# Gov 50: 7. Measurement: Visualizing Distributions

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#### 1. Today's agenda

- 2. Visualizing data
- 3. Anchoring vignettes

1/ Today's agenda

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# 2/ Visualizing data

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#### • Load the data:

vignettes <- read.csv("data/vignettes.csv")
head(vignettes)</pre>

##		self	alison	jane	moses	china	age
##	1	1	5	5	2	Θ	31
##	2	1	1	5	5	Θ	54
##	3	2	3	1	1	Θ	50
##	4	2	4	2	1	Θ	22
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шш								
##					_			
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##	0.4187	0.2689	0.1665	0.0717	0.0743			



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  - xlab, ylab are axis labels

## Barplot



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- main sets the title for the figure.



#### **Distribution of Respondent's Age**

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```
hist(vignettes$age, freq = FALSE,
breaks = c(0, 18, 25, 45, 65, 100),
xlab = "Age",
main = "Distribution of Respondent's Age")
```

# Creating our own bins



#### **Distribution of Respondent's Age**

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  - Points beyond whiskers are outliers.

# **Boxplot**



**Distribution of Age** 

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**Distribution of Age** 

• Useful for comparing a variable across groups:

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  - When using a formula, we need to add a data argument.



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3/ Anchoring vignettes

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- Problem? Different people interpret questions differently
  - Cross-cultural differences, vague questions.

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- How much say does Alison have in getting the government to address issues that interest her?
  - Use the same scale as self-assessment.

Jane lacks clean drinking water because the government is pursuing an industrial development plan. In the campaign for an upcoming election, an opposition party has promised to address the issue, but she feels it would be futile to vote for the opposition since the government is certain to win.

• How much say does Jane have in getting the government to address issues that interest her?

• How much say does Moses have in getting the government to address issues that interest him?

- How much say does Moses have in getting the government to address issues that interest him?
- "Objective" ranking: Alison > Jane > Moses.

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### Self-reported efficacy

```
china <- vignettes[vignettes$china == 1,]
mexico <- vignettes[vignettes$china == 0,]</pre>
```

```
barplot(prop.table(table(mexico$self)),
    names = c("None", "A little",
                      "Some", "A lot", "Unlimited"),
    xlab = "Self-reported political efficacy",
    ylab = "Proportion of Respodents",
    main = "Mexico")
```



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hist(china\$age, freq = FALSE, xlab = "Age", main = "China")
abline(v=median(china\$age), col = "dodgerblue", lwd = 2)

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mean(mexico\$self < mexico\$moses)</pre>

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mean(mexico\$self < mexico\$moses)</pre>

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```
    Creating the adjusted scores:
```

```
china.sane$self.adj <- 1 +
  (china.sane$self >= china.sane$moses) +
  (china.sane$self >= china.sane$jane) +
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```

R converts TRUE to 1 and FALSE to 0 when adding.







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  - Get started early!