Data/R

Data Visualization

distribution of numerical columns geom hist and geom density number of occurences in a categorical col geom bar shape & distribution of numerical vars geom boxplot

geom_scatter + geom_line* numerical vs. numerical geom bar bar plot for count of categorical vars

horizontal line geom_hline(yintercept)

geom_vline(xintercept) vertical line

geom_abline(slope, intercept) linear function, requires

geom_segment straight line between (x, y) and (xend, yend) geom_smooth plots a line/curve of best fit

*geom_line only makes sense with an ordering (e.g. the x-axis is year and observations connect together)

Data Manipulation

arrange(asc(col)) arranges col by ascending order arrange(desc(col)) arranges col by descending order

relocate(data, col, .before, .after) relocates a column relative to its neighbors* arrange(desc(col)) arranges col by descending order

slice(data, pos) indexes rows

bind_rows(df1, df2, ...) dfs w/ same columns, concats rows

bind_cols(df1, df2, ...) dfs w/ same # rows, concats cols, renames repeated cols

semi_join(x, y, by) returns rows from x w/ matching val for by in y

anti_join(x, y, by) returns rows from x w/o a match in y

full_join(x, y, by) standard outer join

left_join(x, y, by) standard left join, x is the left df

right_join(x, y, by) standard right join, y is the right df

*specifying no neighbors moves col to leftmost col, specifyfing both is error Suppose we have the following table fish_encounters

fish	station	seen
4842	Release	1
4842	I80_1	1
4842	Lisbon	1
4842	Rstr	1
4842	Base_TD	1
4842	BCE	1
4842	BCW	1
4842	BCE2	1
4842	BCW2	1
4842	MAE	1
1915	DCE	

pivot_wider(fish_encounters, names_from = station, values_from = seen, values fill = 0)

Fish	Release	180_1	Lisbon	Rstr	Base_TD	BCE	BCW	BCE2	BCW2	MAE
1	4842	1	1	1	1	1	1	1	1	1
2	4843	1	1	1	1	1	1	1	1	1
3	4844	1	1	1	1	1	1	1	1	1
4	4845	1	1	1	1	0	0	0	0	0

Suppose we have the following table billboard

artist		date.entered							
		2000-02-26							
2Ge+her	The	2000-09-02	91	87	92	NΑ	NA	NA	NA
3 Doors D	Kryp	2000-04-08	81	70	68	67	66	57	54
3 Doors D	Loser	2000-10-21	76	76	72	69	67	65	55
E04 D	337_ L L	2000 04 15	E 77	9.4	25	17	177	91	20

pivot_longer(billboard, cols = starts_with("wk"), names_to = "week" names_prefix = "wk", values_to = "rank", values_drop_na = TRUE)

	artist	track	date.entered	week	rank
	2 Pac	Baby Don't Cry (Keep	2000-02-26	1	87
	2 Pac	Baby Don't Cry (Keep	2000-02-26	2	82
	2 Pac	Baby Don't Cry (Keep	2000-02-26	3	72
	2 Pac	Baby Don't Cry (Keep	2000-02-26	4	77
	2 Pac	Baby Don't Cry (Keep	2000-02-26	5	87
	2 Pac	Baby Don't Cry (Keep	2000-02-26	6	94
	2 Pac	Baby Don't Cry (Keep	2000-02-26	7	99
- 1	2Ge+her	The Hardest Part Of	2000-09-02	1	91
- 1	2Ge+her	The Hardest Part Of	2000-09-02	2	87
- 1	2Ge+her	The Hardest Part Of	2000-09-02	3	92

Dates & Strings

ymd(), dmy(), ... converts string to datetime according to order of y-m-d wdate(date) gets the day of the week for a given date strc(str1, str2, ...) concatenates strings/vectors of strings str_detect(str, pattern) TRUE if \(\extrm{∃} \) a substring of str that matches pattern

str_extract(str, pat, group) finds 1st match in str for pat, group takes matched pattern, returns text matching group

str_extract_all(string, pattern) returns all matches to pattern str_sub(string, start, end) indexes into string

str_count(string, pattern) count # of matches to pattern in string

str_replace(string, pattern, replacement), str_replace_all(string, pattern, replacement) - these exist

putting color, fill, alpha, etc. outside of aes(), i.e. typically inside of geom_x() functions will set it as a constant for the whole graph putting color, fill, alpha, etc. inside of aes() typically implies you have a column in your df (like year) that sets the groups appropriately every geom_x() function inherits the aes() from ggplot, unless they have their

own aes() which overrides the ggplot R always prints dates as YYYY-MM-DD

Regex

digits ۱s whitespace alphabetic and numeral \w matches the start of each line matches the end of each line 1 or more 0 or more {n} exactly n {n, } n or more {n, m} between n and m

Capitalizing any of the above is the complement

You can also create your own character classes using []:

[abc] matches a, b, or c

matches every character between a and z [a-z] matches anything except a, b, or c [^abc]

Parenthesis make groups which can be backreferenced

pattern <- "(..)\\1" #(..) is some pair of anything, and

takes that same pair

fruit %>% str_subset(pattern)

banana" "coconut" "cucumber" "jujube" "papaya" "salal berry"

Basic Probability

Probability Theory

For some random variable X, $E(X) = \sum_{x=0}^{n} x*P(X=x)$. The expected value is just the sum of each outcome multiplied by its porbability.

 $Var(X) = E((X - \mu)^2), \ \mu = E(X)$

Again, this is just multiplying the squared difference of the mean from each observation with each observation's respective probability,

 $sum((x - mu)^2 * p).$

Suppose that the distribution of X is proportional with the function g(x) = 6 - |x - 5|. Say that we have outcomes $1, 2, \dots, 10$, this means

P(X = x) = a(6 - |x - 5|).

We know that the total number of outcomes and number of current outcomes must be proportional to the function.

The way to make the number of outcomes proportional is to find $\sum_{i=1}^{10} 6 - |i-5|$.

To keep the possible values proportional, each probability is $\frac{j}{\sum_{i=1}^{10} 6 - |i-5|}$ $j \in g(1), g(2), \cdots, g(10).$

Binomial Distributions

Properties of Binomials binary outcomes independence fixed sample size

same probability Binomial Formulas

binomial Formulas
$$\mu = np \qquad \sigma^2 = np(1-p)$$
binom prob $P(X=k) = \binom{n}{k} p^k (1-p)^{n-k}$

R Binomial Functions

rbinom(n, size, prob) random binomial samples

dbinom(x, size, prob) density fcn at x

qbinom(p, size, prob) get the smallest value in the qth quantile

pbinom(q, size, prob) P(X <= q)

pbinom(q, size, prob, lower.tail = T) $1 - P(X \le q) = p(X > q)$

Note that $\binom{n}{k} = \frac{n!}{k!(n-k)!}$

Normal Distributions

R Normal Functions*

pnorm(q, size, prob) P(X < q)At any given $x, X \sim N(\mu, \sigma), P(X = x) = 0.$

The standard normal is $X \sim N(0, 1)$.

Any normal has its z-scores as equivalent observations in the standard normal. In other words, $X \sim N(\mu, \sigma) \implies Z = \frac{X - \mu}{\sigma} \sim N(0, 1)$.

*includes rnorm(), qnorm() which have same functionality as the binom fcns Suppose that $\exists X \sim Binom(n, p)$, with $np(1 - p) \geq 10$

Note the conditions this tests, p can't be too close to 0 or 1 (causes skew), and n must be sufficiently large (reduces variance).

We can approximate that binomial with $X \sim N(np, \sqrt{np(1-p)})$ Recall that this appoximation isn't perfect, the normal has an effect of

'cutting off" the binomial distribution. Correct for this with $P(X \le x + .5)$ wheing finding $P(X \le x)$,

 $P(X \ge x - .5)$ when finding $P(X \ge x)$

As a general rule,

65% of data 1 SD from the mean 95% of data 2 SD from the mean

99% of data 3 SD from the mean

Inference

Inference on Proportions

Formulas (\hat{P}^* is a random estimator for point estimate \hat{p}):

$$\begin{array}{ll} Var(\hat{P}) & Var(\frac{X}{n}) = \frac{Var(X)}{n} \\ SE(\hat{p}) & \sqrt{Var(\hat{P})} \\ \text{CI} & \hat{p} \pm z * SE \\ z & qnorm(1-\frac{p}{2})^* \\ * \hat{P} \sim N(p, \sqrt{\frac{p(1-p)}{n}}), \text{ this is still random} \end{array}$$

*where p is the desired conf interval

Agresti-Coull Method (use \tilde{p} in place of \hat{p})

$$\begin{array}{ll} \tilde{p} & \frac{x+2}{n+4} \\ SE(\tilde{p}) & \sqrt{\frac{\tilde{p}(1-\tilde{p})}{n+4}} \\ CI & \tilde{p} \pm z * SE \\ z & qnorm(1-\frac{p}{2})^{*} \end{array}$$

*where p is the desired conf interval In theory this is a better estimate, still when SE is too small the CI can be

Using \tilde{p} moves the estimate closer to .5.

When \hat{p} is closer to 0 or 1 than p, SE tends to be underestimated, and vice versa for \hat{p} closer to .5 than p.

Hypothesis testing - determine if a result we found was due to random chance

- 1. Have a binomial model
- 2. State H_0 and H_A
- 3. Choose test statistic
- 4. Find p-value and see if it's under some α

Assume H_0 is true. Now find probability we observed a certain outcome. Suppose $H_0|X \sim Binom(n, k)$ and $H_0: k = .5$, $H_A: k \neq .5$. We observe j successes and n observations in total. Then p is 2*qnorm(j, n, .5), since the probability distribution is symmetric and \neq necessitates a 2-sided test. H_0 also assumes a binomial distribution w/ chance of success being .5.

$$\begin{array}{ll} \text{Differnce in Proportions} \\ \bar{p} & \frac{x_1+x_1}{n_1+n_2} \\ SE(\hat{p_1}-\hat{p_2}) & \sqrt{\frac{\bar{p}(1-\bar{p})}{n_1} + \frac{\bar{p}(1-\bar{p})}{n_2}} \\ \text{CI} & \bar{p} \pm z * SE \\ z & qnorm(1-\frac{p}{2})^* \end{array}$$

*where p is the desired conf interval

$$\begin{array}{lll} \text{Agresti-Coffe Method (use \tilde{p} in place of \hat{p})} \\ \bar{p} & \frac{x+1}{n+2} \\ SE(\tilde{p_1}-\tilde{p_2}) & \sqrt{Var(\tilde{p_1})+Var(\tilde{p_2})} \\ Var(\tilde{p_i}) & \frac{\tilde{p_i}*(1-\tilde{p_i})}{(n_i+2))} \\ \text{CI} & \bar{p} \pm z * SE \\ z & qnorm(1-\frac{p}{2})* \end{array}$$

Hypothesis Testing Difference in Proportions - determine if result was due to random chance

- 1. Have 2 binomial models
- 2. State H_0 and H_A
- 3. Choose test statistic
- 4. Find p-value and see if it's under some α

Say that $H_0: p_1-p_2=0$, $H_A: p_1\neq p_2$. Say that the number of success is i_1 and i_2 respectively. Since we test p_1-p_2 the differnces will be normally distributed.

Estimate the combined probability as $\bar{p} = \frac{i_1 + i_2}{n_1 + n_2}$

Again, assuming H_0 is true calculate z. $z = \frac{(\hat{p_1} - \hat{p_2}) - (p_1 - p_2)}{SE}$. THIS $p_1 - p_2$ IS THE $p_1 - p_2$ DEFINED BY H_0 . p is the area area under the standard normal, or 2 * P(X > z) in this case.

Inference on Means

$$\begin{array}{lll} \text{Formulas:} & & & & \\ \text{CI} & & & & & \\ & & & & & \\ & & & & & \\ & & & & \\ & & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & \\ & & & \\ & & & \\ & & \\ & & & \\ & &$$

* μ_0 is the value assumed to be μ under H_0 . Interpret this as the # of SEabove/below the mean of the null distribution.

The p value is the area under the t distribution, with n-1 degrees of freedom.

Inference on Multiple Means

Data can be paired or unpaired. Paired data is observations that are similar, and we are interested in differences between them.

For paired data:

Consider a new distribution of the differences in each pair of observations.

Hypothesis testing, confidence intervals, etc. are exectly the same as inference on a single mean, just on the difference between means this time. For unpaired data:

If the variance of the 2 distributions is similar, use the 2-sample:

$$SE(\bar{X} - \bar{Y}) \\ SE(\bar{X} - \bar{Y}) \\ Statistic \\ Degrees of freedom \\ Interval \\ Welch when variance different. \\ SE = \sqrt{\frac{\sum (x_i - \bar{x})^2 + \sum (y_i - \bar{y})^2}{n_x + n_y - 2}} \cdot \sqrt{\frac{1}{n_x} + \frac{1}{n_y}} \\ \frac{1}{n_x} + \frac{1}{n_y} - \frac{1}{n_x} + \frac{1}$$

$$SE(\bar{X} - \bar{Y}) \\ SE = \sqrt{\frac{s_x^2}{n_x} + \frac{s_y^2}{n_y}} \\ Statistic \\ t_{obs} = \frac{(\bar{X} - \bar{Y}) - (\mu_X 0 - \mu_Y 0)}{(s_x^2 / n_x + s_y^2 / n_y)^2} \\ Degrees of freedom \\ DF = \frac{(s_x^2 / n_x)^2 / (n_x - 1) + (s_y^2 / n_y)^2}{(s_x^2 / n_x)^2 / (n_x - 1) + (s_y^2 / n_y)^2 / (n_y - 1)} \\ Interval \\ Interval \\ (\bar{X} - \bar{Y}) \pm t_{Crit} * SE$$

 $\mu_{X0} - \mu_{Y0}$ is the difference in means assumed under H_0 . p process is same as before, find area under t distribution according to H_0 .

T Distributions

Recall the T statistic for inference on means.

 $T = \frac{\bar{X} - \mu_0}{s / \sqrt{n}}$, notice that we use s, a point estimate for σ . This introduces s/\sqrt{n} randomness, so T is not quite normally distributed, so we use t distribution. The standard deviation is $\frac{d}{d-2}$, d>2 where d is degrees of freedom. If $d \in \mathbb{Z}$, round it down. In practice, the t distribution converges to the normal as d increases. Still, it resembles a stretched normal.

Regression

Font face

Command	Declaration	Effect
\textrm{text}	{\rmfamily text}	Roman family
$\text{textsf}\{text\}$	{\sffamily text}	Sans serif family
$\text{texttt}\{text\}$	{\ttfamily text}	Typewriter family
$\text{textmd}\{text\}$	${\mbox{\mbox{$\backslash$}}}$	Medium series
$\text{textbf}\{text\}$	{\bfseries text}	Bold series
\textup{text}	{\upshape text}	Upright shape
$\text{textit}\{text\}$	{\itshape text}	Italic shape
$\text{textsl}\{text\}$	$\{\slshape\ text\}$	Slanted shape
$\text{textsc}\{text\}$	{\scshape text}	Small Caps shape
$\ensuremath{\mbox{emph}\{text\}}$	$\{\ensuremath{\mbox{em}\ text}\}$	Emphasized
\textnormal{text}	{\normalfont text}	Document font
$\verb \underline {} text $		Underline

The command (tttt) form handles spacing better than the declaration (tttt) form.

Font size

ront size			-
\tiny	tiny	\Large	Large
\scriptsize	scriptsize	\I ARCE	LARGE
\footnotesize	footnotesize		1
\small	small	\huge	huge
\normalsize	normalsize		Huge
\large	large	\Huge	rruge

These are declarations and should be used in the form {\small ...}, or without braces to affect the entire document.

Verbatim text

\begin{verbatim} Verbatim environment.

\begin{verbatim*} Spaces are shown as ⊔.

Text between the delimiting characters (in this case '!') is verbatim.

Environment	Declaration
\begin{center}	\centering
\begin{flushleft}	\raggedright
\begin{flushright}	\raggedleft

Miscellaneous

 $\limsup x d\{x\}$ changes the line spacing by the multiplier x.

Text-mode symbols

Symbols

& \&	_ _	\1	dots •	\textbullet
\$ \\$	^ \^{}	\t	extbar \	\textbackslash
% \%	~ \~{}	# \#	§.	\S
Accent	s			
ò \'o	ó \'o	ô \^o	õ \~o	ō \=o
ό \.ο	ö \"o	9 \c o	ŏ \v o	ő \H o
ç \c c	o /d o	o √b o	ο̂ο \t οο	œ \oe
Œ \0E	æ \ae	Æ \AE	å \aa	Å \AA
ø \o	Ø \0	ł \1	Ł \L	1 \i
j ∖j	i ~'	٤ ?'		
Delimit	ters			
	'' { \{]]	(< \tex	tless
, , ,,	·· }\}]])) > \tex	tgreater

Dashes

Name	Source	Example	Usage
hyphen	-	X-ray	In words.
en-dash		1-5	Between numbers.
em-dash		Yes—or no?	Punctuation.

Line and page breaks

\\	Begin new line without new paragraph.
*	Prohibit pagebreak after linebreak.
\kill	Don't print current line.

\pagebreak Start new page.

\noindent Do not indent current line.

Miscellaneous

\today	May 1, 2024.
\$\sim\$	Prints ∼ instead of \~{}, which makes ~.
~	Space, disallow linebreak (W.J.~Clinton).

\@. Indicate that the . ends a sentence when following an uppercase let-

\hspace{l} Horizontal space of length l (Ex: l = 20pt).

\vspace{l} Vertical space of length l. $\left(w\right)_{h}$ Line of width w and height h.

Tabular environments

tabbing environment

\≡ Set tab stop. \> Go to tab stop.

Tab stops can be set on "invisible" lines with \kill at the end of the line. Normally \\ is used to separate lines.

tabular environment

\begin{array}[pos]{cols} \begin{tabular}[pos]{cols} \begin{tabular*}{width}[pos]{cols}

tabular column specification

1	Left-justified column.
С	Centered column.
r	Right-justified column.
$p\{width\}$	Same as \parbox[t]{width}.
@{decl}	Insert decl instead of inter-column space.
1	Inserts a vertical line between columns.

tabular elements

Horizontal line between rows.

 $\cline{x-y}$ Horizontal line across columns x through y $\mathbb{n}_{cols}{text}$

A cell that spans n columns, with cols column specification.

Math mode

For inline math, use (...) or \$...\$. For displayed math, use [...] or \begin{equation}.

$\sup_{\underline{x}} \operatorname{Superscript}^x$	^{x} \frac{x}{y}	Subscript _x $\sum_{k=1}^{n}$	_{x} \sum_{k=1}^n
$\sqrt[y]{x}$	\sqrt[n]{x}	$\prod_{k=1}^{\kappa=1}$	\prod_{k=1}^n

Math-mode symbols

\leq	\leq	≥ \geq	$\neq \neq$	\approx	\approx
×	\times	→ \div	± \pm		\cdot
0	^{\circ}	o \circ	/ \prime		\cdots
∞	\infty	¬ \neg	∧ \wedge	\vee	\vee
\supset	\supset	∀ \forall	$\in \$ in	\rightarrow	\rightarrow
\subset	\subset	∃ \exists	∉ \notin	\Rightarrow	\Rightarrow
\cup	\cup	∩ \cap	\mid	\Leftrightarrow	\Leftrightarrow
\dot{a}	\dot a	\hat{a} \hat a	$ar{a}$ \bar a	\tilde{a}	\tilde a
α	\alpha	β \beta	γ \gamma	δ	\delta
ϵ	\epsilon	ζ \zeta	η \eta	ε	\varepsilon
θ	\theta	ι \iota	κ \kappa	θ	\vartheta
λ	\lambda	$\mu \setminus mu$	ν \nu	ξ	\xi
π	\pi	ρ \rho	σ \sigma	τ	\tau
v	\upsilon	$\phi \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \$	χ \chi	ψ	\psi
ω	\omega	Γ \Gamma	Δ \Delta	Θ	\Theta
Λ	\Lambda	Ξ \Xi	Π \Pi	Σ	\Sigma
Υ	\Upsilon	Φ \Phi	Ψ \Psi	Ω	\Omega

Bibliography and citations

When using BibTEX, you need to run latex, bibtex, and latex twice more to resolve dependencies

Citation types

```
\cite{key}
               Full author list and year. (Watson and Crick 1953)
\citeA\{key\}
               Full author list. (Watson and Crick)
\citeN{key}
               Full author list and year. Watson and Crick (1953)
\shortcite{key} Abbreviated author list and year. ?
\shortciteA{key} Abbreviated author list. ?
\shortciteN{key} Abbreviated author list and year. ?
\citevear{keu} Cite year only, (1953)
All the above have an NP variant without parentheses; Ex. \citeNP.
```

```
BibTeX entry types
```

Book with publisher. @book Book without publisher. @booklet @conference Article in conference proceedings. A part of a book and/or range of pages. A part of book with its own title. @incollection

Journal or magazine article.

If nothing else fits. @misc Ophdthesis PhD. thesis.

Proceedings of a conference. Oproceedings

Tech report, usually numbered in series. Unpublished. @techreport Qunpublished

BibTeX fields

@article

address Address of publisher. Not necessary for major publishers. author Names of authors, of format ... Title of book when part of it is cited. booktitle Chapter or section number. chapter Edition of a book. edition editor Names of editors. Sponsoring institution of tech. report. institution

iournal Journal name. Used for cross ref. when no author.

month Month published. Use 3-letter abbreviation. note Any additional information.

number Number of journal or magazine. organization Organization that sponsors a conference.

pages Page range (2,6,9--12). Publisher's name. publisher

school Name of school (for thesis). Name of series of books. series Title of work. title

type Type of tech. report, ex. "Research Note".

volume Volume of a journal or book. Year of publication.

Not all fields need to be filled. See example below.

Common BibTeX style files

```
abbrv Standard
                    abstract alpha with abstract
alpha
     Standard
                    apa
                           Unsorted
plain Standard
                    unsrt
```

The IATEX document should have the following two lines just before \end{document}, where bibfile.bib is the name of the BETEX file.

\bibliographystyle{plain} \bibliography{bibfile}

BibT_EX example

The BibTeX database goes in a file called file.bib, which is processed with bibtex file.

```
@String{N = {Na\-ture}}
@Article{WC:1953,
 author = {James Watson and Francis Crick},
 title = {A structure for Deoxyribose Nucleic Acid},
 journal = N,
  volume = {171},
 pages = {737},
 year
       = 1953
```

Sample LATEX document

\documentclass[11pt]{article} \usepackage{fullpage} \title{Template} \author{Name} \begin{document} \maketitle \section{section} \subsection*{subsection without number} text \textbf{bold text} text. Some math: \$2+2=5\$ \subsection{subsection}

discovered the structure of DNA.

A table: \begin{table}[!th] \begin{tabular}{|1|c|r|} first & row & data \\ second & row & data \\ \hline \end{tabular} \caption{This is the caption} \labelfex:table} \end{table}

text \emph{emphasized text} text. \cite{WC:1953}

The table is numbered \ref{ex:table}. \end{document}