL	2020	8.56	1095888.2	7.9	21733.312	7.3
11	Georgia	GA	2020	7.25	619240	6.6	10710.017	7.1
12	Hawaii	HI	2020	10.1	89856.2	11.8	1407.006	7.5
13	Idaho	ID	2020	7.25	84032.2	5.4	1826.913	4.4
14	Illinois	IL	2020	10	863516.7	9.6	12587.53	7.9
15	Indiana	IN	2020	7.25	372636.7	7.2	6754.953	9.3
16	Iowa	IA	2020	7.25	192710.2	5.3	3163.561	8.9
17	Kansas	KS	2020	7.25	173298.3	5.9	2913.805	12.1
18	Kentucky	KY	2020	7.25	210024.2	6.6	4477.251	6.1

Dataset 1: The Motivating Problem

What drives economic investment in US states?

Why do some states attract greater investment by companies and individuals than others?

	Α	В	С	D		Е	F
1	State	abbrev	year	gdp_millions	П	gdp_category	gdp_rate
2	Alabama	AL	2020	224870.6	П	Under \$1 trillion	-0.0143
3	Alaska	AK	2020	50246.7		Under \$100 billion	-0.0761
4	Arizona	AZ	2020	372461		Under \$1 trillion	0.0063
5	Arkansas	AR	2020	129073.9		Under \$1 trillion	-0.0144
6	California	CA	2020	3091871.5		Above \$1 trillion	-0.0131
7	Colorado	CO	2020	390098.7		Under \$1 trillion	-0.0073
8	Connecticut	CT	2020	280900.3		Under \$1 trillion	-0.0240
9	Delaware	DE	2020	75512.5		Under \$100 billion	-0.0204
10	Florida	FL	2020	1095888.2		Above \$1 trillion	-0.0096
11	Georgia	GA	2020	619240		Under \$1 trillion	-0.0103
12	Hawaii	HI	2020	89856.2		Under \$100 billion	-0.0615
13	Idaho	ID	2020	84032.2		Under \$100 billion	0.0044
14	Illinois	IL	2020	863516.7		Under \$1 trillion	-0.0249
15	Indiana	IN	2020	372636.7		Under \$1 trillion	-0.0186
16	Iowa	IA	2020	192710.2		Under \$1 trillion	-0.0100
17	Kansas	KS	2020	173298.3		Under \$1 trillion	-0.0181

	Α	В	С	D	E	F	G	Н
1	State	abbrev	year	min_wage	gdp_millions	unemployment	population_thousands	rental_vacancy_rate
2	Alabama	AL	2020		224870.6	6	4921.532	13.6
3	Alaska	AK	2020	10.19	50246.7	7.9	731.158	7
4	Arizona	AZ	2020	12	372461	7.9	7421.401	5.5
5	Arkansas	AR	2020	10	129073.9	6.1	3030.522	8.4
6	California	CA	2020	12	3091871.5	10.2	39368.078	4
7	Colorado	CO	2020	12	390098.7	7.3	5807.719	4
8	Connecticut	CT	2020	12	280900.3	7.9	3557.006	5.6
9	Delaware	DE	2020	9.25	75512.5	7.9	986.809	6.1
10	Florida	FL	2020	8.56	1095888.2	7.9	21733.312	7.3
11	Georgia	GA	2020	7.25	619240	6.6	10710.017	7.1
12	Hawaii	HI	2020	10.1	89856.2	11.8	1407.006	7.5
13	Idaho	ID	2020	7.25	84032.2	5.4	1826.913	4.4
14	Illinois	IL	2020	10	863516.7	9.6	12587.53	7.9
15	Indiana	IN	2020	7.25	372636.7	7.2	6754.953	9.3
16	Iowa	IA	2020	7.25	192710.2	5.3	3163.561	8.9
17	Kansas	KS	2020	7.25	173298.3	5.9	2913.805	12.1
18	Kentucky	KY	2020	7.25	210024.2	6.6	4477.251	6.1

```
[1] 237 222 186 115 200 232 164 131 125 145 217 165 164 181 175 233 243 233 138 146 147 211 133
[24] 185 164 127 193 189 178 249 181 231 162 108 186 243 193 106 124 105 114 237 111 163 196 174
[47] 182 240 244 166 164 190 236 204 122 121 135 190 244 210 201 246 121 127 229 154 109 113 169
[70] 241 191 121 171 105 205 159 192 209 167 166 169 219 146 218 104 220 137 132 218 160 229 208
[93] 156 244 160 112 129 136 135 234 214 176 137 228 159 245 170 215 195 118 110 228 133 123 159
[116] 235 166 221 224 141 123 200 209 142 235 212 246 153 217 118 232 104 111 213 229 149 243 139
[139] 186 159 150 127 110 191 108 248 184 244 145 190 122 222 153 180 242 122 135 142 228 149 131
[162] 176 229 108 223 119 132 197 242 154 201 103 149 197 106 111 185 163 120 218 166 245 132 123
[185] 205 181 211 138 231 233 158 100 209 231 159 242 225 233 168 206 136 154 221 110 113 126 152
[208] 117 102 240 218 120 124 133 150 222 210 146 213 142 193 174 197 178 154 132 183 145 156 104
[231] 150 172 147 200 128 231 139 240 213 125 183 158 169 180 196 127 210 240 123 141 203 128 203
[254] 218 110 176 114 139 144 183 192 154 116 225 103 156 222 157 113 105 229 110 115 149 249 105
[277] 224 188 143 118 108 137 224 204 135 178 174 153 122 126 206 154 105 178 192 152 241 250 212
[300] 173 187 193 144 211 208 223 136 139 105 166 182 137 137 195 240 187 211 150 104 216 119 183
[323] 246 199 142 171 189 160 180 165 191 139 126 182 100 240 205 111 115 235 116 209 159 125 245
[346] 182 145 159 186 177 241 182 178 138 247 226 181 180 225 145 233 200 175 244 153 127 174 133
[369] 200 231 172 177 108 240 220 230 188 153 249 164 217 240 154 227 167 149 234 241 101 164 243
[392] 246 230 140 187 135 114 131 118 165 153 191 167 190 205 162 228 210 135 203 125 105 245 223
[415] 106 126 155 244 147 171 153 169 180 103 104 135 119 162 155 174 139 222 122 162 126 148 230
[438] 190 170 158 113 172 114 200 110 152 188 218 241 156 131 133 115 186 237 134 123 180 195 205
[461] 147 190 101 214 162 204 140 148 141 153 156 176 139 225 111 128 200 248 117 191 182 119 192
[484] 134 165 164 109 178 133 187 146 204 169 207 146 140 141 194 163 225 149 113 203 217 150 244
[507] 170 238 143 122 186 234 190 106 224 160 125 177 143 141 175 233 171 115 110 117 144 125 226
```

```
[1] 237 222 186 115 200 232 164 131 125 145 217
[12] 165 164 181 175 233 243 233 138 146 147 211
 [23] 133 185 164 127 193 189 178 249 181 231 162
 [34] 108 186 243 193 106 124 105 114 237 111 163
[45] 196 174 182 240 244 166 164 190 236 204 122
 [56] 121 135 190 244 210 201 246 121 127 229 154
[67] 109 113 169 241 191 121 171 105 205 159 192
[78] 209 167 166 169 219 146 218 104 220 137 132
[89] 218 160 229 208 156 244 160 112 129 136 135
[100] 234 214 176 137 228 159 245 170 215 195 118
[111] 110 228 133 123 159 235 166 221 224 141 123
[122] 200 209 142 235 212 246 153 217 118 232 104
[133] 111 213 229 149 243 139 186 159 150 127 110
[144] 191 108 248 184 244 145 190 122 222 153 180
[155] 242 122 135 142 228 149 131 176 229 108 223
[166] 119 132 197 242 154 201 103 149 197 106 111
[177] 185 163 120 218 166 245 132 123 205 181 211
[188] 138 231 233 158 100 209 231 159 242 225 233
[199] 168 206 136 154 221 110 113 126 152 117 102
[210] 240 218 120 124 133 150 222 210 146 213 142
[221] 193 174 197 178 154 132 183 145 156 104 150
[232] 172 147 200 128 231 139 240 213 125 183 158
[243] 169 180 196 127 210 240 123 141 203 128 203
[254] 218 110 176 114 139 144 183 192 154 116 225
```

• The middle?

• The range?

• The variation?

Defining Statistics: Level 1

Statistics is a set of tools we use to summarize data

Summarize: "give a brief statement of the main points of (something)" (Oxford Dictionary).

Defining Statistics: Level 2

"The practice or science of collecting and analyzing numerical data in large quantities, **especially for** the purpose of inferring proportions in a whole from those in a representative sample" (Oxford Dictionary).

Descriptive Statistics (Johnson 2012)

Measures of Central Tendency

- Mean
- Median

Deviations from Central Tendency

Standard deviation

Measures of Variability

- Range
- IQR

Descriptive Statistics (Johnson 2012)

Measures of Central Tendency

- Mean
- Median

Deviations from Central Tendency

Standard deviation

Measures of Variability

- Range = Maximum Minimum
- IQR = 75th 25th percentile

Descriptive Statistics in Excel: Using Functions

F3 * : × ✓ f _x			=AVERAGE(C2:C51	L)					
4	Α	В	С	D	E	F			
1	state	year	gdp_millions						
2	Alabama	2018	221735.5		Mean				
3	Alaska	2018	54734.1		GDP (millions)	406455.9			
4	Arizona	2018	348297.1						
5	Arkansas	2018	128418.9						
6	California	2018	2997732.8						
7	Colorado	2018	371749.6						
8	Connecticut	2018	275726.9						
9	Delaware	2018	73481.3						

Descriptive Statistics in Excel: Using Functions

D2	* : X	=C2/1000					
4	Α	В	С	D	Е	F	G
1	state	year	gdp_millions	gdp_billions			
2	Alabama	2018	221735.5	221.7355		Mean	
3	Alaska	2018	54734.1	54.7341		GDP (millions)	406455.9
4	Arizona	2018	348297.1	348.2971		GDP (billions)	406.4559
5	Arkansas	2018	128418.9	128.4189			
6	California	2018	2997732.8	2997.7328			
7	Colorado	2018	371749.6	371.7496			
8	Connecticut	2018	275726.9	275.7269			
9	Delaware	2018	73481.3	73.4813			

For Thursday

Variables

- Minimum wage
- Unemployment
- Population
- Homeowner Rate
- Manufacturing

Descriptive Statistics

- Mean
- Median
- Standard deviation
- Minimum
- Maximum
- 25th Percentile
- 75th Percentile

For Thursday

Predictors to Analyze (5): Min wage, unemployment, population, homeowner rate and manufacturing

```
\begin{array}{lll} \text{Mean} & = \text{AVERAGE} \\ \text{Median} & = \text{MEDIAN} \\ \text{Standard deviation} & = \text{STDEV.S} \\ \text{Minimum} & = \text{MIN} \\ \text{Maximum} & = \text{MAX} \\ 25\text{th Percentile} & = \text{QUARTILE.EXC (quart} = 1) \\ 75\text{th Percentile} & = \text{QUARTILE.EXC (quart} = 3) \\ \end{array}
```