hello ggplot2!

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thanks to ...

organizers of this Workshop on Big Data in Environmental Science

supporters Canadian Statistical Sciences Institute (CANSSI) Pacific Institute for the Mathematical Sciences (PIMS) UBC Department of Statistics STATMOS SFU SFU Department of Statistics and Actuarial Science

Casey Shannon, Nick Fishbane -- helpers @ the first offering of this tutorial

please see this GitHub repository for all references, examples worked with live coding, these slides, etc.

https://github.com/jennybc/ggplot2-tutorial

these slides just remind me to discuss some Big Ideas by putting them in a Big Font

See more of my figure making wisdom here: http://stat545-ubc.github.io/graph00_index.html

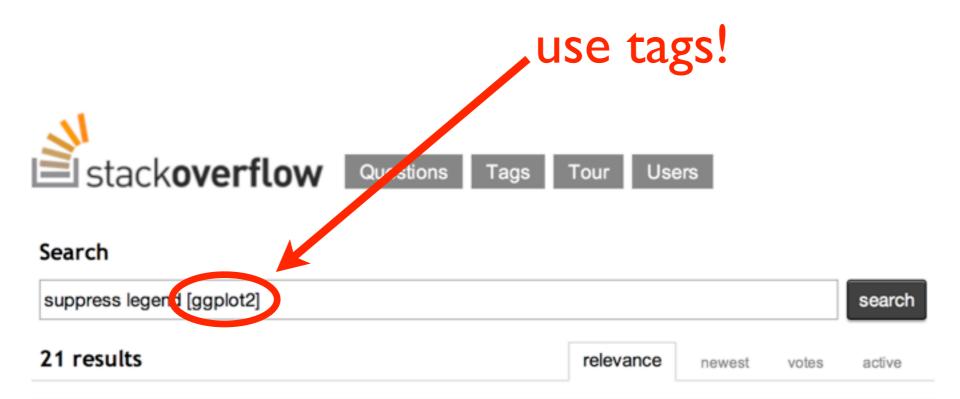
000		All the graph things			R _M
STAT 545 ^{10me}	FAQ	Syllabus	Topics	People	

All the graph things

We work on visualiation throughout the course. Here are the bits in rough order of presentation.

- R graphics landscape slides
 - why we prefer ggplot2 (or lattice) over base R graphics
 - the underappreciated importance of data.frames, tidy data, and factor management to graphics
 - basic jargon of ggplot2
- Learning ggplot2 by using it
 - my ggplot2 tutorial gives indicative code and all resulting figures
 - o scatterplots, stripplots, distributions, bars, themes, managing a color scheme, bubble and line plots
- Do's and don'ts of making effective graphs
 - Effective = easy for audience to decode numerical info
 - Our ability to decode position along common axis >> area, angle, color, etc.
- The R Graph Catalog presents a visual, clickable index of 100+ figures
 - mostly from Naomi Robbins' book "Creating More Effective Graphs"
 - see figure and the exact ggplot2 code to produce it, side-by-side
 - code for all figures and app itself is on GitHub
- Colors
 - Using colors in R
 - Taking control of qualitative colors in ggplot2
- Practical pro tips, i.e. a return to mechanics
 - Secrets of a happy graphing life: data.frames! tidy data! factors!
 - Writing figures to file
 - Multiple plots on a page

stackoverflow is your friend



ggplot2 is an actively maintained open-source chart-drawing library for R, written by Hadley Wickham, based upon the principles of "Grammar of Graphics". It partially replaces R's basic plot and the lattice package, while providing a clean, powerful, orthogonal and fun API.

learn more... | top users | synonyms (2)



A: ggplot legend issue w/ geom_point() and geom_text()

or, if you need to specify the size of text inside the aes, then **legend** = FALSE **suppress** drawing the **legends** of the geom: p <- ggplot(data = df, aes(x = x, y = y, size = count)) + geom_point() p + geom_text(aes(label = label, size = 150, vjust = 2), show_guide = FALSE) ...

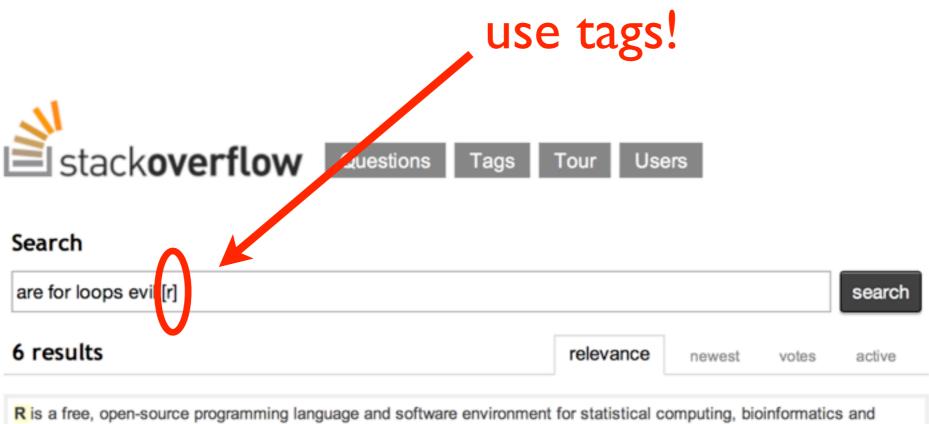
answered nov 19 '10 by kohske



A: removing a layer legend in ggplot

)(this, ...): "legend" argument in geom_XXX and stat_XXX is deprecated. Use show_guide = TRUE or show_guide = FALSE for display or suppress the guide display. I would recommend upgrading ggplot2. ... Depending on the version of ggplot2 you are using you get this problem. Using ggplot2 vs 0.9.0 on R2.14.1 I get this graph: which does not include the legend for the vline. In this version ...

stackoverflow is your friend



R is a free, open-source programming language and software environment for statistical computing, bioinformatics and graphics. Questions should have a minimal example, see tinyurl.com/m3fryge. For statistical questions please use stats.stackexchange.com.

learn more... | top users | synonyms (1)

5 votes

A: For loops in R and computational speed

of information about R's for **loops** on the main Stackoverflow site. For example, the question Speed up the **Loop** Operation in **R** has at least two excellent answers which I found very helpful. Also, the **R** Inferno ..., particularly in a double for **loop**. That's why it's interesting that innocent-looking things like brackets are actually function calls.) The first place you will be told to look when trying to extend **R** ...

answered jun 23 by Flounderer

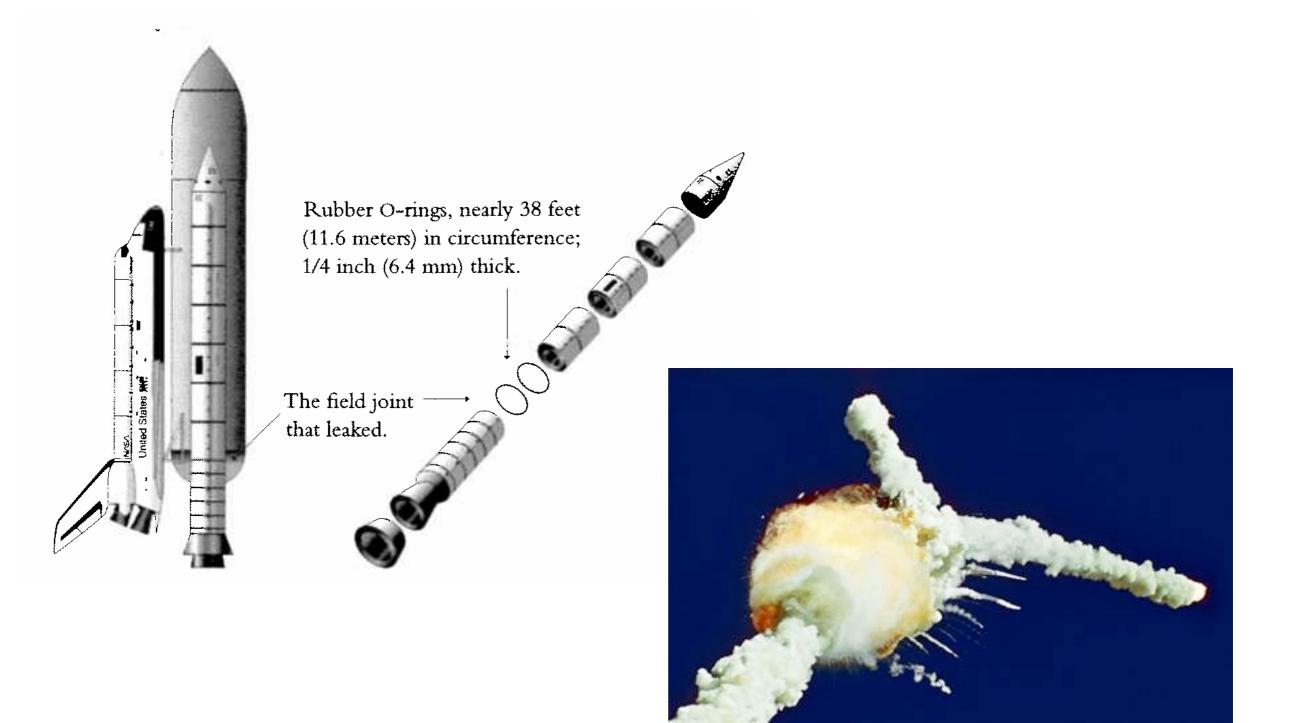


Q: Ranged/Filtered Cross Join with R data.table

it to be but at least is reasonable in terms of memory consumption (I will let it run overnight on my real scenario ~ 1 Million rows). I tried changing the data table keys (using the dates instead of id's); it did not have any impact. As expected, explicitly writing the **loop** in **R** (manualIter) crawls. ... suggest a high performing approach avoiding the full cross join? See test example below doing the job with the **evil** full cross join. library(data.table) # Test data. dt1 <- data.table(id1=1:10, D=2 ...

"A picture is worth a thousand words"

1986 Challenger space shuttle disaster Favorite example of <u>Edward Tufte</u>



http://msnbcmedial.msn.com/j/msnbc/Components/Photos/050709/050609_columbia_hmed_6p.hmedium.jpg

TEMPERATURE CONCERN ON

SRM JOINTS

27 JAN 1986

1	I	HISTORY OF	D-RING DAMAGE (IN SRM FIELD	JOINTS		
67 67 89	SRM	C: Erosion Depth	ross Sectional Perimeter Affected	View Nominal Dia.	To Length Of Max Erosion	p View Total Heat Affected Length	Clocking Location
61A LH Center Field++	<u>No.</u> 22A	(in.) None	(deg) None	<u>(in.)</u>	<u>(in.)</u>	(in.)	(deg)
<pre>61A LH CENTER FIELD** (51C LH Forward Field** 51C RH Center Field (prim)*** 51C RH Center Field (sec)***</pre>	22A 22A 15A 15B	NONÉ 0.010 0.038	NONÉ 154.0 130.0	0.280 0.280 0.280 0.280 0.280	NONE 4.25 12.50	NONE 5.25 58.75	36*66* 338*-18 163 354
410 RH Forward Field 41C LH Aft Field*	158 138 11A	None 0.028	45.0 110.0	0.280	None 3.00	29.50 None	354 275
418 LH Forward Field	10A	None 0.040	None 217.0	0.280	None 3.00	None 14.50	351
7% SISE WINT FIELD	28	0.053	116.0	0.280			90

*Hot gas path detected in putty. Indication of heat on O-ring, but no damage. **Soot behind primary O-ring. ***Soot behind primary O-ring, heat affected secondary O-ring.

Clocking location of leak check port - 0 deg.

OTHER SRM-15 FIELD JOINTS HAD NO BLOWHOLES IN PUTTY AND NO SOOT NEAR OR BEYOND THE PRIMARY O-RING.

SRM-22 FORWARD FIELD JOINT HAD PUTTY PATH TO PRIMARY O-RING, BUT NO O-RING EROSION AND NO SOOT BLOWBY. OTHER SRM-22 FIELD JOINTS HAD NO BLOWHOLES IN PUTTY.

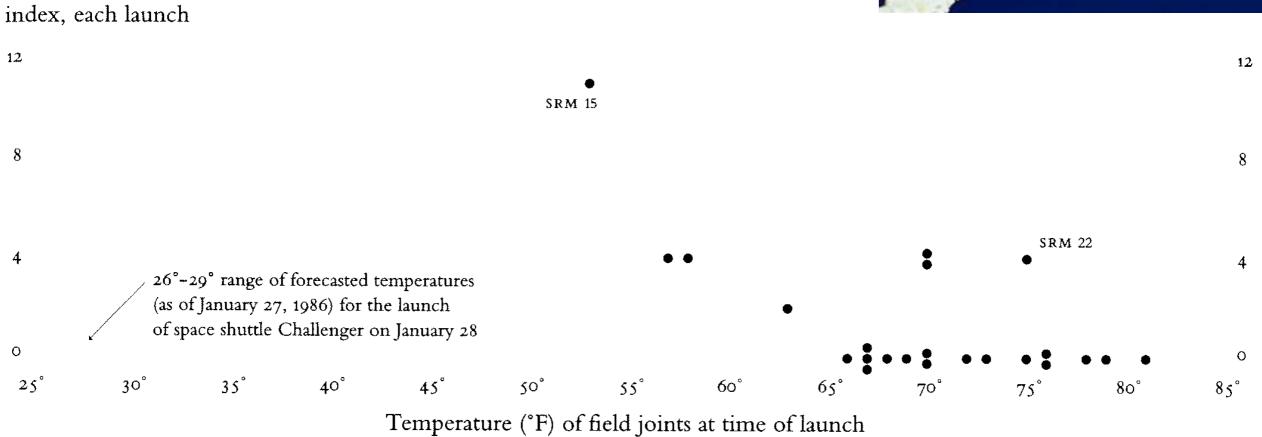
29 27

BLOW BY HISTORY SRM-15 WORST BLOW-BY		HISTOR	Y OF C (DEGRE		MPERATURES		
0 2 CASE JOINTS (80°), (110°) ARC	MOTOR	MBT	AMB	O-RING	WIND		
O MUCH WORSE VISUALLY THAN SRM-22	0m-+	68	36	47	10 mpH		
	Dm - 2	76	45	52	lo mpu	MOTOR	O-RING
SRM 12 BLOW-BY	Qm - 3	72.5	40	48	10 m PH	Dm-+	47
· 2 CASE JOINTS (30-40°)	Qm - 4	76	48	51	10 M PH	Dm - 2	52
	SRM-15	52	64	53	10 mpH		
SRM-13 A, 15, 16A, 18, 23A 24A	5RM-22	77	78	75	10 mpH	Qm - 3	48
O NOZZLE BLOW-BY	5 RM - 25	55	26	29	10 mpH	Qm - 4	5/
				27	25 MPH	SRM-15	53
						5Rm-2	2 75
						5 RM - 2	5 29

HISTORY OF O-RING DAMAGE ON SRM FIELD JOINTS

"A picture is worth a thousand words"





O-ring damage

"A picture is worth a thousand words"

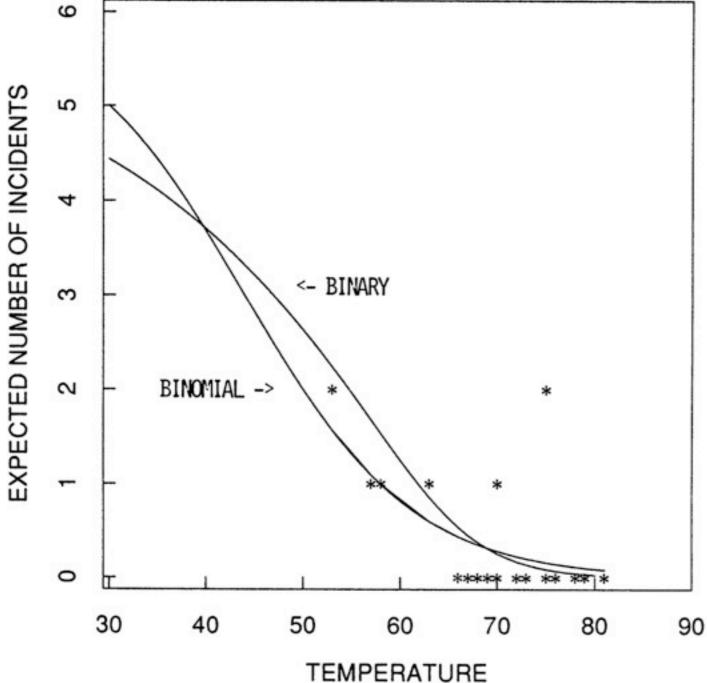




Figure 4. O-Ring Thermal-Distress Data: Field-Joint Primary O-Rings, Binomial-Logit Model, and Binary-Logit Model.

Siddhartha R. Dalal; Edward B. Fowlkes; Bruce Hoadley. Risk Analysis of the Space Shuttle: Pre-Challenger Prediction of Failure. JASA, Vol. 84, No. 408 (Dec., 1989), pp. 945-957. Access via JSTOR.

Edward Tufte <u>http://www.edwardtufte.com</u>

BOOK: <u>Visual Explanations: Images and Quantities, Evidence and</u> <u>Narrative</u>

Ch. 5 deals with the Challenger disaster That chapter is available for \$7 as a downloadable booklet: <u>http://www.edwardtufte.com/tufte/books_textb</u>

"A picture is worth a thousand words"

Always, always, always plot the data.

Replace (or complement) 'typical' tables of data or statistical results with figures that are more compelling and accessible.

Whenever possible, generate figures that overlay / juxtapose observed data and analytical results, e.g. the 'fit'.

base or traditional graphics

VS

lattice package

ships with R, but must load
library(lattice)

VS

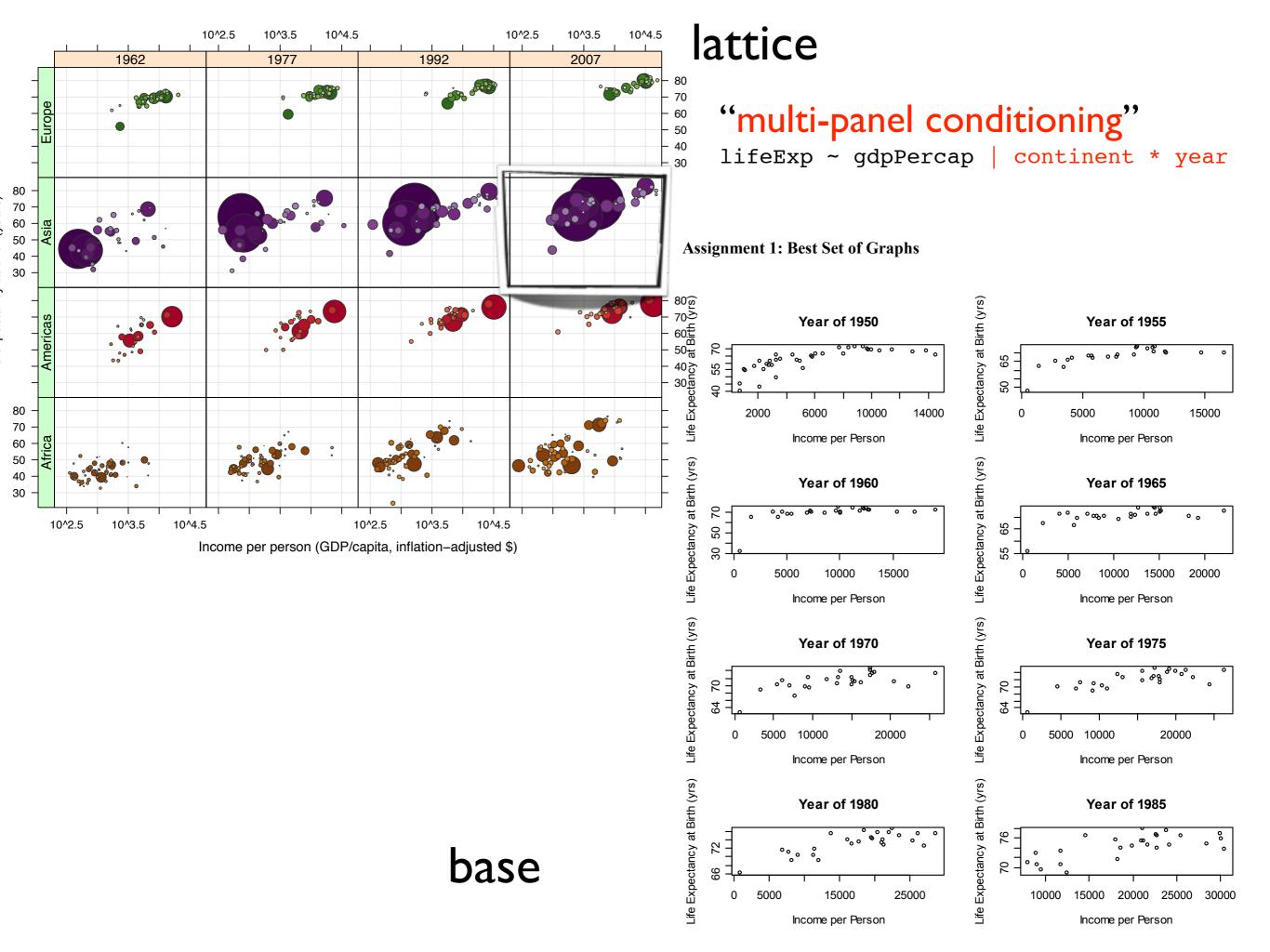
ggplot2 package

must be installed and loaded
install.packages("ggplot2", dependencies = TRUE)
library(ggplot2)

Two main goals for statistical graphics

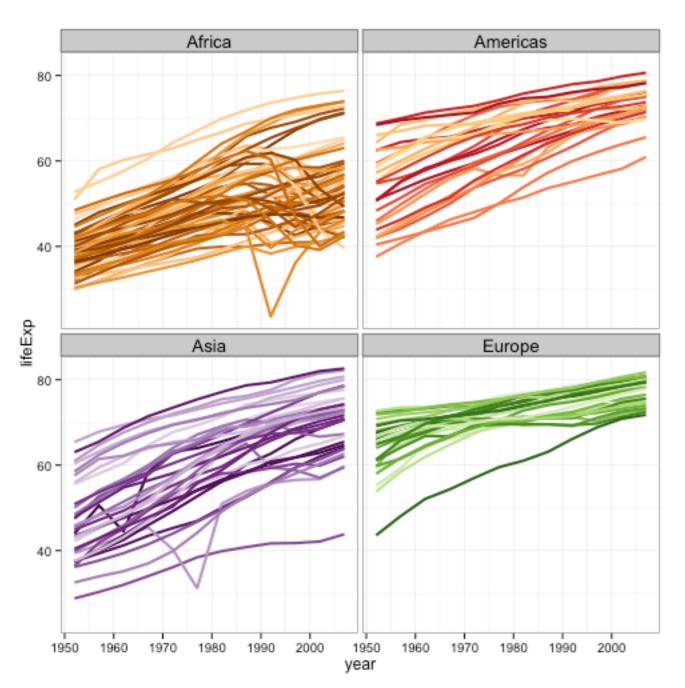
- To facilitate comparisons.
- To identify trends.

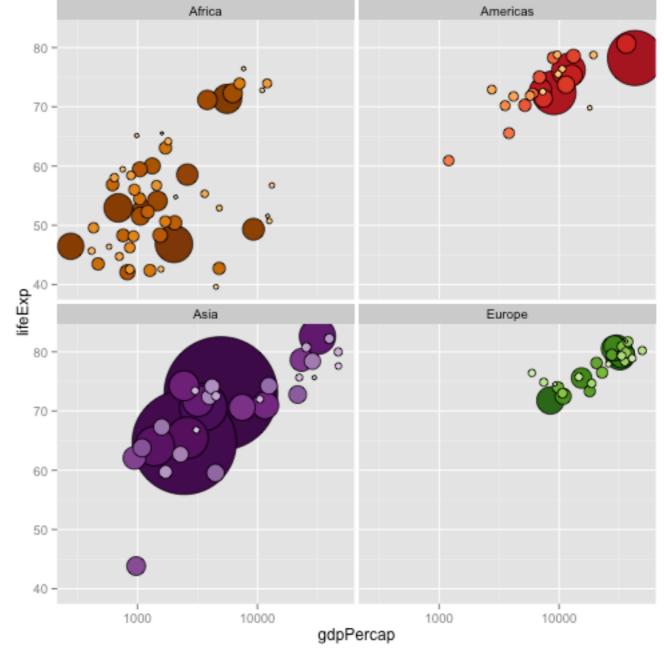
lattice and ggplot2 achieve these goals with less fuss

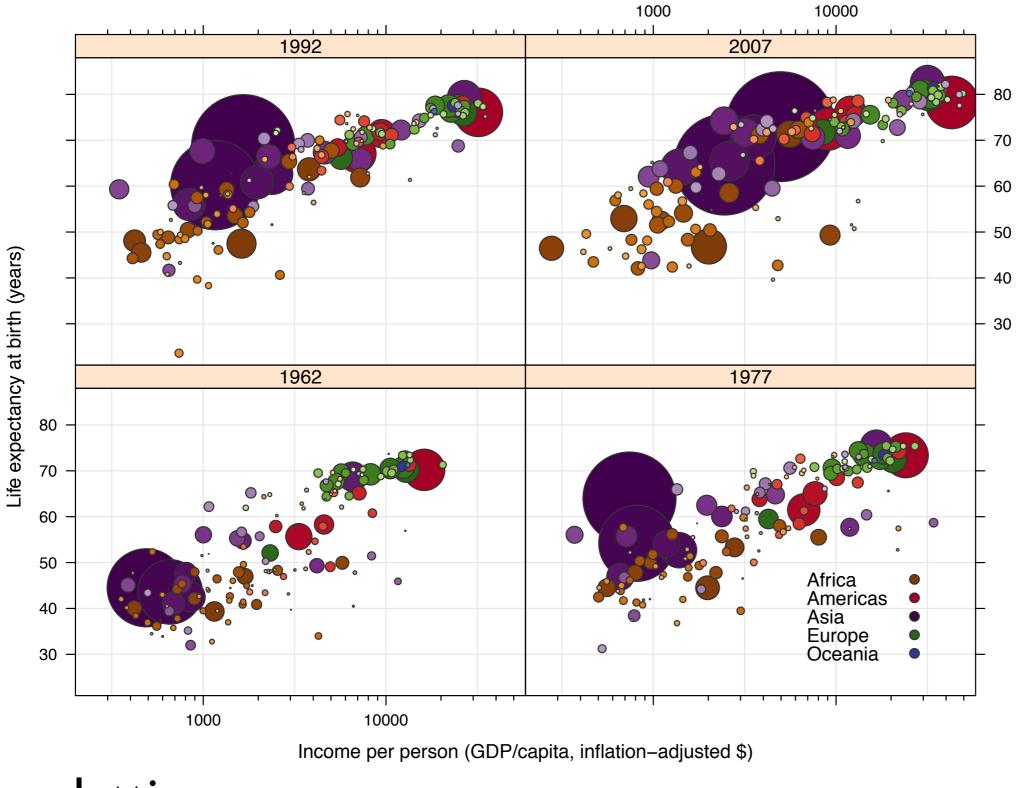


ggplot2

"facetting"
ggplot(...) + ... +
facet_wrap(~ continent)

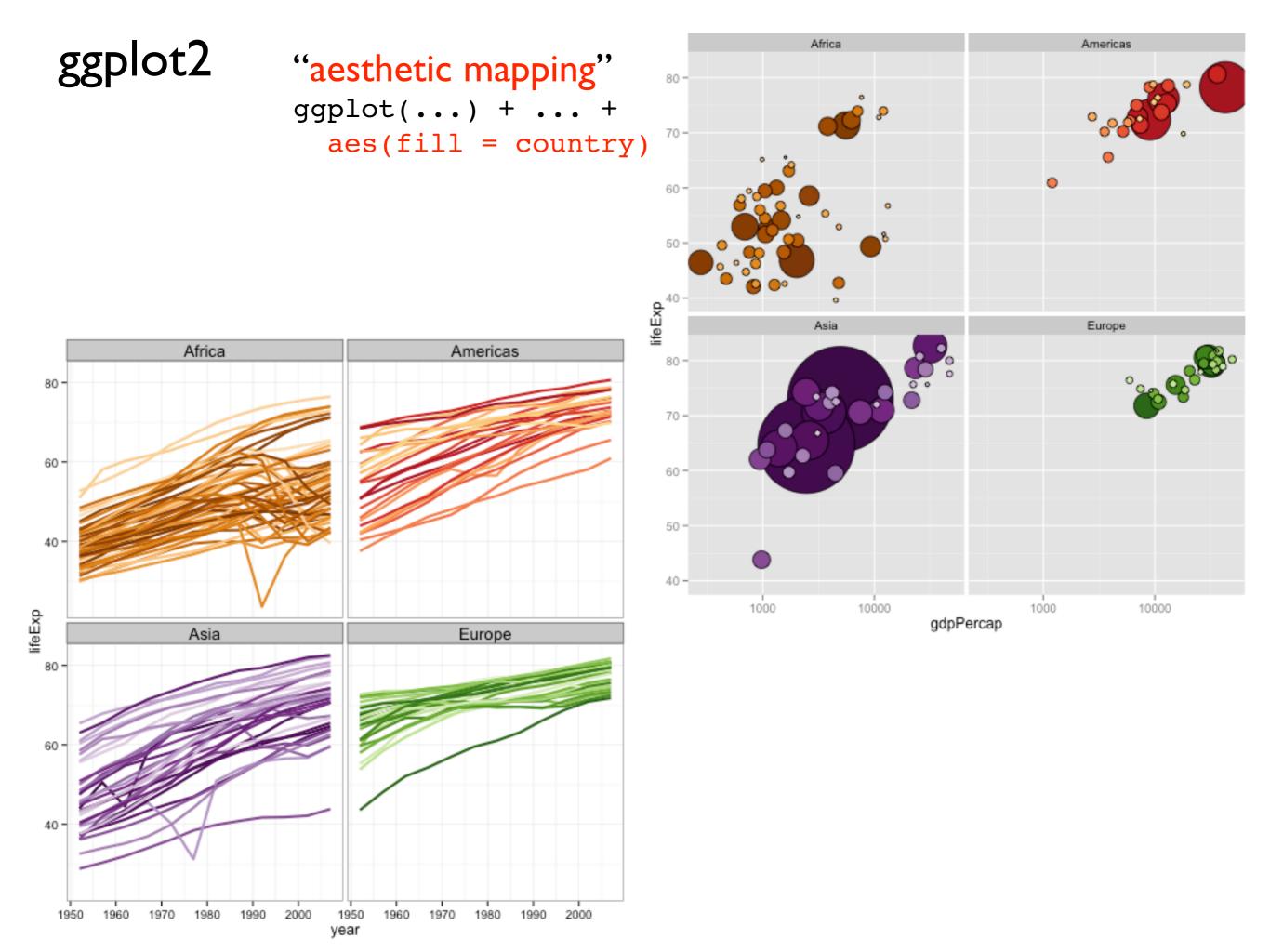


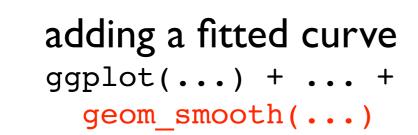




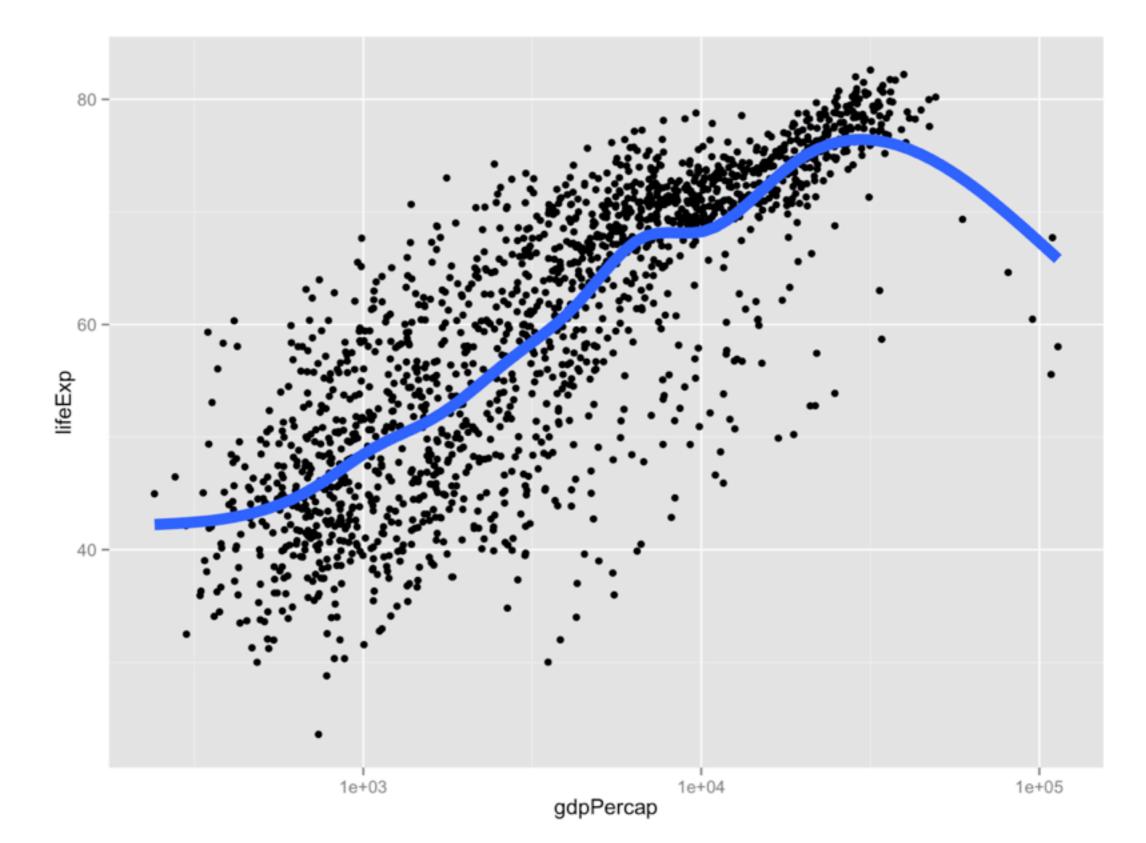
lattice

"groups and superposition" lifeExp ~ gdpPercap | year, group = country

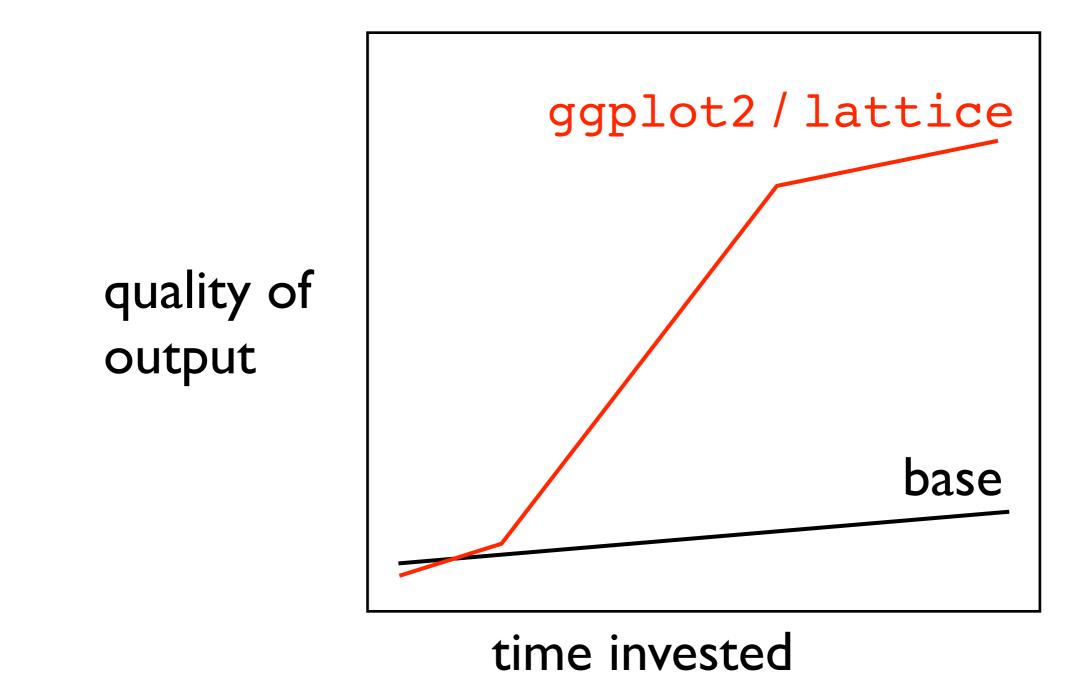




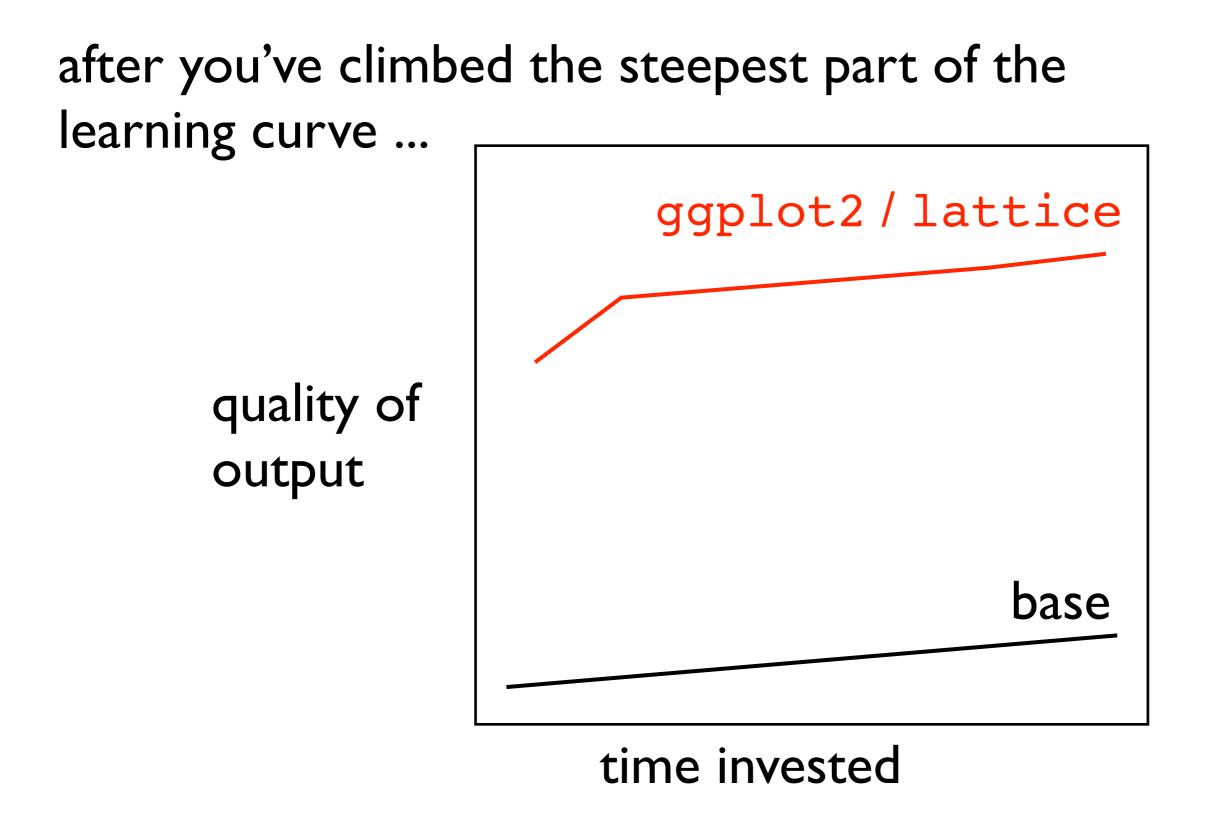
ggplot2



week one



* figure is totally fabricated but, I claim, still true



* figure is totally fabricated but, I claim, still true

I make 99 figures for my eyeballs only for every one that I inflict on other people.

Main reason to use ggplot2 is to get great "value for moneytime" for those 99 figures.

You can also make hyper-controlled figs for publication, but that is fiddly and timeconsuming in *any* system. You may even go back to base graphics sometimes. Embrace diversity!

secrets of the Figure Whisperer

In my experience, the vast majority of graphing agony is due to insufficient data wrangling.

it should feel more like this

AN BROCKING

A AKLAST

use data.frames

use factors

be the boss of your factors

keep your data tidy

reshape your data

if you are struggling with a plot,

ask yourself:

how many of these "rules" am I breaking?

often that is the real, hidden reason for struggle

use data.frames

use factors

be the boss of your factors

keep your data tidy

reshape your data

master read.table()

```
read.table(file, header = FALSE, sep = "", quote = "\"'",
    dec = ".", row.names, col.names,
    as.is = !stringsAsFactors,
    na.strings = "NA", colClasses = NA, nrows = -1,
    skip = 0, check.names = TRUE, fill = !blank.lines.skip,
    strip.white = FALSE, blank.lines.skip = TRUE,
    comment.char = "#",
    allowEscapes = FALSE, flush = FALSE,
    stringsAsFactors = default.stringsAsFactors(),
    fileEncoding = "", encoding = "unknown", text, skipNul = FALSE)
```

<u>dplyr</u> is fantastic new-ish package for working with data.frames (and more)

offers tbl_df as a flavor of data.frame with stringsAsFactors defaulting to FALSE and a nicer print method

<u>readr</u> is fantastic new package for data ingest

consider read_delim(), read_csv(),
read_tsv(), read_csv2() as alternatives to
read.table() and friends

bottom line: take control of your data at time of import

skillful use of the read_this() functions can eliminate a great deal of fannying around later

master reorder ()

reorder.default {stats}

R Documentation

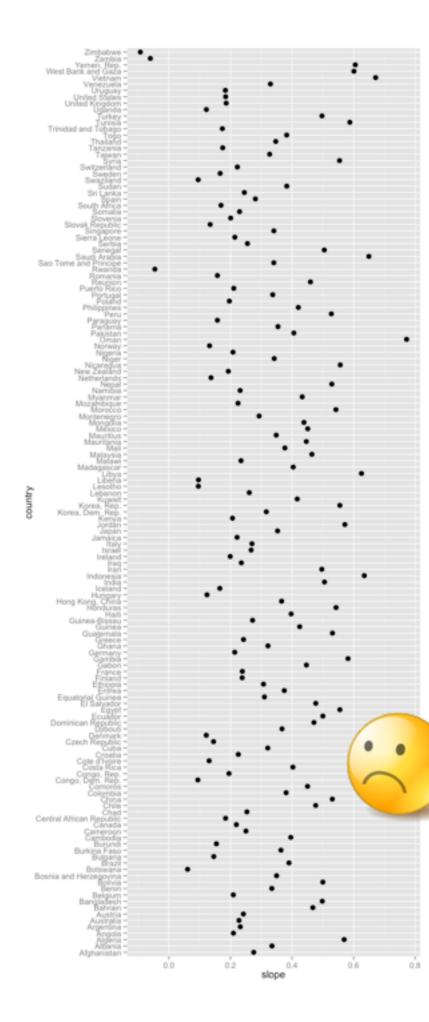
Reorder Levels of a Factor

Description

reorder is a generic function. The "default" method treats its first argument as a categorical variable, and reorders its levels based on the values of a second variable, usually numeric.

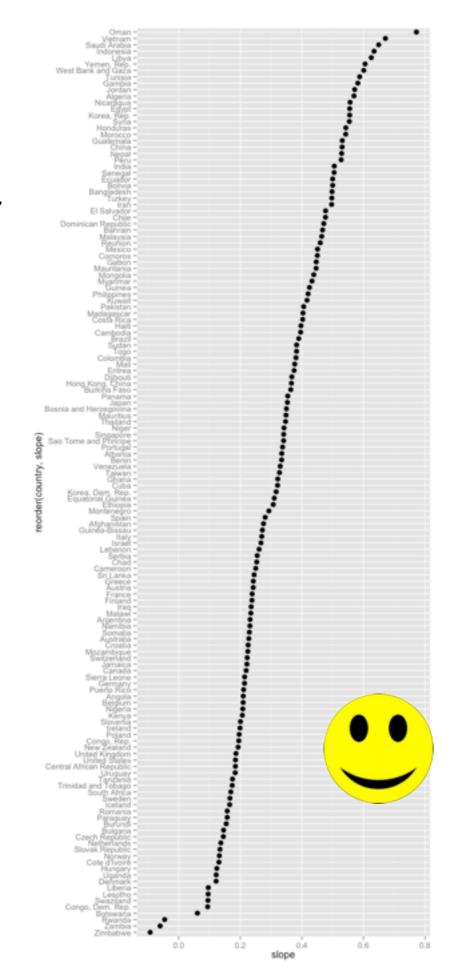
Usage

reorder(x, ...)



reorder() helps you order factor levels based on statistics computed from data as opposed to the A, B, C's

figures are much more valuable this way!



In tidy data:

- 1. Each variable forms a column.
- 2. Each observation forms a row.
- 3. Each type of observational unit forms a table.

messy

	treatmenta	treatmentb
John Smith		2
Jane Doe	16	11
Mary Johnson	3	1

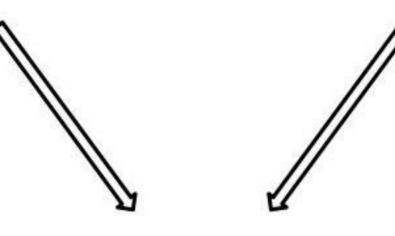
	John Smith	Jane Doe	Mary Johnson
treatmenta		16	3
treatmentb	2	11	1

tidy

name	trt	result
John Smith	a	
Jane Doe	a	16
Mary Johnson	a	3
John Smith	b	2
Jane Doe	b	11
Mary Johnson	b	1

		Habitat	
Species	x	Y	z
A	0	3	0
в	1	0	2

Species	HabitatX	HabitatY	HabitatZ
A	0	3	0
в	1	0	2



Species	Habitat	Abundance
A	Y	3
в	x	1
в	z	2

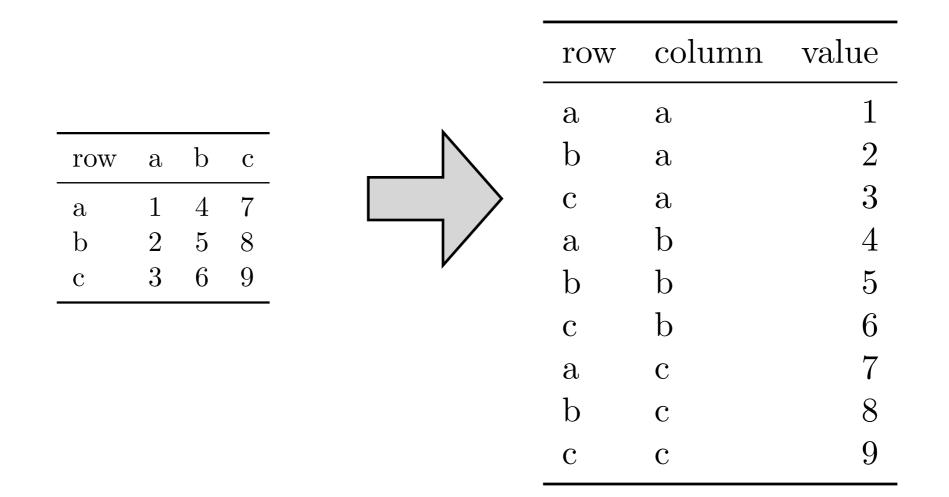
reshape your data



data has a tendency to get shorter and wider, but tall and thin often better for analysis + visualization

from Wickham's *Tidy Data* see also reshape2

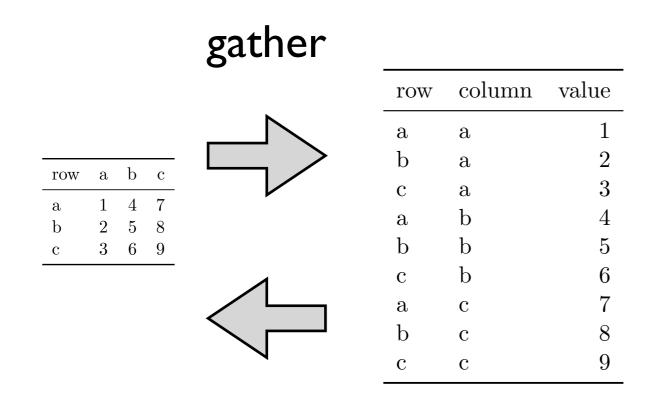
reshape2::melt tidyr::gather



from Wickham's *Tidy Data* see also reshape2

reshape2::cast tidyr::spread

				row column	value
				a a	1
row	a	b	с	b a	2
a	1	4	7	c a	3
b	2	5	8	a b	4
С	3	6	9	b b	5
				c b	6
				a c	7
				b c	8
				c c	9



typical usage pattern:

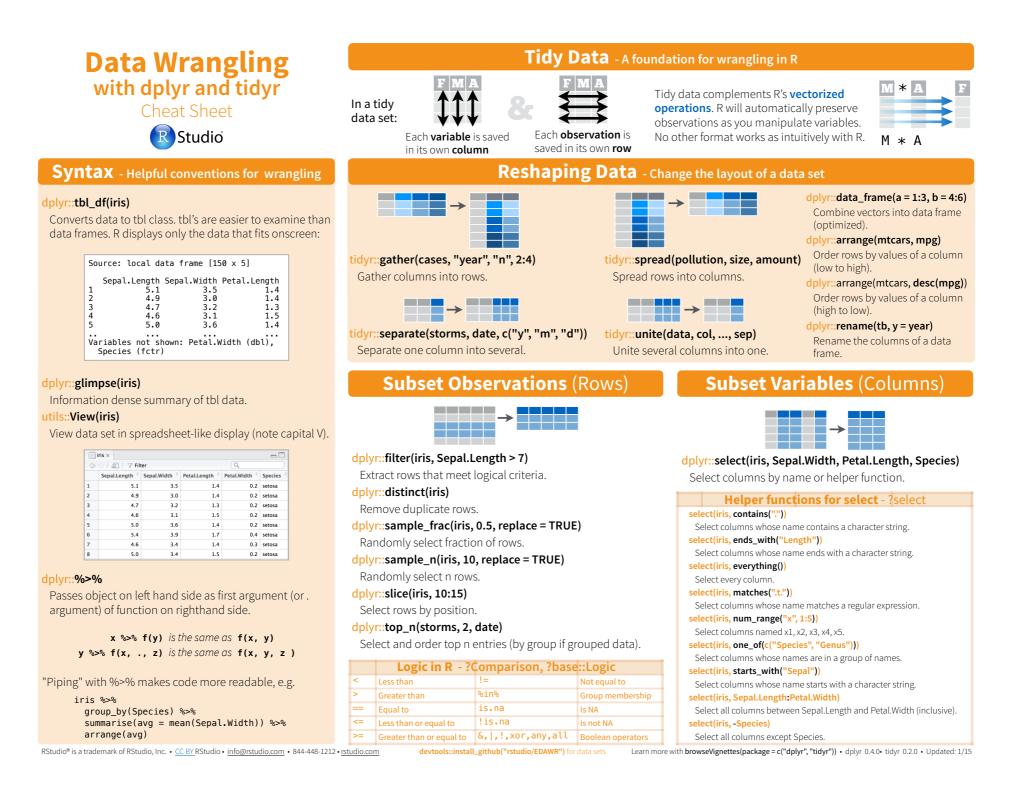
gather to facilitate analysis and visualization

spread to make compact tables that are nicer for eyeballs

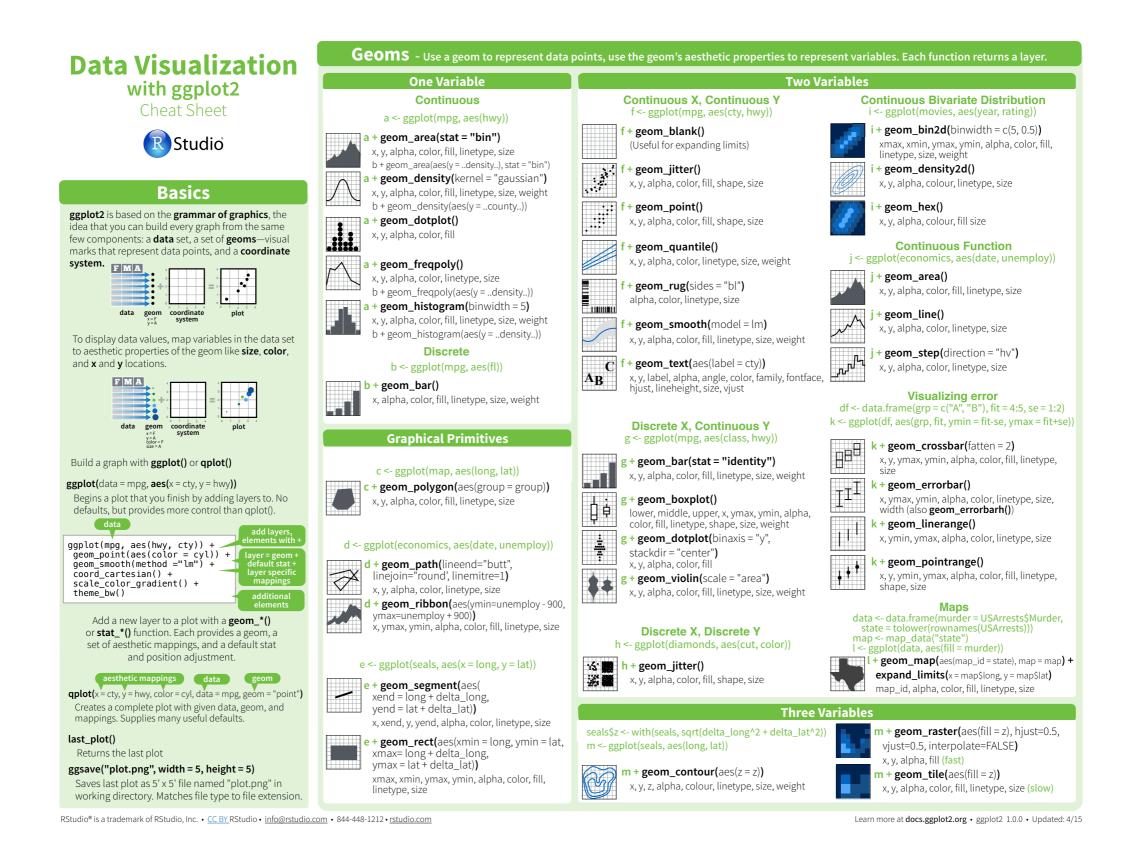
spread

relevant data manipulation packages: tidyr reshape2 dplyr plyr

RStudio's data wrangling cheatsheet



RStudio's data visualization cheatsheet



ggplot2

we will not use qplot() function

no training wheels

you're here ... I assume you want to ride this bike

data, in data.frame form

aesthetic: map variables into properties people can perceive visually ... position, color, line type?

geom: specifics of what people see ... points? lines?

scale: map data values into "computer" values

stat: summarization/transformation of data

facet: juxtapose related mini-plots of data subsets

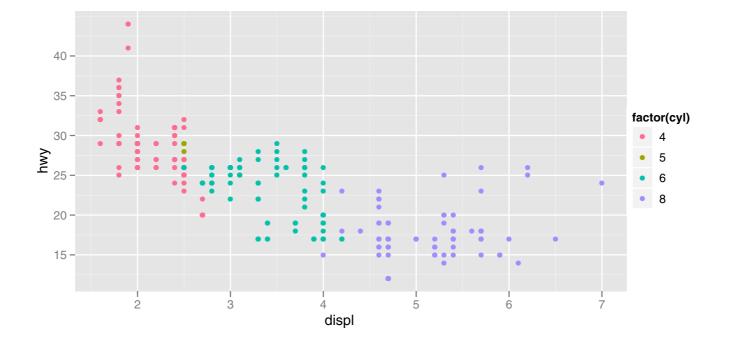


Fig. 3.1: A scatterplot of engine displacement in litres (displ) vs. average highway miles per gallon (hwy). Points are coloured according to number of cylinders. This plot summarises the most important factor governing fuel economy: engine size.

					x y col	our	x	У	colour s	5
anufact	urer model	disp year	cyl cty	hwy class	1.8 29		0.037	0.531	#FF6C91	
udi	a4	1.8 1999	4 18	29 compact	$1.8\ 29$ $1.8\ 29$	4 4	0.037	0.531	,, #FF6C91	
udi	a4	$1.8 \ 1999$	$4 \ 21$	$29 \operatorname{compact}$	$1.8\ 29$ $2.0\ 31$	4	0.074	0.594	#FF6C91	
udi	a4	$2.0\ 2008$	$4 \ 20$	$31 \operatorname{compact}$			0.074	0.562	#FF6C91	
audi	a4	$2.0\ 2008$	$4 \ 21$	30 compact	$2.0\ 30$	4			#00C1A9	
audi	a4	2.8 1999	$6\ 16$	26 compact	2.8 26	6			#00C1A9	
audi	a4	2.8 1999	$6\ 18$	26 compact	2.8 26	6			#00C1A9	
audi	a4	$3.1 \ 2008$	$6\ 18$	$27 \operatorname{compact}$	$3.1 \ 27$	6				
audi	a4 quattro	$1.8 \ 1999$	4 18	26 compact	$1.8\ 26$	4	0.037	0.438	#FF6C91	
audi	a4 quattro	$1.8 \ 1999$	4 16	25 compact	$1.8\ 25$	4	0.037	0.406	#FF6C91	
audi	a4 quattro	$2.0\ 2008$	$4 \ 20$	28 compact	$2.0\ 28$	4	0.074	0.500	#FF6C91	

mapping data to aesthetics scaling: data units → "computer" units base graphics cause a figure to exist as a "side effect"

ggplot2 (and lattice) construct the figure as an R object

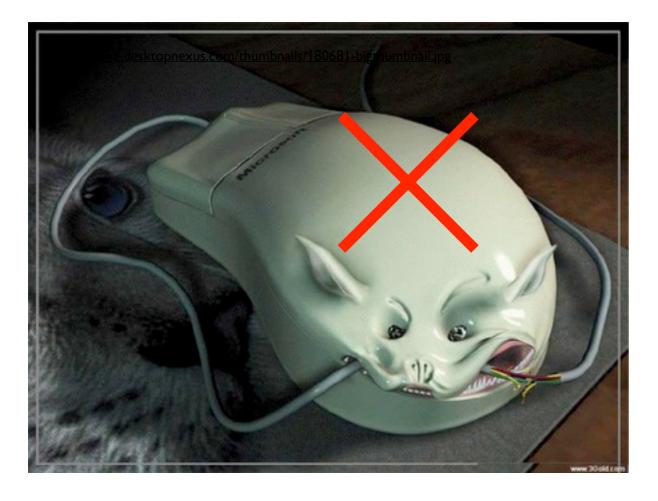
obviously you'll need to print it to see it

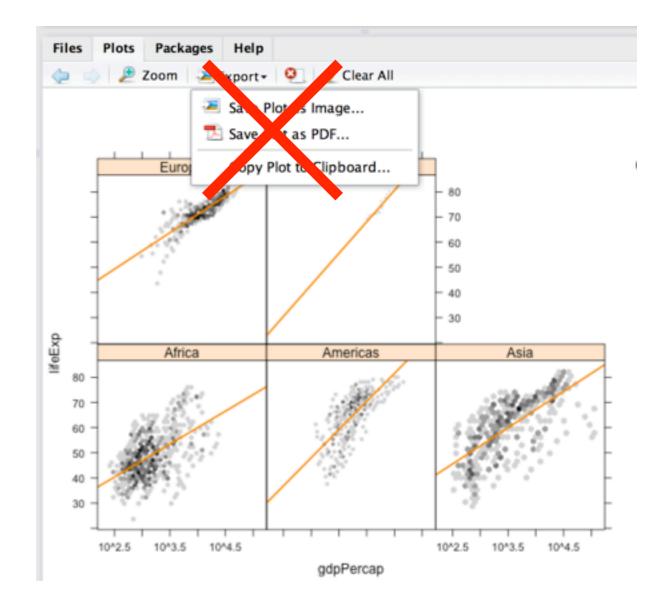
this tutorial consisted largely of live coding ... see the repo for indicative content

https://github.com/jennybc/ggplot2-tutorial

saving figures to file

do not save figures mouse-y style not self-documenting not reproducible





most correct method for base plots:

pdf("awesome_figure.pdf") plot(1:10) dev.off()

postscript(), svg(), png(), tiff(), ...

postscript(), svg(), png(), tiff(), ...

plot(1:10) dev.print(pdf,"awesome_figure.pdf")

fine for everyday use:

ggplot2 has a special function, ggsave(), that is really really nice for saving plots

very smart defaults!

guesses file format from extension

doesn't force you to do annoying stuff with dots per inch (but you can!) next slide from here:

Data Visualization with R & ggplot2

Karthik Ram

September 2, 2013

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Data Visualization with R & ggplot2

Karthik Ram

• If the plot is on your screen

```
ggsave("~/path/to/figure/filename.png")
```

• If your plot is assigned to an object

```
ggsave(plot1, file = "~/path/to/figure/filename.png")
```

• Specify a size

```
ggsave(file = "/path/to/figure/filename.png", width = 6,
height =4)
```

or any format (pdf, png, eps, svg, jpg)

```
ggsave(file = "/path/to/figure/filename.eps")
ggsave(file = "/path/to/figure/filename.jpg")
ggsave(file = "/path/to/figure/filename.pdf")
```

Karthik Ram

p <- ggplot(...) + ... p #delete or comment this out if non-interactive ggsave(p, file = "path/to/figure/filename.png")

Use this workflow if the script might be run noninteractively.

Why? If you do not specify the plot explicitly, the default is to draw the last interactively drawn plot. That won't exist in a non-interactive session and your plot files will be blank.

This can be frustrating. Ask me how I know.

See more of my figure making wisdom here: http://stat545-ubc.github.io/graph00_index.html

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STAT 545 ^{10me}	FAQ	Syllabus	Topics	People			

All the graph things

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 - Writing figures to file
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