DataCamp Tidyverse: Transforming and Visualising Data with R.

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Load Required Libraries

```
library(gapminder)

## Warning: package 'gapminder' was built under R version 3.5.2

library(dplyr)

## 
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':

## 
## filter, lag

## The following objects are masked from 'package:base':

## 
## intersect, setdiff, setequal, union
```

Gapminder Dataset

gapminder

```
## # A tibble: 1,704 x 6
##
               continent year lifeExp
      country
                                                  pop gdpPercap
      <fct>
                   <fct> <int>
                                      <dbl>
                                                <int>
                                                           <dbl>
## 1 Afghanistan Asia 1952 28.8 8425333
## 2 Afghanistan Asia 1957 30.3 9240934
## 3 Afghanistan Asia 1962 32.0 10267083
                                                            779.
                                                            821.
                                                            853.
## 4 Afghanistan Asia
                             1967
                                       34.0 11537966
                                                            836.
## 5 Afghanistan Asia
                             1972
                                       36.1 13079460
                                                            740.
                             1977
                                     38.4 14880372
## 6 Afghanistan Asia
                                                            786.
## 7 Afghanistan Asia
                             1982 39.9 12881816
                                                            978.
## 8 Afghanistan Asia
                             1987 40.8 13867957
                                                            852.
## 9 Afghanistan Asia
                               1992
                                       41.7 16317921
                                                            649.
## 10 Afghanistan Asia
                               1997
                                       41.8 22227415
                                                            635.
## # ... with 1,694 more rows
```

Pipes (Verb Usage)

Every time we use a verb, we need to implement a pipe %>% which will take whatever is before it, and feed it into the next step.

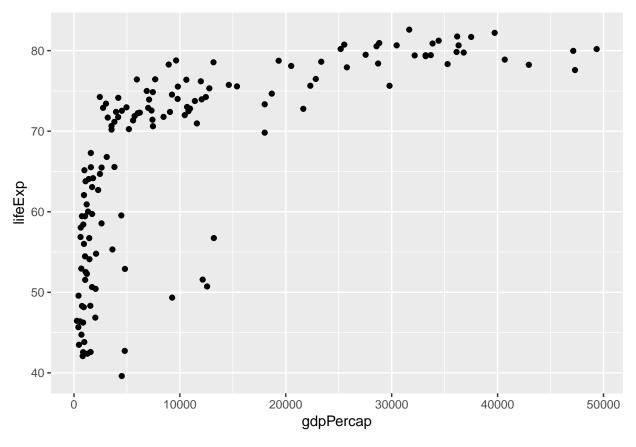
```
#Filtering
gapminder %>%
   filter(year == 2007)

## # A tibble: 142 x 6
## country continent year lifeExp pop gdpPercap
```

```
##
      <fct>
                  <fct>
                             <int>
                                     <dbl>
                                               <int>
                                                         <dbl>
## 1 Afghanistan Asia
                              2007
                                      43.8 31889923
                                                          975.
                                                         5937.
## 2 Albania
                  Europe
                             2007
                                      76.4
                                             3600523
## 3 Algeria
                  Africa
                             2007
                                      72.3 33333216
                                                         6223.
##
   4 Angola
                  Africa
                              2007
                                      42.7
                                            12420476
                                                         4797.
## 5 Argentina
                             2007
                                      75.3 40301927
                  Americas
                                                        12779.
  6 Australia
                                      81.2 20434176
                  Oceania
                             2007
                                                        34435.
                                      79.8
## 7 Austria
                  Europe
                              2007
                                             8199783
                                                        36126.
##
   8 Bahrain
                  Asia
                              2007
                                      75.6
                                              708573
                                                        29796.
                                      64.1 150448339
## 9 Bangladesh Asia
                             2007
                                                         1391.
## 10 Belgium
                  Europe
                              2007
                                      79.4 10392226
                                                        33693.
## # ... with 132 more rows
gapminder %>%
  filter(country == "United States", year == 2007)
## # A tibble: 1 x 6
##
     country
                   continent year lifeExp
                                                  pop gdpPercap
                                                           <dbl>
     <fct>
                   <fct>
                              <int>
                                      <dbl>
                                                <int>
                              2007
                                       78.2 301139947
## 1 United States Americas
                                                          42952.
#Arrange (ORDER BY)
gapminder %>%
  arrange(gdpPercap)
## # A tibble: 1,704 x 6
                                                     pop gdpPercap
##
      country
                       continent year lifeExp
##
      <fct>
                       <fct>
                                  <int>
                                          <dbl>
                                                   <int>
                                                              <dbl>
##
   1 Congo, Dem. Rep. Africa
                                   2002
                                           45.0 55379852
                                                               241.
##
   2 Congo, Dem. Rep. Africa
                                  2007
                                           46.5 64606759
                                                               278.
## 3 Lesotho
                                                               299.
                       Africa
                                  1952
                                           42.1
                                                  748747
## 4 Guinea-Bissau
                       Africa
                                  1952
                                           32.5
                                                  580653
                                                              300.
## 5 Congo, Dem. Rep. Africa
                                   1997
                                           42.6 47798986
                                                               312.
## 6 Eritrea
                                  1952
                                           35.9 1438760
                                                               329.
                       Africa
## 7 Myanmar
                       Asia
                                   1952
                                           36.3 20092996
                                                               331
## 8 Lesotho
                                   1957
                                           45.0
                                                               336.
                       Africa
                                                  813338
## 9 Burundi
                       Africa
                                   1952
                                           39.0 2445618
                                                               339.
## 10 Eritrea
                                           38.0 1542611
                                                               344.
                       Africa
                                   1957
## # ... with 1,694 more rows
gapminder %>%
  arrange(desc(gdpPercap))
## # A tibble: 1,704 x 6
                                             pop gdpPercap
##
                continent year lifeExp
      country
##
      <fct>
                <fct>
                          <int>
                                   <dbl>
                                           <int>
                                                     <dbl>
##
   1 Kuwait
                Asia
                                    58.0 212846
                           1957
                                                   113523.
##
  2 Kuwait
                Asia
                           1972
                                    67.7 841934
                                                   109348.
  3 Kuwait
                Asia
                           1952
                                    55.6 160000
                                                   108382.
## 4 Kuwait
                                    60.5 358266
                                                    95458.
                Asia
                           1962
## 5 Kuwait
                Asia
                           1967
                                    64.6 575003
                                                    80895.
## 6 Kuwait
                Asia
                           1977
                                    69.3 1140357
                                                    59265.
## 7 Norway
                Europe
                           2007
                                    80.2 4627926
                                                    49357.
## 8 Kuwait
                Asia
                           2007
                                   77.6 2505559
                                                    47307.
                           2007
                                    80.0 4553009
                                                    47143.
  9 Singapore Asia
## 10 Norway
                Europe
                           2002
                                   79.0 4535591
                                                    44684.
```

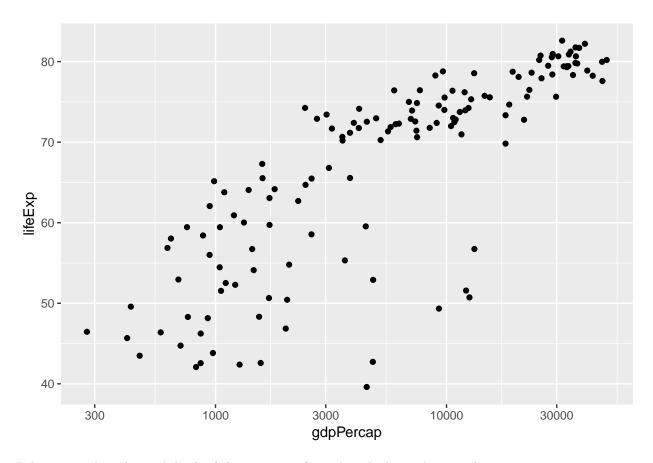
```
## # ... with 1,694 more rows
#Chaining Filter and Arrange
gapminder %>%
  filter(year == 2007) %>%
  arrange(desc(gdpPercap))
## # A tibble: 142 x 6
##
                        continent year lifeExp
      country
                                                       pop gdpPercap
##
      <fct>
                        <fct>
                                  <int>
                                           <dbl>
                                                     <int>
                                                               <dbl>
##
                                           80.2
                                                              49357.
   1 Norway
                                   2007
                                                   4627926
                        Europe
##
    2 Kuwait
                                   2007
                                           77.6
                                                   2505559
                                                              47307.
                        Asia
##
    3 Singapore
                        Asia
                                   2007
                                           80.0
                                                   4553009
                                                              47143.
   4 United States
                        Americas
                                   2007
                                           78.2 301139947
                                                              42952.
##
                                           78.9
    5 Ireland
                        Europe
                                   2007
                                                   4109086
                                                              40676.
                                           82.2
    6 Hong Kong, China Asia
                                   2007
                                                   6980412
                                                              39725.
##
   7 Switzerland
                                   2007
                                           81.7
                                                              37506.
                        Europe
                                                   7554661
  8 Netherlands
                        Europe
                                   2007
                                           79.8
                                                  16570613
                                                              36798.
## 9 Canada
                        Americas
                                   2007
                                           80.7
                                                  33390141
                                                              36319.
## 10 Iceland
                        Europe
                                   2007
                                           81.8
                                                    301931
                                                              36181.
## # ... with 132 more rows
#Mutate (Table calculations)
#Below we are finding the country with the highest GDP in 2007
gapminder %>%
 mutate(gdp = gdpPercap * pop) %>%
  filter(year == 2007) %>%
  arrange(desc(gdp))
## # A tibble: 142 x 7
##
      country
                      continent year lifeExp
                                                      pop gdpPercap
                                                                         gdp
##
      <fct>
                      <fct>
                                <int>
                                        <dbl>
                                                    <int>
                                                              <dbl>
                                                                       <dbl>
##
  1 United States
                                 2007
                                         78.2 301139947
                                                             42952. 1.29e13
                     Americas
##
    2 China
                      Asia
                                 2007
                                         73.0 1318683096
                                                              4959. 6.54e12
##
  3 Japan
                      Asia
                                 2007
                                         82.6 127467972
                                                             31656. 4.04e12
## 4 India
                                 2007
                                         64.7 1110396331
                                                              2452. 2.72e12
                      Asia
                                                             32170. 2.65e12
##
    5 Germany
                      Europe
                                 2007
                                         79.4
                                                 82400996
##
                                         79.4
                                                             33203. 2.02e12
  6 United Kingdom Europe
                                 2007
                                                 60776238
##
  7 France
                                 2007
                                         80.7
                                                 61083916
                                                             30470. 1.86e12
                     Europe
## 8 Brazil
                                         72.4 190010647
                                 2007
                                                              9066. 1.72e12
                      Americas
## 9 Italy
                      Europe
                                 2007
                                         80.5
                                                58147733
                                                             28570. 1.66e12
## 10 Mexico
                                 2007
                                                             11978. 1.30e12
                      Americas
                                         76.2 108700891
## # ... with 132 more rows
Data visualisation with ggplot2
gapminder2007 <- gapminder %>%
  filter(year == 2007)
gapminder2007
## # A tibble: 142 x 6
##
      country
                  continent year lifeExp
                                                  pop gdpPercap
##
      <fct>
                             <int>
                                     <dbl>
                                                          <dbl>
                   <fct>
                                                <int>
                                                           975.
##
                              2007
                                      43.8
                                            31889923
   1 Afghanistan Asia
    2 Albania
                  Europe
                              2007
                                      76.4
                                              3600523
                                                          5937.
```

```
2007
                                             33333216
                                                           6223.
##
    3 Algeria
                   Africa
                                       72.3
##
    4 Angola
                   Africa
                               2007
                                       42.7
                                             12420476
                                                           4797.
                                       75.3
##
    5 Argentina
                   Americas
                               2007
                                             40301927
                                                          12779.
                   Oceania
                               2007
                                                          34435.
##
    6 Australia
                                       81.2
                                             20434176
##
    7 Austria
                   Europe
                               2007
                                       79.8
                                               8199783
                                                          36126.
##
    8 Bahrain
                   Asia
                               2007
                                       75.6
                                                708573
                                                          29796.
    9 Bangladesh
                   Asia
                               2007
                                       64.1 150448339
                                                           1391.
##
## 10 Belgium
                               2007
                                       79.4
                                             10392226
                                                          33693.
                   Europe
## # ... with 132 more rows
library(ggplot2)
ggplot(gapminder2007, aes(x=gdpPercap, y=lifeExp)) + geom_point()
```



Due to the distribution of the points, it is logical to transform the scale of the plots using a log transformation as it will allow for better identification of plots on the lower left hand corner. The log transformation can be found below. The log transformation of the x axis displays a more linear relationship between the variables.

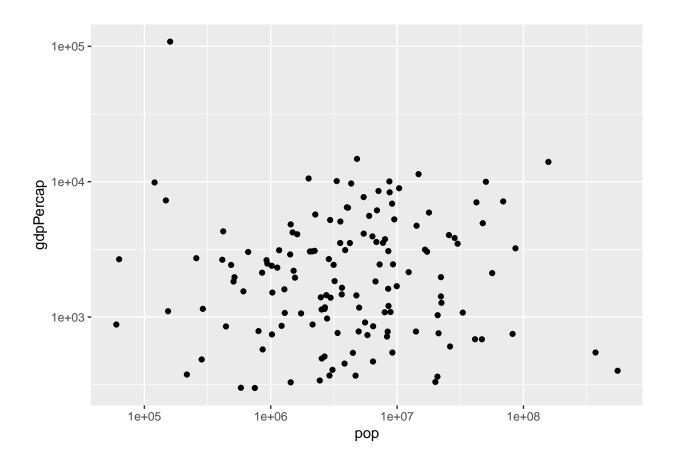
ggplot(gapminder2007, aes(x=gdpPercap, y=lifeExp)) + geom_point()+scale_x_log10()



Below is another plot with both of the axes transformed in the logarithmic scale.

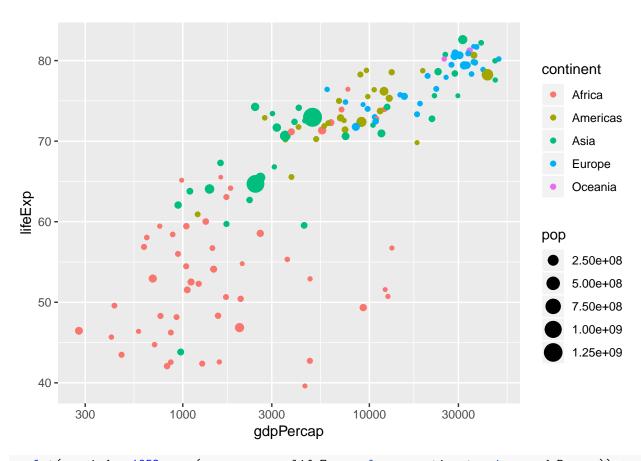
```
gapminder_1952 <- gapminder %>%
  filter(year == 1952)

# Scatter plot comparing pop and gdpPercap, with both axes on a log scale
ggplot(gapminder_1952, aes(x = pop, y = gdpPercap)) + geom_point() + scale_x_log10() + scale_y_log10()
```

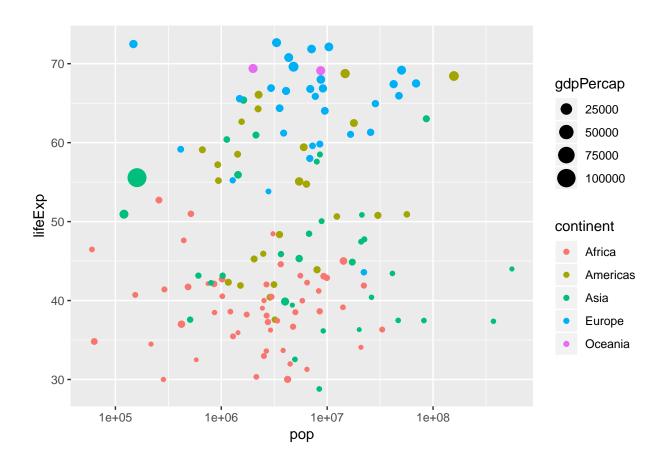


Adding other aesthetics to the plots

```
ggplot(gapminder2007, aes(x=gdpPercap, y=lifeExp, color = continent, size = pop)) + geom_point()+scale_
```



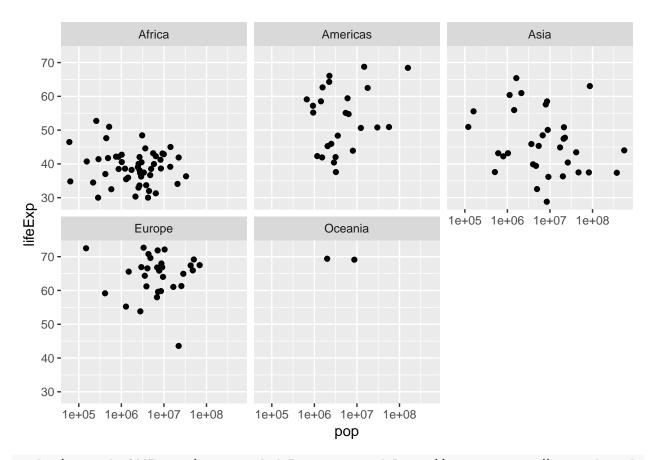
ggplot(gapminder_1952, aes(x = pop, y = lifeExp, color = continent, size = gdpPercap)) + geom_point()+s



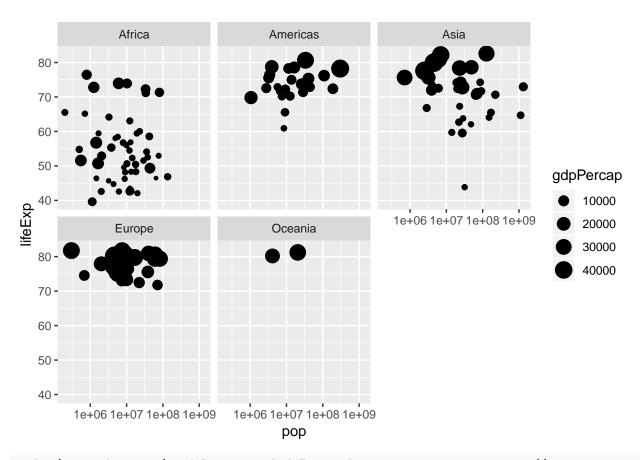
Faceting

Dividing the data into subplots

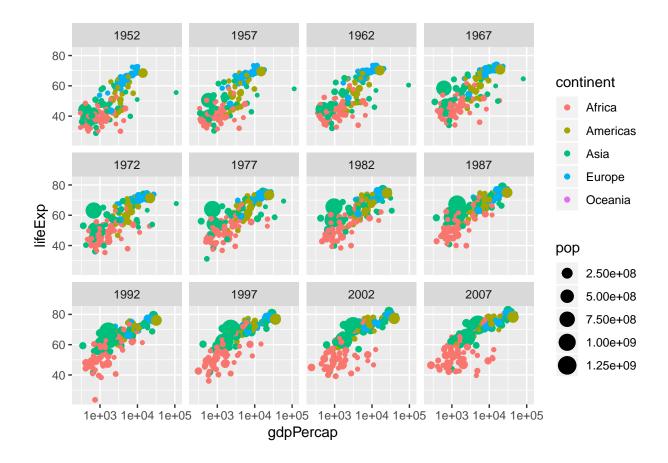
```
ggplot(gapminder_1952, aes(x = pop, y= lifeExp))+ geom_point() +scale_x_log10() + facet_wrap( ~ contine.
```



ggplot(gapminder2007, aes(x=pop, y=lifeExp, size = gdpPercap)) + geom_point() + scale_x_log10() + facet



ggplot(gapminder, aes(x=gdpPercap, y=lifeExp, color = continent, size = pop)) + geom_point() + scale_x_



Summarize Verb

How to summarise many observations into a single data point. This step is like performing aggregation of data.

```
gapminder %>%
  summarize(meanLifeExp = mean(lifeExp))
## # A tibble: 1 x 1
     meanLifeExp
##
##
           <dbl>
## 1
            59.5
gapminder %>%
  filter(year == 2007) %>%
  summarize(meanLifeExp = mean(lifeExp), totalPop = sum(as.numeric(pop)))
## # A tibble: 1 x 2
##
     meanLifeExp
                    totalPop
##
                       <dbl>
           <dbl>
## 1
            67.0 6251013179
```

Group by verb

The group by verb must be used before the summarize verb.

```
gapminder %>%
group_by(year, continent) %>%
```

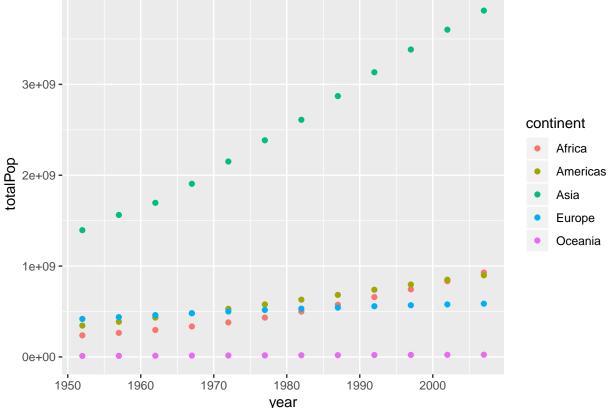
```
summarize(meanLifeExp = mean(lifeExp), totalPop = sum(as.numeric(pop)))
## # A tibble: 60 x 4
## # Groups: year [?]
##
      year continent meanLifeExp
                                   totalPop
##
      <int> <fct>
                        <dbl>
                                      <dbl>
   1 1952 Africa
##
                            39.1 237640501
## 2 1952 Americas
                           53.3 345152446
## 3 1952 Asia
                           46.3 1395357351
## 4 1952 Europe
                            64.4 418120846
## 5 1952 Oceania
                            69.3
                                  10686006
## 6 1957 Africa
                            41.3 264837738
## 7 1957 Americas
                            56.0 386953916
## 8 1957 Asia
                            49.3 1562780599
## 9 1957 Europe
                            66.7 437890351
## 10 1957 Oceania
                            70.3 11941976
## # ... with 50 more rows
gapminder %>%
filter(year == 1957) %>%
group_by(continent) %>%
summarize(medianLifeExp = median(lifeExp), maxGdpPercap = max(gdpPercap))
## # A tibble: 5 x 3
##
    continent medianLifeExp maxGdpPercap
##
    <fct>
                      <dbl>
## 1 Africa
                       40.6
                                   5487.
## 2 Americas
                       56.1
                                  14847.
## 3 Asia
                       48.3
                                 113523.
## 4 Europe
                       67.6
                                 17909.
## 5 Oceania
                       70.3
                                  12247.
gapminder %>%
group_by(continent, year) %>%
summarize(medianLifeExp = median(lifeExp), maxGdpPercap = max(gdpPercap))
## # A tibble: 60 x 4
## # Groups:
              continent [?]
##
     continent year medianLifeExp maxGdpPercap
##
     <fct>
               <int>
                             <dbl>
                                          <dbl>
## 1 Africa
                1952
                              38.8
                                          4725.
## 2 Africa
                1957
                              40.6
                                          5487.
## 3 Africa
                1962
                              42.6
                                          6757.
## 4 Africa
                1967
                              44.7
                                         18773.
                              47.0
## 5 Africa
               1972
                                         21011.
## 6 Africa
                1977
                              49.3
                                         21951.
## 7 Africa
                1982
                              50.8
                                         17364.
## 8 Africa
                1987
                              51.6
                                         11864.
## 9 Africa
                              52.4
                1992
                                         13522.
## 10 Africa
                1997
                              52.8
                                         14723.
## # ... with 50 more rows
```

Plotting summarized data

Basically save the summarized data in a variable and utilise ggplot for visualisation. If you group by more than one variable you can use the colour aesthetic to show trends across each category.

```
by_year_continent <- gapminder %>%
  group_by(year,continent)%>%
  summarize(totalPop = sum(as.numeric(pop)), meanLifeExp = mean(lifeExp))
by_year_continent
## # A tibble: 60 x 4
  # Groups:
               year [?]
##
       year continent
                        totalPop meanLifeExp
##
      <int> <fct>
                            <dbl>
                                        <dbl>
##
    1 1952 Africa
                       237640501
                                         39.1
    2 1952 Americas
                                         53.3
##
                       345152446
    3 1952 Asia
                      1395357351
                                         46.3
##
##
    4
       1952 Europe
                       418120846
                                         64.4
                                         69.3
##
    5
       1952 Oceania
                        10686006
##
      1957 Africa
                       264837738
                                         41.3
       1957 Americas
                       386953916
                                         56.0
##
    7
##
       1957 Asia
                       1562780599
                                         49.3
##
    9
      1957 Europe
                       437890351
                                         66.7
## 10 1957 Oceania
                        11941976
                                         70.3
## # ... with 50 more rows
```

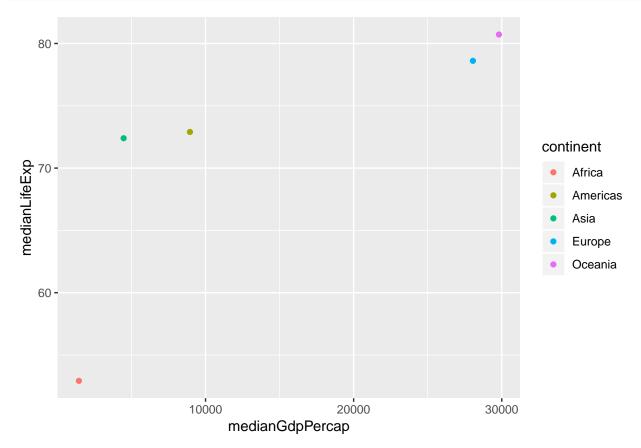




```
# expand limits makes the yaxis start at zero!

# Summarize the median GDP and median life expectancy per continent in 2007
by_continent_2007 <- gapminder %>%
group_by(continent) %>%
filter(year==2007)%>%
summarize(medianLifeExp = median(lifeExp), medianGdpPercap = median(gdpPercap))

# Use a scatter plot to compare the median GDP and median life expectancy
ggplot(by_continent_2007, aes(x=medianGdpPercap, y=medianLifeExp, color=continent)) + geom_point()
```



Line Plots

Line plots are used to visualise trends over time.

```
by_year_continent <- gapminder %>%
  group_by(year,continent)%>%
  summarize(totalPop = sum(as.numeric(pop)), meanLifeExp = mean(lifeExp))

by_year_continent

## # A tibble: 60 x 4

## # Groups: year [?]

## year continent totalPop meanLifeExp

## <int> <fct> <dbl> <dbl>
```

```
1 1952 Africa
                        237640501
                                          39.1
    2 1952 Americas 345152446
                                          53.3
##
   3 1952 Asia
                      1395357351
                                         46.3
##
   4 1952 Europe
                       418120846
                                         64.4
##
    5 1952 Oceania
##
                         10686006
                                         69.3
##
   6 1957 Africa
                        264837738
                                         41.3
##
   7 1957 Americas
                        386953916
                                         56.0
   8 1957 Asia
                                         49.3
                      1562780599
##
## 9 1957 Europe
                        437890351
                                          66.7
## 10 1957 Oceania
                        11941976
                                         70.3
## # ... with 50 more rows
ggplot(by_year_continent, aes(x = year, y = totalPop,color = continent)) + geom_line() + expand_limits()
   4e+09 -
   3e+09 -
                                                                               continent
                                                                                   Africa
totalPop

<sub>5e+09</sub> -
                                                                                    Americas
                                                                                    Asia
                                                                                    Europe
                                                                                    Oceania
   1e+09 -
   0e+00 -
                   1960
                              1970
                                         1980
                                                    1990
                                                               2000
        1950
                                        year
# Summarize the median gdpPercap by year & continent, save as by\_year\_continent
by_year_continent <- gapminder %>%
group_by(year,continent) %>%
summarize(medianGdpPercap = median(gdpPercap))
by_year_continent
## # A tibble: 60 x 3
## # Groups:
               year [?]
##
       year continent medianGdpPercap
##
      <int> <fct>
                                 <dbl>
   1 1952 Africa
                                  987.
##
  2 1952 Americas
                                 3048.
```

```
3 1952 Asia
                                  1207.
##
                                  5142.
##
       1952 Europe
       1952 Oceania
##
                                 10298.
       1957 Africa
                                  1024.
##
##
       1957 Americas
                                  3781.
##
      1957 Asia
                                  1548.
##
    9 1957 Europe
                                  6067.
## 10 1957 Oceania
                                 11599.
## # ... with 50 more rows
# Create a line plot showing the change in medianGdpPercap by continent over time
ggplot(by_year_continent, aes(x=year,y=medianGdpPercap, color = continent)) + geom_line() + expand_limi
   30000 -
                                                                                  continent
   20000 -
medianGdpPercap
                                                                                      Africa
                                                                                      Americas
                                                                                      Asia
                                                                                      Europe
   10000 -
                                                                                      Oceania
```

Bar plot

0 -

1950

In the bar plot, the x axis is the categorical variable, and the y axis is the numerical.

1970

1960

```
# Summarize the median gdpPercap by year and continent in 1952
by_continent <- gapminder %>%
filter(year == 1952) %>%
group_by(continent) %>%
summarize(medianGdpPercap = median(gdpPercap))

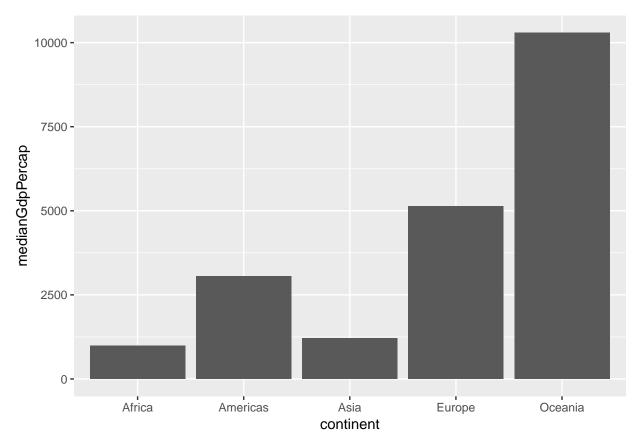
# Create a bar plot showing medianGdp by continent
ggplot(by_continent, aes(x= continent, y=medianGdpPercap)) + geom_col()
```

1980

year

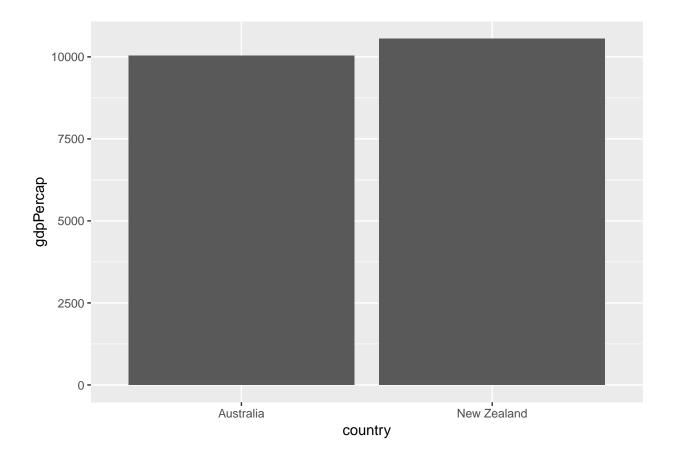
1990

2000



```
# Summarize the median gdpPercap by year and continent in 1952
# Filter for observations in the Oceania continent in 1952
oceania_1952 <- gapminder %>%
filter(continent == "Oceania", year == 1952)

# Create a bar plot of gdpPercap by country
ggplot(oceania_1952, aes(x = country, y = gdpPercap)) + geom_col()
```



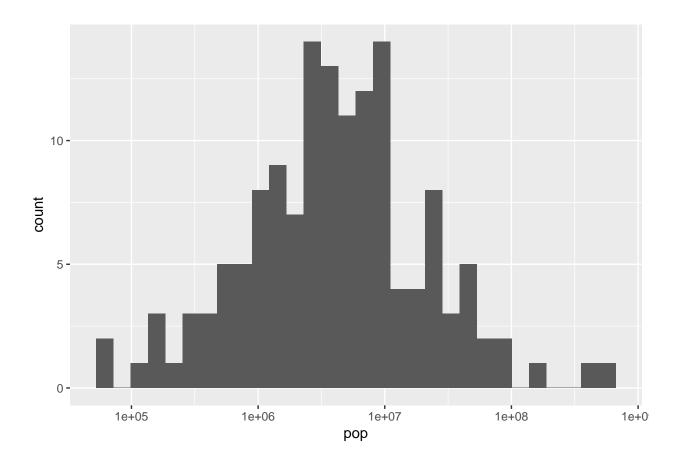
Histograms

Historgrams are used to show the distribution of a single variable, thus only takes one aesthetic in the x axis. Bin widths are chosen automatically but can be customised within the geom parameter by the following command: $geom_histogram(binwidth = 5)$.

```
gapminder_1952 <- gapminder %>%
  filter(year == 1952)

# Create a histogram of population (pop)
ggplot(gapminder_1952, aes(x = pop)) + geom_histogram() + scale_x_log10()
```

`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.



Boxplots

Used to compare the distribution of variables across categories. X is the categorical variable, and y is the value that we are trying to interpret.

```
# Create a boxplot comparing gdpPercap among continents
ggplot(gapminder_1952, aes(x = continent, y = gdpPercap)) + geom_boxplot() + scale_y_log10() + ggtitle(
```

Comparing GDP per capita across continents

