Tidying Data

Tidy data

Hadley Wickham, "Tidy Data", *Journal of Statistical Software* 59 (10), August 2014.

- http://vita.had.co.nz/papers/tidy-data.pdf
- https://www.jstatsoft.org/article/view/v059i10

https://cran.r-project.org/web/packages/tidyr/vignettes/tidy-data.html

Tidy data

Happy families are all alike; every unhappy family is unhappy in its own way — Leo Tolstoy

Tidy data

Tidy datasets

messy dataset

Happy families are all alike; every unhappy family is unhappy in its own way — Hadley Wickham messy

Messy 1

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

Messy 2

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

Tidy

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

Principles of tidy data

- Every column is a variable.
- Every row is an observation.
- Every cell is a single value.

messy

_	id [‡]	city [‡]	hwy [‡]
1	car1	19	24
2	car2	20	30
3	car3	29	35

tidy

_	id [‡]	roadtype	mpg [‡]
1	car1	city	19
2	car2	city	20
3	car3	city	29
4	car1	hwy	24
5	car2	hwy	30
6	car3	hwy	35

Step 1: identify "keep as is"

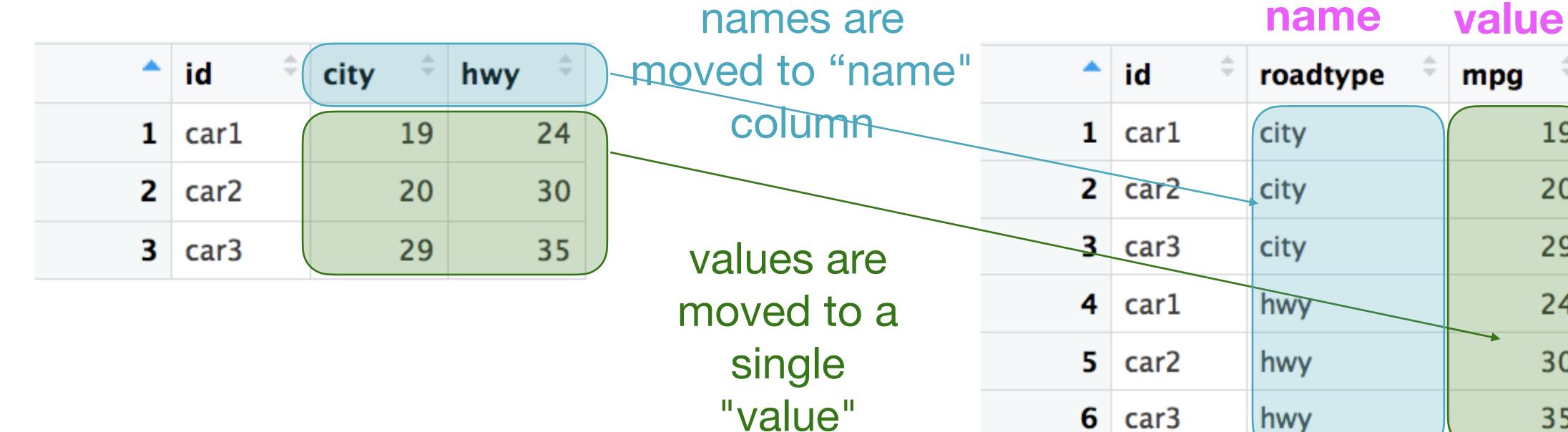
Step 2: create
name value new
columns

_	id	city [‡]	hwy [‡]
1	car1	19	24
2	car2	20	30
3	car3	29	35

_	id	roadtype [‡]	mpg [‡]
1	car1	city	19
2	car2	city	20
3	car3	city	29
4	car1	hwy	24
5	car2	hwy	30
6	car3	hwy	35

Everything else just happens:

messy column



column

Step 1: identify "keep as is"

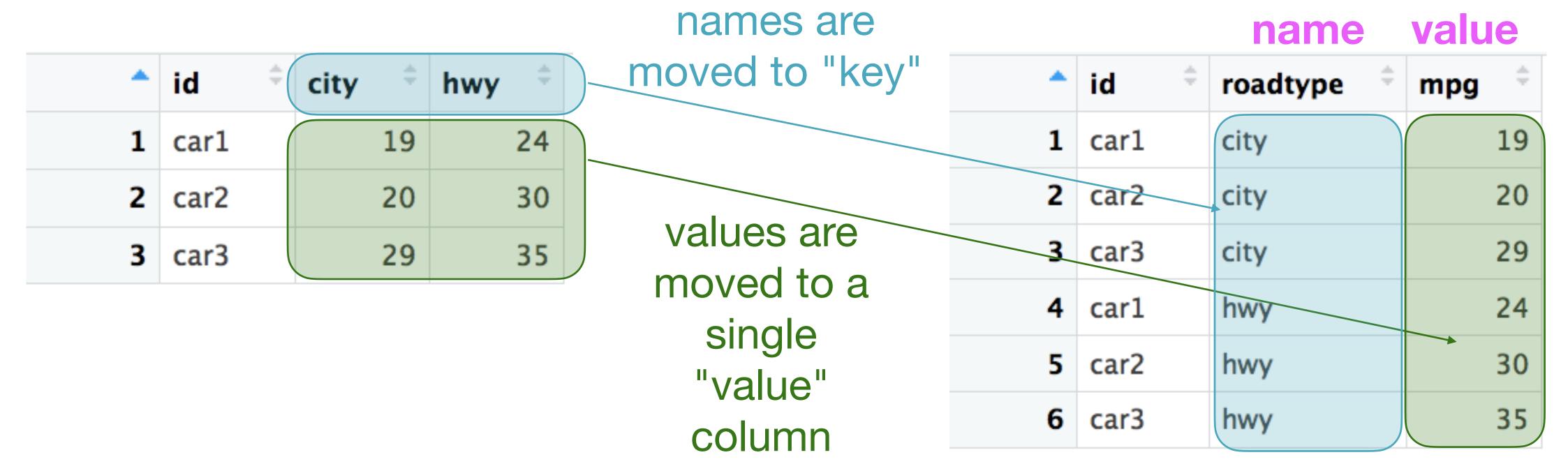
Step 2: create name value columns

_	id	city [‡]	hwy [‡]
1	car1	19	24
2	car2	20	30
3	car3	29	35

•	id	roadtype	mpg [‡]
1	car1	city	19
2	car2	city	20
3	car3	city	29
4	car1	hwy	24
5	car2	hwy	30
6	car3	hwy	35

Everything else just happens:

messy column



If there is no id column

> head(mtcars)

```
mpg cyl disp hp drat wt qsec vs am gear carb
                       6 160 110 3.90 2.620 16.46 0 1
                 21.0
Mazda RX4
                21.0
                       6 160 110 3.90 2.875 17.02
Mazda RX4 Wag
                              93 3.85 2.320 18.61 1 1
                22.8
Datsun 710
                       6 258 110 3.08 3.215 19.44 1 0
              21.4
Hornet 4 Drive
Hornet Sportabout 18.7
                       8 360 175 3.15 3.440 17.02
Valiant
                 18.1
                          225 105 2.76 3.460 20.22
```

...create one

```
mtcars %>%
    rownames_to_column("carname") %>%
    head()
```

```
carname mpg cyl disp hp drat wt qsec vs am gear carb

Mazda RX4 21.0 6 160.0 110 3.90 2.620 16.46 0 1 4 4

Mazda RX4 Wag 21.0 6 160.0 110 3.90 2.875 17.02 0 1 4 4

Datsun 710 22.8 4 108.0 93 3.85 2.320 18.61 1 1 4 1

Hornet 4 Drive 21.4 6 258.0 110 3.08 3.215 19.44 1 0 3 1

Hornet Sportabout 18.7 8 360.0 175 3.15 3.440 17.02 0 0 3 2

Valiant 18.1 6 225.0 105 2.76 3.460 20.22 1 0 3 1

Duster 360 14.3 8 360.0 245 3.21 3.570 15.84 0 0 3 4
```

painters (MASS package)

painters ×						
	Composition	Drawing	Colour	Expression	School [‡]	
Da Udine	10	8	16	3	Α	
Da Vinci	15	16	4	14	Α	
Del Piombo	8	13	16	7	Α	
Del Sarto	12	16	9	8	Α	
Fr. Penni	0	15	8	0	Α	
Guilio Romano	15	16	4	14	Α	
Michelangelo	8	17	4	8	Α	

What should the new columns be?

Current columns:

Composition Colour Drawing Expression School

What should the new columns be?

Current columns:

Composition Colour Drawing Expression School

New columns:

(name) (value)

(rownames) Name School Skill Score

What should the new data look like?

Name	School	Skill	Score
Da Udine	Α	Composition	10
Da Vinci	A	Composition	15
Del Piombo	Α	Composition	8
Del Sarto	A	Composition	12
	•		•

Tidyr code?

Current columns:

```
Composition Colour Drawing Expression School

New columns:

(name) (value)

(rownames)→ Name School Skill Score
```

Columns
specified
match new
columns

Messy or Tidy?

Da Vinci	15	16	4	14	Α
Del Piombo	8	13	16	7	Α
Del Sarto	12	16	9	8	Α
Fr. Penni	0	15	8	0	Α
Guilio Romano	15	16	4	14	Α
Michelangelo	8	17	4	8	Α
Perino del Vaga	15	16	7	6	Α
Perugino	4	12	10	4	Α
Raphael	17	18	12	18	Α
F. Zucarro	10	13	8	8	В
Fr. Salviata	13	15	8	8	В
Parmigiano	10	15	6	6	В
Primaticcio	15	14	7	10	В
T. Zucarro	13	14	10	9	В

tidy definition:

- 1 variable per column
- 1 observation per row

Messy or Tidy?

	Composition	Drawing	Colour	Expression	School [‡]
Da Udine	10	8	16	3	Α
Da Vinci	15	16	4	14	Α
Del Piombo	8	13	16	7	Α
Del Sarto	12	16	9	8	Α
Fr. Penni	0	15	8	0	Α
Guilio Romano	15	16	4	14	Α
Michelangelo	8	17	4	8	Α
Perino del Vaga	15	16	7	6	Α
Perugino	4	12	10	4	Α
Raphael	17	18	12	18	Α
F. Zucarro	10	13	8	8	В
Fr. Salviata	13	15	8	8	В
Parmigiano	10	15	6	6	В

tidy definition:

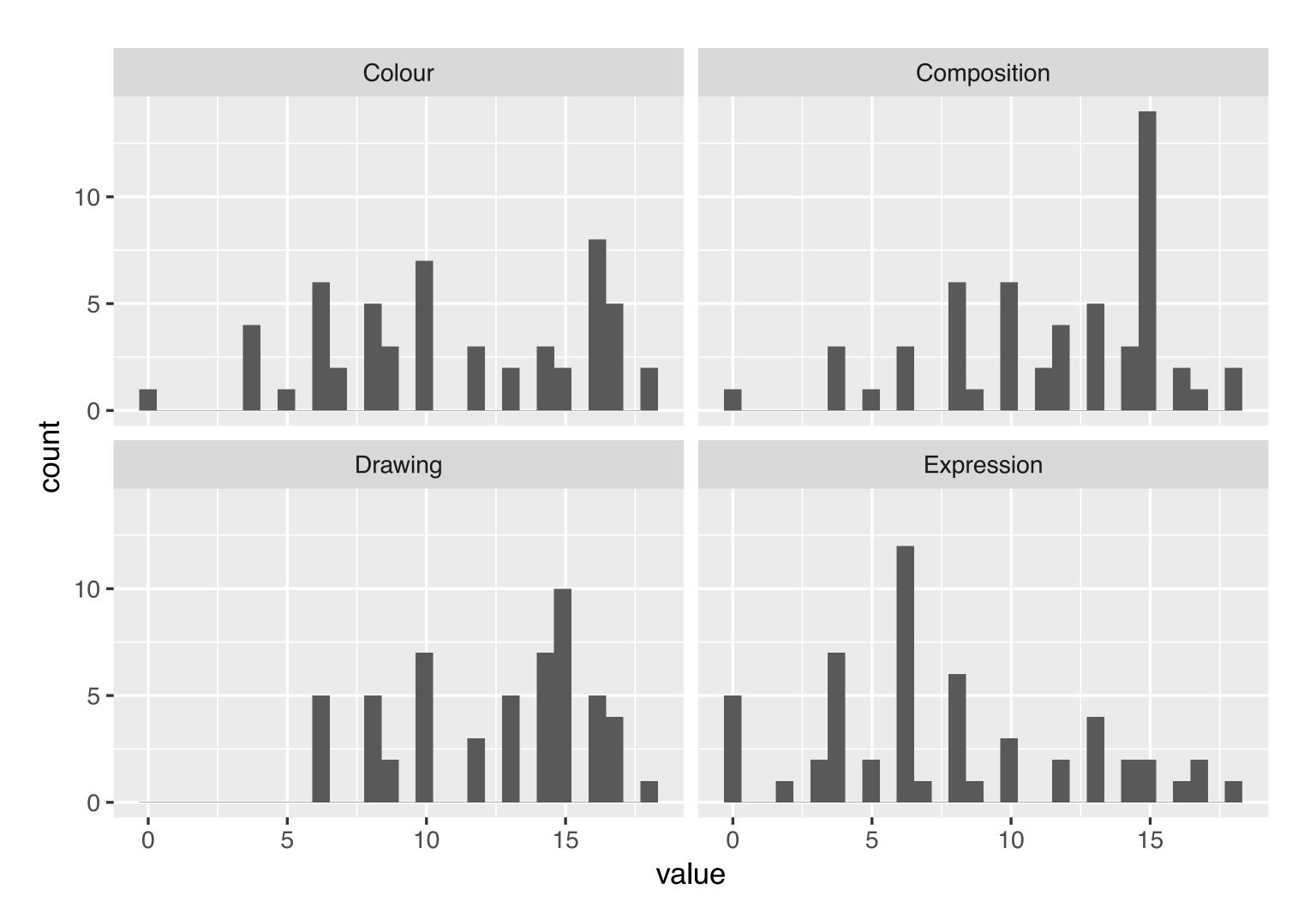
- 1 variable per column
- 1 observation per row



... depends on the use case

"Tidy" works better for some

```
ggplot(tidypaint, aes(Score)) + geom_histogram() +
facet_wrap(~School)
```



...and "Messy" for others

ggplot(painters, aes(Composition, Drawing)) + geom_point()

