#### What is dataset?

- A dataset is a collection of values, usually either numbers (if quantitative) or strings (if qualitative)
- Values are organized in two ways. Every value belongs to a variable and an observation.

| person       | treatment    | result |
|--------------|--------------|--------|
| John Smith   | a            |        |
| Jane Doe     | $\mathbf{a}$ | 16     |
| Mary Johnson | $\mathbf{a}$ | 3      |
| John Smith   | b            | 2      |
| Jane Doe     | b            | 11     |
| Mary Johnson | b            | 1      |

## Why Tidy Data?

Tidy datasets are easy to manipulate, model and visualize, and have a specific structure: each variable is a column, each observation is a row, and each type of observational unit is a table.

## Problems with Messy Dataset

- Column headers are values, not variable names.
- Multiple variables are stored in one column.
- Variables are stored in both rows and columns.
- Multiple types of observational units are stored in the same table.
- A single observational unit is stored in multiple tables.

#### Column headers are values, not variable names

**Definition: Melting** 

- Turning columns into rows
- Parametrizing a list of columns that are already variables and
- convert the other columns into variables containing repeated column headings and the concatenated data values from the previous

separate columns

| row | $\mathbf{a}$ | b | $\mathbf{c}$ |
|-----|--------------|---|--------------|
| A   | 1            | 4 | 7            |
| В   | 2            | 5 | 8            |
| C   | 3            | 6 | 9            |

| row          | $\operatorname{column}$ | value |
|--------------|-------------------------|-------|
| A            | a                       | 1     |
| В            | $\mathbf{a}$            | 2     |
| $\mathbf{C}$ | $\mathbf{a}$            | 3     |
| A            | b                       | 4     |
| В            | b                       | 5     |
| $\mathbf{C}$ | b                       | 6     |
| A            | $\mathbf{c}$            | 7     |
| В            | $\mathbf{c}$            | 8     |
| $\mathbf{C}$ | $\mathbf{c}$            | 9     |

(b) Molten data

# Multiple variables stored in one column

| country         | year | column | cases | country       | year  | sex          | age     | case |
|-----------------|------|--------|-------|---------------|-------|--------------|---------|------|
| AD              | 2000 | m014   | 0     | AD            | 2000  | m            | 0–14    |      |
| AD              | 2000 | m1524  | 0     | AD            | 2000  | m            | 15-24   |      |
| AD              | 2000 | m2534  | 1     | AD            | 2000  | m            | 25 - 34 |      |
| AD              | 2000 | m3544  | 0     | AD            | 2000  | m            | 35 – 44 |      |
| AD              | 2000 | m4554  | 0     | AD            | 2000  | m            | 45 - 54 |      |
| AD              | 2000 | m5564  | 0     | AD            | 2000  | $\mathbf{m}$ | 55 - 64 |      |
| AD              | 2000 | m65    | 0     | AD            | 2000  | $\mathbf{m}$ | 65 +    |      |
| AE              | 2000 | m014   | 2     | AE            | 2000  | m            | 0 - 14  |      |
| AE              | 2000 | m1524  | 4     | AE            | 2000  | m            | 15 - 24 |      |
| AE              | 2000 | m2534  | 4     | AE            | 2000  | m            | 25 - 34 |      |
| AE              | 2000 | m3544  | 6     | AE            | 2000  | m            | 35 - 44 |      |
| AE              | 2000 | m4554  | 5     | AE            | 2000  | $\mathbf{m}$ | 45 - 54 |      |
| AE              | 2000 | m5564  | 12    | AE            | 2000  | m            | 55 - 64 | 1    |
| AE              | 2000 | m65    | 10    | $\mathbf{AE}$ | 2000  | m            | 65 +    | 1    |
| AE              | 2000 | f014   | 3     | $\mathbf{AE}$ | 2000  | f            | 0-14    |      |
| (a) Molten data |      |        |       |               | (b) 7 | Γidy da      | ıta     |      |

#### Variables are stored in both rows and columns

| id      | year | month | element               | d1 | d2   | d3   | d4 | d5   | d6    | d7     | d8    |
|---------|------|-------|-----------------------|----|------|------|----|------|-------|--------|-------|
| MX17004 | 2010 | 1     | tmax                  |    | -    | -    |    |      | · — · | ş —— ş | ş ——ş |
| MX17004 | 2010 | 1     | $\operatorname{tmin}$ | _  | _    | -    | _  | -    | -     | -      | _     |
| MX17004 | 2010 | 2     | tmax                  | -  | 27.3 | 24.1 | _  | -    | _     | _      | _     |
| MX17004 | 2010 | 2     | $_{ m tmin}$          | -  | 14.4 | 14.4 | _  |      | -     | -      | -     |
| MX17004 | 2010 | 3     | tmax                  | -  |      | _    | _  | 32.1 | -     | -      | -     |
| MX17004 | 2010 | 3     | $_{ m tmin}$          | -  | -    | _    | _  | 14.2 | -     | -      | -     |
| MX17004 | 2010 | 4     | tmax                  |    | -    | S    |    | -    | _     | _      | _     |
| MX17004 | 2010 | 4     | $_{ m tmin}$          | -  |      | S9   | -  |      | _     | _      | _     |
| MX17004 | 2010 | 5     | tmax                  | _  |      |      |    | -    | _     | _      | _     |
| MX17004 | 2010 | 5     | $_{ m tmin}$          |    |      | -    | -  |      |       | _      | _     |

| id      | date         | element               | value | id      | date          | tmax | tmin |
|---------|--------------|-----------------------|-------|---------|---------------|------|------|
| MX17004 | 2010-01-30   | tmax                  | 27.8  | MX17004 | 2010-01-30    | 27.8 | 14.5 |
| MX17004 | 2010-01-30   | $_{ m tmin}$          | 14.5  | MX17004 | 2010-02-02    | 27.3 | 14.4 |
| MX17004 | 2010-02-02   | tmax                  | 27.3  | MX17004 | 2010-02-03    | 24.1 | 14.4 |
| MX17004 | 2010-02-02   | $\operatorname{tmin}$ | 14.4  | MX17004 | 2010-02-11    | 29.7 | 13.4 |
| MX17004 | 2010-02-03   | tmax                  | 24.1  | MX17004 | 2010-02-23    | 29.9 | 10.7 |
| MX17004 | 2010-02-03   | $_{ m tmin}$          | 14.4  | MX17004 | 2010-03-05    | 32.1 | 14.2 |
| MX17004 | 2010-02-11   | tmax                  | 29.7  | MX17004 | 2010-03-10    | 34.5 | 16.8 |
| MX17004 | 2010-02-11   | $_{ m tmin}$          | 13.4  | MX17004 | 2010-03-16    | 31.1 | 17.6 |
| MX17004 | 2010-02-23   | tmax                  | 29.9  | MX17004 | 2010-04-27    | 36.3 | 16.7 |
| MX17004 | 2010-02-23   | $\operatorname{tmin}$ | 10.7  | MX17004 | 2010-05-27    | 33.2 | 18.2 |
|         | (a) Molten d | ata                   |       |         | (b) Tidy data | L    |      |

### Multiple types in one table

Datasets often involve values collected at multiple levels, on different types of observational units.

During tidying, each type of observational unit should be stored in its own table.

This is closely related to the idea of database normalization, where each fact is expressed in only one place. (could lead to potential inconsistencies within the df)

| id | artist              | track                | time | $\overline{id}$ | date       | rank |
|----|---------------------|----------------------|------|-----------------|------------|------|
| 1  | 2 Pac               | Baby Don't Cry       | 4:22 | $\overline{1}$  | 2000-02-26 | 87   |
| 2  | 2Ge+her             | The Hardest Part Of  | 3:15 | 1               | 2000-03-04 | 82   |
| 3  | 3 Doors Down        | Kryptonite           | 3:53 | 1               | 2000-03-11 | 72   |
| 4  | 3 Doors Down        | Loser                | 4:24 | 1               | 2000-03-18 | 77   |
| 5  | 504  Boyz           | Wobble Wobble        | 3:35 | 1               | 2000-03-25 | 87   |
| 6  | 98^0                | Give Me Just One Nig | 3:24 | 1               | 2000-04-01 | 94   |
| 7  | A*Teens             | Dancing Queen        | 3:44 | 1               | 2000-04-08 | 99   |
| 8  | Aaliyah             | I Don't Wanna        | 4:15 | 2               | 2000-09-02 | 91   |
| 9  | Aaliyah             | Try Again            | 4:03 | 2               | 2000-09-09 | 87   |
| 10 | Adams, Yolanda      | Open My Heart        | 5:30 | 2               | 2000-09-16 | 92   |
| 11 | Adkins, Trace       | More                 | 3:05 | 3               | 2000-04-08 | 81   |
| 12 | Aguilera, Christina | Come On Over Baby    | 3:38 | 3               | 2000-04-15 | 70   |
| 13 | Aguilera, Christina | I Turn To You        | 4:00 | 3               | 2000-04-22 | 68   |
| 14 | Aguilera, Christina | What A Girl Wants    | 3:18 | 3               | 2000-04-29 | 67   |
| 15 | Alice Deejay        | Better Off Alone     | 6:50 | 3               | 2000-05-06 | 66   |

#### Tidy Tools

Tidying data makes it easier to maintain and do analysis with.

#### Manipulation functions:

- Filter: subsetting or removing observations based on some condition.
- Transform: adding or modifying variables. These modifications can involve either a single variable (e.g., log-transformation), or multiple variables (e.g., computing density from weight and volume).
- Aggregate: collapsing multiple values into a single value (e.g., by summing or taking means).
- Sort: changing the order of observations.