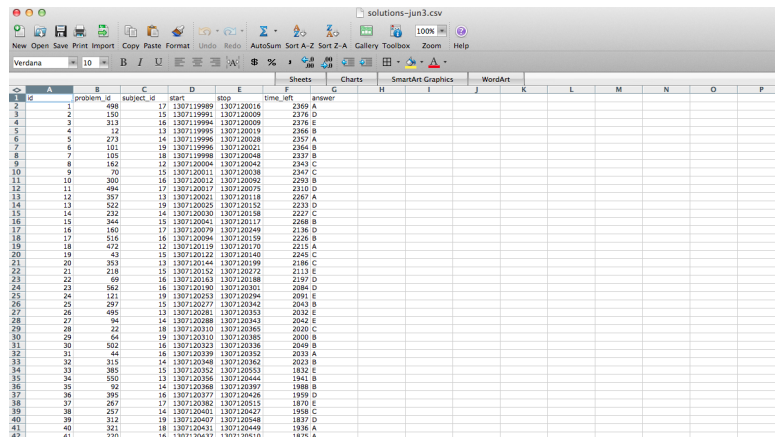




# Reshaping data

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# The goal is tidy data



|    | A  | B            | C          | D         | E         | F       | G      | H | I | J | K | L | M | N | O | P |
|----|----|--------------|------------|-----------|-----------|---------|--------|---|---|---|---|---|---|---|---|---|
|    | id | enrolment_id | subject_id | start     | stop      | time_id | answer |   |   |   |   |   |   |   |   |   |
| 1  | 1  | 68           | 17         | 130719999 | 130720016 |         |        |   |   |   |   |   |   |   |   |   |
| 2  | 2  | 150          | 15         | 130719991 | 130720009 |         | 2369 D |   |   |   |   |   |   |   |   |   |
| 3  | 3  | 113          | 16         | 130719984 | 130720009 |         | 2376 E |   |   |   |   |   |   |   |   |   |
| 4  | 4  | 12           | 13         | 130719995 | 130720019 |         | 2366 B |   |   |   |   |   |   |   |   |   |
| 5  | 5  | 273          | 14         | 130719996 | 130720028 |         | 2357 A |   |   |   |   |   |   |   |   |   |
| 6  | 6  | 101          | 19         | 130719998 | 130720021 |         | 2364 B |   |   |   |   |   |   |   |   |   |
| 7  | 7  | 105          | 18         | 130719998 | 130720048 |         | 2357 B |   |   |   |   |   |   |   |   |   |
| 8  | 8  | 162          | 12         | 130720004 | 130720042 |         | 2343 C |   |   |   |   |   |   |   |   |   |
| 9  | 9  | 70           | 15         | 130720011 | 130720038 |         | 2347 C |   |   |   |   |   |   |   |   |   |
| 10 | 10 | 300          | 16         | 130720012 | 130720092 |         | 2393 B |   |   |   |   |   |   |   |   |   |
| 11 | 11 | 494          | 17         | 130720017 | 130720075 |         | 2310 D |   |   |   |   |   |   |   |   |   |
| 12 | 12 | 397          | 13         | 130720021 | 130720118 |         | 2287 A |   |   |   |   |   |   |   |   |   |
| 13 | 13 | 522          | 19         | 130720025 | 130720152 |         | 2233 D |   |   |   |   |   |   |   |   |   |
| 14 | 14 | 232          | 14         | 130720030 | 130720158 |         | 2227 C |   |   |   |   |   |   |   |   |   |
| 15 | 15 | 444          | 15         | 130720041 | 130720117 |         | 2288 B |   |   |   |   |   |   |   |   |   |
| 16 | 16 | 160          | 17         | 130720079 | 130720249 |         | 2136 D |   |   |   |   |   |   |   |   |   |
| 17 | 17 | 516          | 16         | 130720094 | 130720129 |         | 2226 B |   |   |   |   |   |   |   |   |   |
| 18 | 18 | 472          | 12         | 130720119 | 130720170 |         | 2215 A |   |   |   |   |   |   |   |   |   |
| 19 | 19 | 43           | 15         | 130720122 | 130720140 |         | 2245 C |   |   |   |   |   |   |   |   |   |
| 20 | 20 | 393          | 13         | 130720144 | 130720199 |         | 2186 C |   |   |   |   |   |   |   |   |   |
| 21 | 21 | 218          | 15         | 130720152 | 130720272 |         | 2113 E |   |   |   |   |   |   |   |   |   |
| 22 | 22 | 69           | 16         | 130720163 | 130720188 |         | 2197 D |   |   |   |   |   |   |   |   |   |
| 23 | 23 | 84           | 16         | 130720180 | 130720201 |         | 2084 D |   |   |   |   |   |   |   |   |   |
| 24 | 24 | 121          | 19         | 130720253 | 130720294 |         | 2091 E |   |   |   |   |   |   |   |   |   |
| 25 | 25 | 297          | 15         | 130720277 | 130720342 |         | 2043 B |   |   |   |   |   |   |   |   |   |
| 26 | 26 | 495          | 13         | 130720281 | 130720353 |         | 2032 E |   |   |   |   |   |   |   |   |   |
| 27 | 27 | 94           | 14         | 130720288 | 130720343 |         | 2042 E |   |   |   |   |   |   |   |   |   |
| 28 | 28 | 22           | 18         | 130720310 | 130720385 |         | 2020 C |   |   |   |   |   |   |   |   |   |
| 29 | 29 | 64           | 19         | 130720310 | 130720385 |         | 2000 B |   |   |   |   |   |   |   |   |   |
| 30 | 30 | 562          | 16         | 130720323 | 130720336 |         | 2049 B |   |   |   |   |   |   |   |   |   |
| 31 | 31 | 44           | 16         | 130720339 | 130720352 |         | 2033 A |   |   |   |   |   |   |   |   |   |
| 32 | 32 | 315          | 14         | 130720348 | 130720362 |         | 2023 B |   |   |   |   |   |   |   |   |   |
| 33 | 33 | 385          | 15         | 130720352 | 130720553 |         | 1932 E |   |   |   |   |   |   |   |   |   |
| 34 | 34 | 590          | 13         | 130720356 | 130720444 |         | 1941 B |   |   |   |   |   |   |   |   |   |
| 35 | 35 | 92           | 14         | 130720368 | 130720397 |         | 1988 B |   |   |   |   |   |   |   |   |   |
| 36 | 36 | 395          | 16         | 130720377 | 130720436 |         | 1959 D |   |   |   |   |   |   |   |   |   |
| 37 | 37 | 297          | 17         | 130720382 | 130720515 |         | 1970 E |   |   |   |   |   |   |   |   |   |
| 38 | 38 | 257          | 14         | 130720401 | 130720427 |         | 1948 C |   |   |   |   |   |   |   |   |   |
| 39 | 39 | 312          | 19         | 130720407 | 130720548 |         | 1837 D |   |   |   |   |   |   |   |   |   |
| 40 | 40 | 321          | 18         | 130720431 | 130720449 |         | 1936 A |   |   |   |   |   |   |   |   |   |
| 41 | 41 | 220          | 16         | 130720437 | 130720510 |         | 1874 A |   |   |   |   |   |   |   |   |   |

1. Each variable forms a column
2. Each observation forms a row
3. Each table/file stores data about one kind of observation (e.g. people/hospitals).

<http://vita.had.co.nz/papers/tidy-data.pdf>

[Leek, Taub, and Pineda 2011 PLoS One](#)

# Start with reshaping

```
library(reshape2)  
head(mtcars)
```



|                   | mpg  | cyl | disp | hp  | drat | wt    | qsec  | vs | am | gear | carb |
|-------------------|------|-----|------|-----|------|-------|-------|----|----|------|------|
| Mazda RX4         | 21.0 | 6   | 160  | 110 | 3.90 | 2.620 | 16.46 | 0  | 1  | 4    | 4    |
| Mazda RX4 Wag     | 21.0 | 6   | 160  | 110 | 3.90 | 2.875 | 17.02 | 0  | 1  | 4    | 4    |
| Datsun 710        | 22.8 | 4   | 108  | 93  | 3.85 | 2.320 | 18.61 | 1  | 1  | 4    | 1    |
| Hornet 4 Drive    | 21.4 | 6   | 258  | 110 | 3.08 | 3.215 | 19.44 | 1  | 0  | 3    | 1    |
| Hornet Sportabout | 18.7 | 8   | 360  | 175 | 3.15 | 3.440 | 17.02 | 0  | 0  | 3    | 2    |
| Valiant           | 18.1 | 6   | 225  | 105 | 2.76 | 3.460 | 20.22 | 1  | 0  | 3    | 1    |

# Melting data frames

```
mtcars$carname <- rownames(mtcars)
carMelt <- melt(mtcars,id=c("carname","gear","cyl"),measure.vars=c("mpg","hp"))
head(carMelt,n=3)
```



|   | carname       | gear | cyl | variable | value |
|---|---------------|------|-----|----------|-------|
| 1 | Mazda RX4     | 4    | 6   | mpg      | 21.0  |
| 2 | Mazda RX4 Wag | 4    | 6   | mpg      | 21.0  |
| 3 | Datsun 710    | 4    | 4   | mpg      | 22.8  |

```
tail(carMelt,n=3)
```

|    | carname       | gear | cyl | variable | value |
|----|---------------|------|-----|----------|-------|
| 62 | Ferrari Dino  | 5    | 6   | hp       | 175   |
| 63 | Maserati Bora | 5    | 8   | hp       | 335   |
| 64 | Volvo 142E    | 4    | 4   | hp       | 109   |

# Casting data frames

```
cylData <- dcast(carMelt, cyl ~ variable)
cylData
```



```
  cyl mpg hp
1    4  11 11
2    6   7  7
3    8  14 14
```

```
cylData <- dcast(carMelt, cyl ~ variable, mean)
cylData
```

```
  cyl   mpg    hp
1    4 26.66 82.64
2    6 19.74 122.29
3    8 15.10 209.21
```



# Averaging values

```
head(InsectSprays)
```

|   | count | spray |
|---|-------|-------|
| 1 | 10    | A     |
| 2 | 7     | A     |
| 3 | 20    | A     |
| 4 | 14    | A     |
| 5 | 14    | A     |
| 6 | 12    | A     |



```
tapply(InsectSprays$count, InsectSprays$spray, sum)
```

|  | A   | B   | C  | D  | E  | F   |
|--|-----|-----|----|----|----|-----|
|  | 174 | 184 | 25 | 59 | 42 | 200 |

# Another way - split

```
spIns = split(InsectSprays$count, InsectSprays$spray)
spIns
```

\$A

```
[1] 10 7 20 14 14 12 10 23 17 20 14 13
```

\$B

```
[1] 11 17 21 11 16 14 17 17 19 21 7 13
```

\$C

```
[1] 0 1 7 2 3 1 2 1 3 0 1 4
```

\$D

```
[1] 3 5 12 6 4 3 5 5 5 5 2 4
```

\$E

```
[1] 3 5 3 5 3 6 1 1 3 2 6 4
```

\$F

```
[1] 11 9 15 22 15 16 13 10 26 26 24 13
```

# Another way - apply

```
sprCount = lapply(spIns,sum)
sprCount
```

```
$A
[1] 174
```

```
$B
[1] 184
```

```
$C
[1] 25
```

```
$D
[1] 59
```

```
$E
[1] 42
```

```
$F
[1] 200
```



# Another way - combine

```
unlist(sprCount)
```



| A   | B   | C  | D  | E  | F   |
|-----|-----|----|----|----|-----|
| 174 | 184 | 25 | 59 | 42 | 200 |

```
sapply(spIns,sum)
```

| A   | B   | C  | D  | E  | F   |
|-----|-----|----|----|----|-----|
| 174 | 184 | 25 | 59 | 42 | 200 |

# Another way - plyr package

```
ddply(InsectSprays,.(spray),summarize,sum=sum(count))
```

|   | spray | sum |
|---|-------|-----|
| 1 | A     | 174 |
| 2 | B     | 184 |
| 3 | C     | 25  |
| 4 | D     | 59  |
| 5 | E     | 42  |
| 6 | F     | 200 |

# Creating a new variable

```
spraySums <- ddply(InsectSprays,.(spray),summarize,sum=ave(count,FUN=sum))  
dim(spraySums)
```

```
[1] 72 2
```

```
head(spraySums)
```

```
  spray sum  
1     A 174  
2     A 174  
3     A 174  
4     A 174  
5     A 174  
6     A 174
```

# More information

- A tutorial from the developer of plyr - <http://plyr.had.co.nz/09-user/>
- A nice reshape tutorial <http://www.slideshare.net/jeffreybreen/reshaping-data-in-r>
- A good plyr primer - <http://www.r-bloggers.com/a-quick-primer-on-split-apply-combine-problems/>
- See also the functions
  - acast - for casting as multi-dimensional arrays
  - arrange - for faster reordering without using order() commands
  - mutate - adding new variables