Tidyverse Webinar

Gapminder data

gapminder

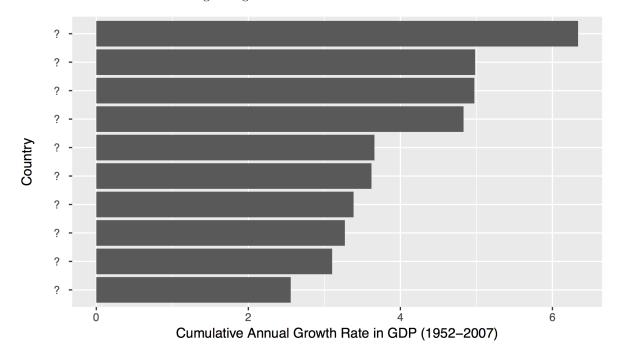
The gapminder data set contains demographic statistics popularized by Hans Rosling's TED talks.

```
library(gapminder)
gapminder
```

```
## # A tibble: 1,704 x 6
##
         country continent year lifeExp
                                              pop gdpPercap
##
           <fctr>
                    <fctr> <int>
                                   <dbl>
                                                      <dbl>
                                            <int>
   1 Afghanistan
##
                      Asia 1952
                                  28.801 8425333
                                                   779.4453
  2 Afghanistan
                      Asia 1957
                                  30.332
                                          9240934
                                                   820.8530
##
  3 Afghanistan
                      Asia 1962
                                  31.997 10267083
                                                   853.1007
##
  4 Afghanistan
                      Asia 1967
                                  34.020 11537966
                                                   836.1971
  5 Afghanistan
##
                      Asia 1972 36.088 13079460
                                                   739.9811
  6 Afghanistan
                                                   786.1134
##
                      Asia 1977
                                  38.438 14880372
   7 Afghanistan
                      Asia 1982
                                  39.854 12881816
                                                   978.0114
##
##
   8 Afghanistan
                      Asia 1987
                                 40.822 13867957
                                                   852.3959
  9 Afghanistan
                      Asia 1992 41.674 16317921
                                                   649.3414
## 10 Afghanistan
                      Asia 1997 41.763 22227415
                                                   635.3414
## # ... with 1,694 more rows
```

Goal

Which countries had the fastest growing GDP's between 1952 and 2007?



The Tidyverse

Functions

In R, you manipulate data by passing the data to functions.

```
round(1234.567, digits = 2)
## [1] 1234.57
nrow(gapminder)
## [1] 1704
```

The tidyverse is a collection of R packages that contain functions. You must load the packages to use the functions.

Load the Tidyverse

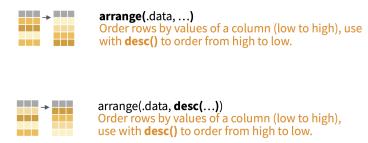
```
## install.packages("tidyverse")
library("tidyverse")
```

Tidy Tools

Tidyverse functions are designed to be:

- 1. Simple They do one thing, and they do it well
- 2. Composable They can be combined with other functions for multi-step operations

Which countries have the largest populations?



```
arrange(gapminder, desc(pop))
```

```
## # A tibble: 1,704 x 6
##
      country continent year lifeExp
                                              pop gdpPercap
##
       <fctr>
                 <fctr> <int>
                                 <dbl>
                                             <int>
                                                       <dbl>
##
        China
                   Asia 2007 72.96100 1318683096 4959.1149
   1
##
   2
        China
                   Asia 2002 72.02800 1280400000 3119.2809
##
   3
        China
                   Asia 1997 70.42600 1230075000 2289.2341
##
   4
        China
                   Asia 1992 68.69000 1164970000 1655.7842
                   Asia 2007 64.69800 1110396331 2452.2104
##
   5
        India
                   Asia 1987 67.27400 1084035000 1378.9040
##
   6
        China
```

```
##
        India
                   Asia 2002 62.87900 1034172547 1746.7695
##
   8
        China
                   Asia
                         1982 65.52500 1000281000
                                                  962.4214
                                        959000000 1458.8174
##
   9
        India
                         1997 61.76500
## 10
        China
                   Asia 1977 63.96736
                                        943455000 741.2375
  # ... with 1,694 more rows
```

Which countries had the largest population in 2007?

```
filter(.data, ...)
Extract rows that meet logical criteria.
```

```
gapminder2007 <- filter(gapminder, year == 2007)</pre>
arrange(gapminder2007, desc(pop))
## # A tibble: 142 x 6
                                                      pop gdpPercap
##
            country continent year lifeExp
##
                        <fctr> <int>
                                        <dbl>
             <fctr>
                                                    <int>
                                                               <dbl>
##
    1
               China
                          Asia
                                 2007
                                       72.961 1318683096
                                                           4959.115
```

```
##
    2
              India
                          Asia
                                2007
                                      64.698 1110396331
                                                          2452.210
##
    3 United States
                     Americas
                                2007
                                      78.242
                                               301139947 42951.653
##
    4
          Indonesia
                                2007
                                      70.650
                                               223547000
                                                          3540.652
                          Asia
##
    5
             Brazil
                     Americas
                                2007
                                      72.390
                                               190010647
                                                          9065.801
##
    6
                          Asia 2007
                                      65.483
                                                          2605.948
           Pakistan
                                               169270617
         Bangladesh
##
    7
                          Asia 2007
                                      64.062
                                               150448339
                                                          1391.254
##
    8
            Nigeria
                        Africa
                                2007
                                      46.859
                                               135031164
                                                          2013.977
##
    9
              Japan
                          Asia
                                2007
                                      82.603
                                               127467972 31656.068
                                      76.195
## 10
             Mexico
                     Americas
                                2007
                                              108700891 11977.575
```

... with 132 more rows

A better way

Use the pipe operator (%>%) to compose tidyverse functions.

```
gapminder %>%
filter(year == 2007) %>%
arrange(desc(pop))
```

```
## # A tibble: 142 x 6
##
                                                     pop gdpPercap
            country continent
                               year lifeExp
##
                        <fctr> <int>
                                        <dbl>
             <fctr>
                                                   <int>
                                                              <dbl>
##
    1
              China
                          Asia
                                2007
                                      72.961 1318683096
                                                          4959.115
##
    2
              India
                          Asia
                                2007
                                      64.698 1110396331
                                                          2452.210
##
    3 United States
                      Americas
                                2007
                                      78.242
                                               301139947 42951.653
                                               223547000
##
    4
          Indonesia
                                2007
                                      70.650
                                                          3540.652
                          Asia
##
    5
             Brazil
                      Americas
                                2007
                                      72.390
                                               190010647
                                                           9065.801
    6
##
           Pakistan
                          Asia 2007
                                      65.483
                                               169270617
                                                          2605.948
         Bangladesh
##
   7
                          Asia
                               2007
                                      64.062
                                               150448339
                                                          1391.254
##
    8
            Nigeria
                        Africa
                                2007
                                      46.859
                                               135031164
                                                          2013.977
    9
                                2007
                                      82.603
##
              Japan
                          Asia
                                               127467972 31656.068
                                2007
                                      76.195
                                               108700891 11977.575
## 10
                      Americas
             Mexico
## # ... with 132 more rows
```

Which countries had the largest life expectancy in 2007?



```
gapminder %>%
  filter(year == 2007) %>%
  arrange(desc(lifeExp)) %>%
  select(country, lifeExp)
## # A tibble: 142 x 2
##
               country lifeExp
##
                <fctr>
                          <dbl>
##
                        82.603
    1
                 Japan
##
    2 Hong Kong, China
                         82.208
##
               Iceland
                        81.757
    3
##
   4
           Switzerland 81.701
    5
             Australia
                        81.235
##
##
    6
                 Spain
                        80.941
##
   7
                        80.884
                Sweden
##
   8
                Israel
                        80.745
##
    9
                France
                        80.657
## 10
                Canada 80.653
## # ... with 132 more rows
```

What is the gdp of each country?



```
gapminder %>%
  mutate(gdp = pop * gdpPercap)
## # A tibble: 1,704 x 7
##
          country continent year lifeExp
                                               pop gdpPercap
                                                                     gdp
##
           <fctr>
                     <fctr> <int>
                                                       <dbl>
                                    <dbl>
                                             <int>
                                                                   <dbl>
##
   1 Afghanistan
                       Asia 1952
                                   28.801
                                           8425333
                                                    779.4453
                                                              6567086330
##
   2 Afghanistan
                       Asia 1957 30.332
                                           9240934
                                                    820.8530
                                                              7585448670
   3 Afghanistan
                       Asia 1962
                                   31.997 10267083
                                                    853.1007
                                                              8758855797
  4 Afghanistan
                                                    836.1971
##
                       Asia 1967
                                   34.020 11537966
                                                              9648014150
   5 Afghanistan
                       Asia 1972
                                   36.088 13079460
                                                    739.9811
                                                              9678553274
##
##
  6 Afghanistan
                       Asia 1977
                                   38.438 14880372
                                                    786.1134 11697659231
   7 Afghanistan
                       Asia 1982
                                   39.854 12881816
                                                    978.0114 12598563401
##
   8 Afghanistan
                       Asia
                            1987
                                   40.822 13867957
                                                    852.3959 11820990309
  9 Afghanistan
                            1992 41.674 16317921
                                                    649.3414 10595901589
                       Asia
                            1997 41.763 22227415
                                                    635.3414 14121995875
## 10 Afghanistan
                       Asia
## # ... with 1,694 more rows
```

What was the maximum gdp?

```
summarise(.data, ...)
Compute table of summaries. Use group_by()
to compute groupwise summaries.
```

What was the first gdp? The last gdp?

```
gapminder %>%
  mutate(gdp = pop * gdpPercap) %>%
  summarise(first_gdp = first(gdp), last_gdp = last(gdp))

## # A tibble: 1 x 2

## first_gdp last_gdp

## <dbl> <dbl>
## 1 6567086330 5782658337
```

What was the first and last gdp for each country?



```
gapminder %>%
  mutate(gdp = pop * gdpPercap) %>%
  group_by(country) %>%
  summarise(first_gdp = first(gdp), last_gdp = last(gdp))
## # A tibble: 142 x 3
##
          country
                     first_gdp
                                   last_gdp
##
           <fctr>
                         <dbl>
                                      <dbl>
##
   1 Afghanistan
                    6567086330 31079291949
##
   2
          Albania
                    2053669902 21376411360
##
   3
          Algeria 22725632678 207444851958
           Angola 14899557133 59583895818
##
   4
##
   5
        Argentina 105676319105 515033625357
##
   6
        Australia 87256254102 703658358894
##
   7
          Austria 42516266683 296229400691
```

```
## 8 Bahrain 1188460759 21112675360
## 9 Bangladesh 32082059995 209311822134
## 10 Belgium 72838686716 350141166520
## # ... with 132 more rows
```

What was the cumulative annual growth for each country between 1952 and 1957?

```
gapminder %>%
  mutate(gdp = pop * gdpPercap) %>%
  group_by(country) %>%
  summarise(gdp1952 = first(gdp), gdp2007 = last(gdp)) %>%
  mutate(cagr = ((gdp2007 / gdp1952) ^ (1/55) - 1) * 100) %>%
  arrange(desc(cagr)) %>%
  select(country, cagr)
## # A tibble: 142 x 2
##
                country
                            cagr
##
                 <fctr>
                           <dbl>
##
   1
              Singapore 8.348304
##
   2 Equatorial Guinea 8.346729
##
                   Oman 8.218950
  4
                 Taiwan 7.869795
##
##
   5
               Botswana 7.548170
##
   6
            Korea, Rep. 7.487215
##
   7 Hong Kong, China 7.064369
##
   8
               Thailand 6.384445
##
   9
                  Libya 6.372590
## 10
                  China 6.337334
## # ... with 132 more rows
```

Tidy data

Each tidyverse function expects and returns the same type of data: tidy data. A tabular data set is tidy iff:

- 1. Each variable is in its own column
- 2. Each observation is in its own row

Visualization

What did GDP growth look like?

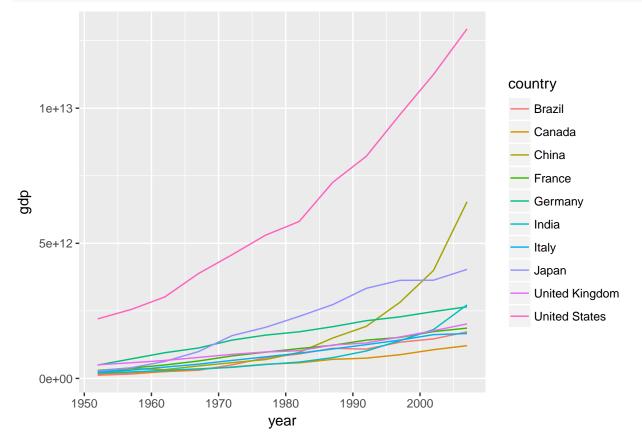
Let's focus on the 10 biggest economies (in 1952). What are they?

```
gapminder %>%
  filter(year == 1952) %>%
  mutate(gdp = pop * gdpPercap) %>%
  arrange(desc(gdp)) %>%
  select(country, gdp)
```

```
## # A tibble: 142 x 2
## country gdp
## <fctr> <dbl>## 1 United States 2.204242e+12
```

```
2 United Kingdom 5.032666e+11
             Germany 4.939866e+11
##
   3
              France 2.984834e+11
##
   4
##
               Japan 2.781349e+11
   5
##
    6
               Italy 2.350603e+11
##
   7
               China 2.227550e+11
##
               India 2.033225e+11
              Canada 1.680701e+11
   9
##
## 10
              Brazil 1.193716e+11
## # ... with 132 more rows
```

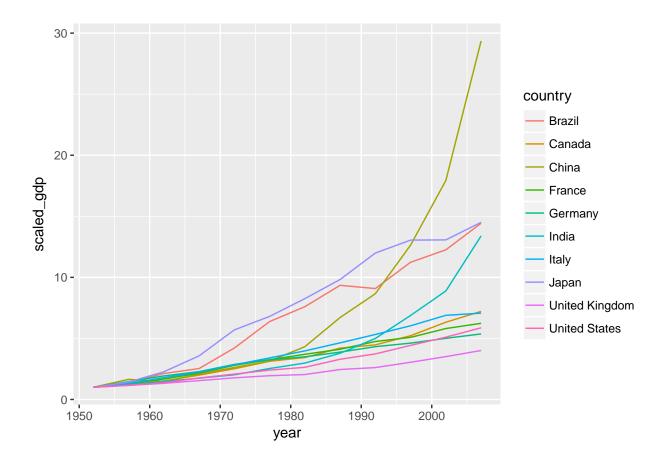
Visualize the Top 10



Scaled data

Let's scale the data within each country to make growth easier to compare

```
gapminder %>%
 filter(country %in% top_10) %>%
 mutate(gdp = pop * gdpPercap)
## # A tibble: 120 x 7
##
     country continent year lifeExp
                                          pop gdpPercap
                                                                 gdp
##
      <fctr>
                <fctr> <int>
                              <dbl>
                                        <int>
                                                  <dbl>
                                                               <dbl>
##
   1 Brazil Americas 1952 50.917
                                     56602560
                                               2108.944 1.193716e+11
##
  2 Brazil Americas 1957 53.285
                                     65551171
                                               2487.366 1.630498e+11
   3 Brazil Americas 1962 55.665
                                               3336.586 2.537119e+11
##
                                     76039390
##
  4 Brazil Americas 1967
                             57.632 88049823
                                               3429.864 3.019989e+11
## 5 Brazil Americas 1972 59.504 100840058 4985.711 5.027594e+11
  6 Brazil Americas 1977 61.489 114313951
                                              6660.119 7.613445e+11
##
  7 Brazil Americas 1982 63.336 128962939
                                               7030.836 9.067173e+11
## 8 Brazil Americas 1987 65.205 142938076
                                               7807.096 1.115931e+12
## 9 Brazil Americas 1992 67.057 155975974 6950.283 1.084077e+12
## 10 Brazil Americas 1997 69.388 168546719 7957.981 1.341292e+12
## # ... with 110 more rows
gapminder %>%
 filter(country %in% top_10) %>%
 mutate(gdp = pop * gdpPercap) %>%
 group_by(country) %>%
 mutate(scaled_gdp = gdp / first(gdp)) %>%
 ggplot() +
   geom_line(mapping = aes(x = year, y = scaled_gdp, color = country))
```

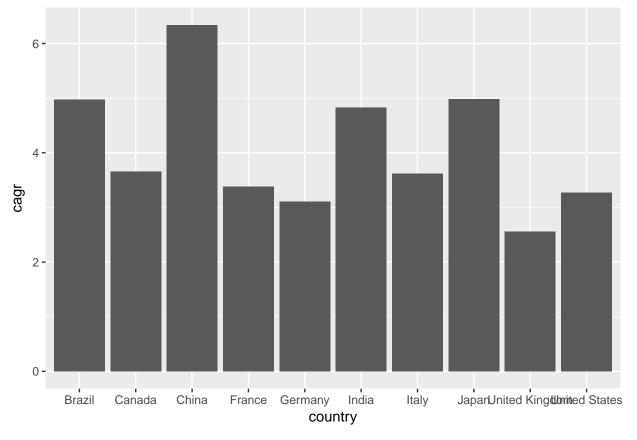


Cumulative Annual Growth Rates

```
gapminder %>%
  filter(country %in% top_10) %>%
  mutate(gdp = pop * gdpPercap) %>%
  group_by(country) %>%
  summarise(start = first(gdp), end = last(gdp)) %>%
  mutate(cagr = ((end/start) ^ (1 / 55) - 1) * 100) %>%
  arrange(desc(cagr)) %>%
  select(country, cagr)
```

```
## # A tibble: 10 x 2
##
             country
                          cagr
##
              <fctr>
                         <dbl>
               China 6.337334
##
    1
##
    2
               Japan 4.983258
              Brazil 4.973063
##
    3
##
               India 4.830628
    4
##
    5
              Canada 3.658473
##
    6
               Italy 3.619402
              France 3.383767
##
    7
       United States 3.269607
##
    8
##
    9
             Germany 3.101929
## 10 United Kingdom 2.557105
```

```
gapminder %>%
  filter(country %in% top_10) %>%
  mutate(gdp = pop * gdpPercap) %>%
  group_by(country) %>%
  summarise(start = first(gdp), end = last(gdp)) %>%
  mutate(cagr = ((end/start) ^ (1 / 55) - 1) * 100) %>%
  arrange(desc(cagr)) %>%
  select(country, cagr) %>%
  ggplot() +
  geom_col(mapping = aes(x = country, y = cagr))
```



${\bf Aspirational}$

```
library(forcats)

gapminder %>%
  filter(country %in% top_10) %>%
  mutate(gdp = pop * gdpPercap) %>%
  group_by(country) %>%
  summarise(start = first(gdp), end = last(gdp)) %>%
  mutate(cagr = ((end/start) ^ (1 / 55) - 1) * 100) %>%
  arrange(desc(cagr)) %>%
  ggplot() +
   geom_col(mapping = aes(x = fct_reorder(country, cagr), y = cagr)) +
   labs(x = "Country", y = "Cumulative Annual Growth Rate in GDP (1952-2007)") +
```

