# Data tidying with tidyr:: CHEAT SHEET

**Tidy data** is a way to organize tabular data in a consistent data structure across packages. A table is tidy if:



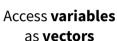




Each variable is in its own **column** 

Each **observation**, or case, is in its own row







Preserve **cases** in vectorized operations

### **Tibbles**

### AN ENHANCED DATA FRAME

Tibbles are a table format provided by the **tibble** package. They inherit the data frame class, but have improved behaviors:

- **Subset** a new tibble with ], a vector with [[ and \$.
- No partial matching when subsetting columns.
- **Display** concise views of the data on one screen.

options(tibble.print\_max = n, tibble.print\_min = m, tibble.width = Inf) Control default display settings.

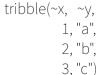
**View()** or **glimpse()** View the entire data set.

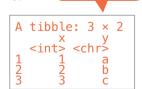
#### **CONSTRUCT A TIBBLE**

**tibble(...)** Construct by columns.

tibble(x = 1:3, y = c("a", "b", "c"))

tribble(...) Construct by rows.





**Both make** 

this tibble

**as\_tibble(**x, ...) Convert a data frame to a tibble. enframe(x, name = "name", value = "value") Convert a named vector to a tibble. Also **deframe()**. **is\_tibble(**x**)** Test whether x is a tibble.

### Reshape Data - Pivot data to reorganize values into a new layout.

2000

1999

2000

80K

212K

213K

table4a 0.7K 212K 213K

<pre>pivot_longer(data, cols, names_to = "name",</pre>
<pre>values_to = "value", values_drop_na = FALSE)</pre>
"Lengthen" data by collapsing several column

'Lengthen" data by collapsing several columns into two. Column names move to a new names to column and values to a new values to column.

pivot\_longer(table4a, cols = 2:3, names\_to = "year", values\_to = "cases")

pivot\_wider(data, names\_from = "name", values from = "value")

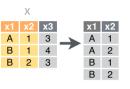
The inverse of pivot\_longer(). "Widen" data by expanding two columns into several. One column provides the new column names, the other the values.

pivot\_wider(table2, names\_from = type, values\_from = count)

### **Expand Tables**

Create new combinations of variables or identify implicit missing values (combinations of variables not present in the data).

carb)



expand(data, ...) Create a new tibble with all possible combinations of the values of the variables listed in ... Drop other variables. expand(mtcars, cyl, gear,



x1 x2 x3 complete(data, ..., fill = list()) Add missing possible combinations of values of variables listed in ... Fill remaining variables with NA. complete(mtcars, cyl, gear, carb)

2000

2000 pop

table2

Split Cells - Use these functions to split or combine cells into individual, isolated values.

172M

174M

1T

1	table5				
country	century	year		country	year
Α	19	99		Α	19 <mark>99</mark>
Α	20	00	$\rightarrow$	Α	2000
В	19	99		В	19 <mark>99</mark>
В	20	00		В	2000

2K

20M

37K

80K

174M

212K

1T

213K

:able3	,					
year	rate		country	year	cases	рор
1999	0.7K/19M		Α	1999	0.7K	19M
2000	2K/20M	$\rightarrow$	Α	2000	2K	20M
1999	37K/172M		В	1999	37K	172
2000	80K/174M		В	2000	80K	174
	year 1999 2000 1999	year rate 1999 0.7K/19M 2000 2K/20M 1999 37K/172M	year rate 1999	year rate country 1999 0.7K/19M A 2000 2K/20M A 1999 37K/172M B	year rate country year 1999 0.7K/19M A 1999 2000 2K/20M A 2000 1999 37K/172M B 1999	year rate country year cases 1999 0.7K/19M A 1999 0.7K 2000 2K/20M A 2000 2K 1999 37K/172M B 1999 37K

				country	year	rate
	table3	3		Α	1999	0.7K
country	year	rate		Α	1999	19M
Α	1999	0.7K/19M		Α	2000	2K
Α	2000	2K/20M	$\rightarrow$	Α	2000	20M
В	1999	37K/172M		В	1999	37K
В	2000	80K/174M		В	1999	172M
_				В	2000	80K
				В	2000	174M

unite(data, col, ..., sep = " ", remove = TRUE, na.rm = FALSE) Collapse cells across several columns into a single column.

unite(table5, century, year, col = "year", sep = "")

separate(data, col, into, sep = "[^[:alnum:]]+", remove = TRUE, convert = FALSE, extra = "warn", fill = "warn", ...) Separate each cell in a column into several columns. Also extract().

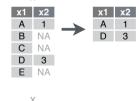
separate(table3, rate, sep = "/", into = c("cases", "pop"))

separate\_rows(data, ..., sep = "[^[:alnum:].]+". convert = FALSE) Separate each cell in a column into several rows.

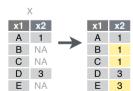
separate\_rows(table3, rate, sep = "/")

## **Handle Missing Values**

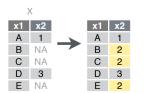
Drop or replace explicit missing values (NA).



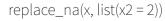
drop\_na(data, ...) Drop rows containing NA's in ... columns.  $drop_na(x, x2)$ 



fill(data, ..., .direction = "down") Fill in NA's in ... columns using the next or previous value. fill(x, x2)



replace\_na(data, replace) Specify a value to replace NA in selected columns.





### **Nested Data**

A **nested data frame** stores individual tables as a list-column of data frames within a larger organizing data frame. List-columns can also be lists of vectors or lists of varying data types. Use a nested data frame to:

- Preserve relationships between observations and subsets of data. Preserve the type of the variables being nested (factors and datetimes aren't coerced to character).
- Manipulate many sub-tables at once with purrr functions like map(), map2(), or pmap() or with dplyr rowwise() grouping.

"cell" contents

#### **CREATE NESTED DATA**

**nest(**data, ...) Moves groups of cells into a list-column of a data frame. Use alone or with dplyr::group\_by():

1. Group the data frame with **group\_by()** and use **nest()** to move the groups into a list-column.

n\_storms <- storms %>%
 group\_by(name) %>%
 nest()

2. Use **nest(new\_col = c(x, y))** to specify the columns to group using dplyr::**select()** syntax.

n\_storms <- storms %>%
nest(data = c(year:long))

name         yr         lat         long           Amy         1975         27.5         -79.0           Amy         1975         28.5         -79.0           Amy         1975         28.5         -79.0           Amy         1975         28.5         -79.0           Bob         1979         22.0         -96.0           Bob         1979         22.0         -96.0           Bob         1979         22.5         -95.3           Bob         1979         23.0         -94.6           Zeta         2005         24.2         -36.1           Zeta         2005         24.7         -36.6       Amy         1975         29.5         -79.0           Amy         1975         29.5         -79.0           Bob         1979         22.0         -96.0           Bob         1979         23.0         -94.6           Zeta         2005         23.9         -35.6           Zeta         2005         24.2         -36.1           Zeta         2005         24.7         -36.6															
Amy 1975 27.5 -79.0   Amy 1975 28.5 -79.0   Amy 1975 28.5 -79.0   Amy 1975 29.5 -79.0   Amy 1975 29.5 -79.0   Bob 1979 22.0 -96.0   Bob 1979 22.5 -95.3   Bob 1979 23.0 -94.6   Zeta 2005 24.2 -36.1   Zeta 2005 24.7 -36.6   Zeta 20													yr	lat	long
Amy 1975 28.5 -79.0 Amy 1975 28.5 -79.0 Amy 1975 28.5 -79.0 Bob 1979 22.0 -96.0 Bob 1979 22.5 -95.3 Bob 1979 23.0 -94.6 Bob 1979 23.0 -94.6 Zeta 2005 24.2 -36.1 Zeta 2005 24.7 -36.6 Zeta 2005 24.7 -	name	yr	lat	long		name	yr	lat	long				1975	27.5	-79.0
Amy       1975       28.5       -79.0       Amy       1975       28.5       -79.0         Amy       1975       29.5       -79.0	Amv	1975	27.5	-79.0		Amy	1975	27.5	-79.0				1975	28.5	-79.0
Amy       1975       29.5       -79.0       Amy       1975       29.5       -79.0         Bob       1979       22.0       -96.0       96.0						Amy	1975	28.5	-79.0	ı	neste	d data frame	1975	29.5	-79.0
Bob       1979       22.0       -96.0       -96.0       Amy <ti>dibble [50x3]&gt;       1979       22.0       -96.0         Bob       1979       22.5       -95.3       Bob       1979       22.5       -95.3         Bob       1979       23.0       -94.6       Bob       1979       23.0       -94.6         Zeta       2005       23.9       -35.6       Zeta       2005       23.9       -35.6         Zeta       2005       24.2       -36.1       Zeta       2005       24.2       -36.1         Zeta       2005       24.7       -36.6       Zeta       2005       24.7       -36.6</ti>	Amv					Amy	1975	29.5	-79.0		name	data	yr	lat	long
Bob       1979       22.5       -95.3       Bob       1979       22.5       -95.3       Bob <ti>tibble [50x3]&gt;       1979       22.5       -95.3         Bob       1979       23.0       -94.6       Zeta       205       22.5       -95.3       Zeta       205       22.5       -95.3       22.5       -95.3       1979       22.5       -95.3         Zeta       2005       23.9       -35.6       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       1979       22.5       -95.3       1979       22.5       -95.3       1979       23.0       -94.6       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.3       22.5       -95.6       22.5       -95.6       22.5       -95.6       22.5       -95.3       22.5       -95.6       22.5       -95.6<!--</td--><td>Bob</td><td>1979</td><td>22.0</td><td>-96.0</td><td></td><td>Bob</td><td>1979</td><td>22.0</td><td>-96.0</td><td></td><td></td><td></td><td>1979</td><td>22.0</td><td></td></ti>	Bob	1979	22.0	-96.0		Bob	1979	22.0	-96.0				1979	22.0	
Bob     1979     23.0     -94.6     Zeta     4tibble [50x3]>       Zeta     2005     23.9     -35.6     2cta     2005     23.9     -35.6       Zeta     2005     24.2     -36.1     2cta     2005     24.2     -36.1       Zeta     2005     24.7     -36.6     2cta     2005     24.7     -36.6	Bob	1979	22.5	-95.3	<b>→</b>	Bob	1979	22.5	-95.3	<b>→</b>	,		1979	22.5	-95.3
Zeta     2005     24.2     -36.1     Zeta     2005     24.2     -36.6       Zeta     2005     24.7     -36.6     2005     24.7     -36.6	Bob	1979	23.0	-94.6		Bob	1979	23.0	-94.6				1979	23.0	-94.6
Zeta     2005     24.2     -36.1       Zeta     2005     24.7     -36.6       Zeta     2005     24.7     -36.6	Zeta	2005	23.9	-35.6		Zeta	2005	23.9	-35.6						
Zeta 2005 24.7 -36.6 Zeta 2005 24.7 -36.6 2005 24.2 -36.1	Zeta	2005	24.2	-36.1		Zeta	2005	24.2	-36.1						
	Zeta	2005	24.7	-36.6		Zeta	2005	24.7	-36.6						

**Index list-columns with [[]].** n\_storms\$data[[1]]

### **CREATE TIBBLES WITH LIST-COLUMNS**

tibble::tribble(...) Makes list-columns when needed.

tribble(~max,~seq,

3, 1:3, 4, 1:4,

5, 1:5)

max seq
3 <int [3]>
4 <int [4]>
5 <int [5]>

tibble::tibble(...) Saves list input as list-columns.

tibble(max = c(3, 4, 5), seq = list(1:3, 1:4, 1:5))

tibble::enframe(x, name="name", value="value") Converts multi-level list to a tibble with list-cols. enframe(list('3'=1:3, '4'=1:4, '5'=1:5), 'max', 'seq')

#### **OUTPUT LIST-COLUMNS FROM OTHER FUNCTIONS**

dplyr::mutate(), transmute(), and summarise() will output list-columns if they return a list.

mtcars %>%

group by(cyl) %>%

summarise(q = list(quantile(mpg)))

### **RESHAPE NESTED DATA**

unnest(data, cols, ..., keep\_empty = FALSE) Flatten nested columns
back to regular columns. The inverse of nest().

n storms %>% unnest(data)

unnest\_longer(data, col, values\_to = NULL, indices\_to = NULL)
Turn each element of a list-column into a row.

starwars %>% select(name, films) %>% unnest\_longer(films)

		name	films
		Luke	The Empire Strik
		Luke	Revenge of the S
name	films	Luke	Return of the Jed
Luke	<chr [5]=""></chr>	 C-3PO	The Empire Strik
C-3PO	<chr [6]=""></chr>	C-3PO	Attack of the Cl
R2-D2	<chr[7]></chr[7]>	C-3PO	The Phantom M
		R2-D2	The Empire Strik
		R2-D2	Attack of the Cl
		R2-D2	The Phantom M

**unnest\_wider**(data, col) Turn each element of a list-column into a regular column.

starwars %>% select(name, films) %>% unnest\_wider(films)

name	films		name	1	2	3
Luke	<chr [5]=""></chr>	$\longrightarrow$	Luke	The Empire	Revenge of	Return of
C-3PO	<chr [6]=""></chr>		C-3PO	The Empire	Attack of	The Phantom
R2-D2	<chr[7]></chr[7]>		R2-D2	The Empire	Attack of	The Phantom

**hoist**(.data, .col, ..., .remove = TRUE) Selectively pull list components out into their own top-level columns. Uses purrr::pluck() syntax for selecting from lists.

starwars %>% select(name, films) %>% hoist(films, first\_film = 1, second\_film = 2)

name	films		name	first_film	second_film	films
Luke	<chr [5]=""></chr>	$\longrightarrow$	Luke	The Empire	Revenge of	<chr [3]=""></chr>
C-3PO	<chr [6]=""></chr>		C-3PO	The Empire	Attack of	<chr [4]=""></chr>
R2-D2	<chr[7]></chr[7]>		R2-D2	The Empire	Attack of	<chr [5]=""></chr>

#### TRANSFORM NESTED DATA

A vectorized function takes a vector, transforms each element in parallel, and returns a vector of the same length. By themselves vectorized functions cannot work with lists, such as list-columns.

dplyr::rowwise(.data, ...) Group data so that each row is one group, and within the groups, elements of list-columns appear directly (accessed with [[), not as lists of length one. When you use rowwise(), dplyr functions will seem to apply functions to list-columns in a vectorized fashion.



Apply a function to a list-column and create a new list-column.



Apply a function to a list-column and create a regular column.



Collapse multiple list-columns into a single list-column.

starwars %>%

rowwise() %>%

mutate(transport = list(append(vehicles, starships)))

Apply a function to multiple list-columns.

starwars %>% length() returns one integer per row

rowwise() %>% mutate(n\_transports = length(c(vehicles, starships)))

See **purrr** package for more list functions.

