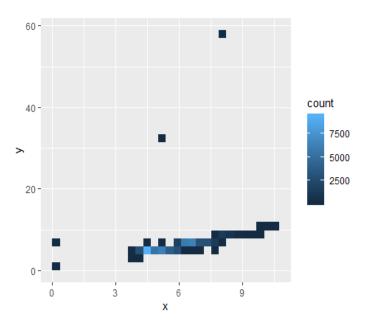
chapter10: Data Transformation

```
library(ggplot2)
library(gridExtra)
library(dplyr)
##
## Attaching package: 'dplyr'
## The following object is masked from 'package:gridExtra':
##
##
       combine
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
```

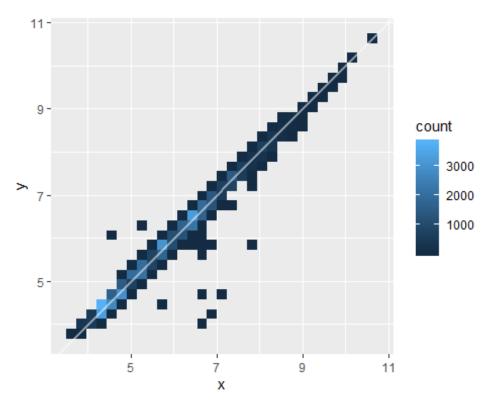
10.1 Introduction

10.2 Filter observations

```
ggplot(diamonds, aes(x, y)) +
  geom_bin2d()
```



```
filter(diamonds, x==0 | y == 0)
## # A tibble: 8 x 10
##
     carat cut
                     color clarity depth table price
                                                           Х
                     <ord> <ord>
                                    <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
##
     <dbl> <ord>
## 1
     1.07 Ideal
                           SI2
                                     61.6
                                             56
                                                4954
                                                              6.62
                           VS2
                                                                       0
## 2 1
           Very Good H
                                     63.3
                                             53
                                                 5139
                                                              0
                                     57.5
                                                                       0
     1.14 Fair
                     G
                           VS1
                                             67 6381
                                                              0
## 3
## 4 1.56 Ideal
                     G
                           VS2
                                     62.2
                                             54 12800
                                                             0
                                                                       0
## 5 1.2 Premium
                     D
                           VVS1
                                     62.1
                                             59 15686
                                                          0 0
                                                                       0
## 6 2.25 Premium
                     Н
                           SI2
                                     62.8
                                             59 18034
                                                          0
                                                             0
                                                                       0
## 7 0.71 Good
                     F
                           SI2
                                     64.1
                                                 2130
                                                          0
                                                             0
                                                                       0
                                             60
## 8 0.71 Good
                     F
                           SI2
                                     64.1
                                             60
                                                 2130
                                                           0
                                                                       0
diamonds_ok <- filter(diamonds, x > 0, y > 0, y < 20)
ggplot(diamonds_ok, aes(x, y)) +
  geom_bin2d() +
 geom_abline(slope = 1, colour = "white", size = 1, alpha = 0.5)
```



10.2.1 Useful Tools

- first argument to *filter()* is a data frame.
- second and subsequent arguments must be logical vectors.
- : filter() selects every row where all the logical expressions are TRUE!!

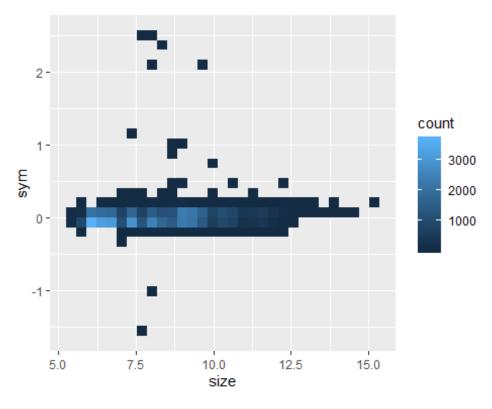
10.2.2 Missing Values

- in *filter()*, *NA* values are automatically dropped.

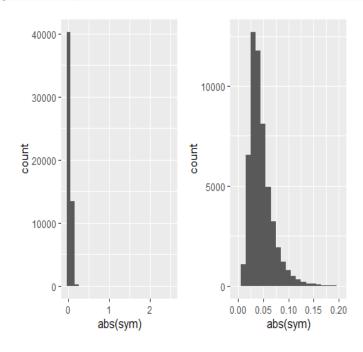
```
x <- c(1, NA, 2)
is.na(x)
## [1] FALSE TRUE FALSE
```

10.3 Create New Variables

```
diamonds_ok2 <- mutate(diamonds_ok,</pre>
      sym = x - y,
      size = sqrt(x ^ 2 + y ^ 2)
diamonds_ok2
## # A tibble: 53,930 x 12
                  carat cut color clarity depth table price
                                                                                                                                                                Х
                                                                                                                                                                                            У
                                                                                                                                                                                                                                      sym
      size
##
                  <dbl> <ord> 
                                                                                                      <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
                                                                                                                                                                                                                                <dbl>
   <dbl>
## 1 0.23 Ideal E
                                                                             SI2
                                                                                                         61.5
                                                                                                                                  55
                                                                                                                                                  326 3.95 3.98 2.43 -0.0300
      5.61
## 2 0.21 Premi... E
                                                                             SI1
                                                                                                         59.8
                                                                                                                                  61
                                                                                                                                                  326 3.89
                                                                                                                                                                                    3.84 2.31 0.05
      5.47
## 3 0.23 Good
                                                          Ε
                                                                             VS1
                                                                                                         56.9
                                                                                                                                  65
                                                                                                                                                  327 4.05 4.07 2.31 -0.02
      5.74
                                                                             VS2
                                                                                                                                                  334 4.2
                                                                                                                                                                                    4.23 2.63 -0.03
## 4 0.290 Premi... I
                                                                                                         62.4
                                                                                                                                  58
      5.96
## 5 0.31 Good
                                                                             SI2
                                                                                                         63.3
                                                                                                                                  58
                                                                                                                                                  335 4.34 4.35 2.75 -0.01000
                                                          J
      6.14
                                                                                                                                                  336 3.94 3.96 2.48 -0.02
## 6 0.24 Very ... J
                                                                            VVS2
                                                                                                         62.8
                                                                                                                                  57
      5.59
## 7 0.24 Very ... I
                                                                             VVS1
                                                                                                         62.3
                                                                                                                                  57
                                                                                                                                                  336 3.95
                                                                                                                                                                                    3.98 2.47 -0.0300
      5.61
                                                                                                                                  55
                                                                                                                                                  337 4.07 4.11
## 8 0.26 Very ... H
                                                                             SI1
                                                                                                         61.9
                                                                                                                                                                                                    2.53 -0.04
      5.78
## 9 0.22 Fair E
                                                                             VS2
                                                                                                         65.1
                                                                                                                                  61
                                                                                                                                                  337 3.87
                                                                                                                                                                                    3.78 2.49 0.09
     5.41
## 10 0.23 Very ... H
                                                                             VS1
                                                                                                         59.4
                                                                                                                                  61
                                                                                                                                                                                    4.05 2.39 -0.0500
                                                                                                                                                  338 4
## # ... with 53,920 more rows
ggplot(diamonds_ok2, aes(size, sym)) +
stat bin2d()
```



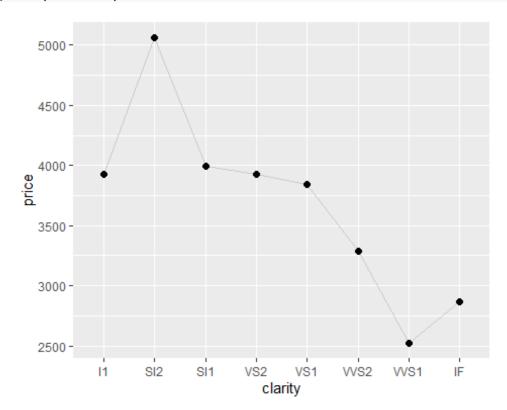
```
g1 = ggplot(diamonds_ok2, aes(abs(sym))) +
    geom_histogram(binwidth = 0.10)
diamonds_ok3 <- filter(diamonds_ok2, abs(sym) < 0.20)
g2 = ggplot(diamonds_ok3, aes(abs(sym))) +
    geom_histogram(binwidth = 0.01)
grid.arrange(g1,g2,ncol=2)</pre>
```



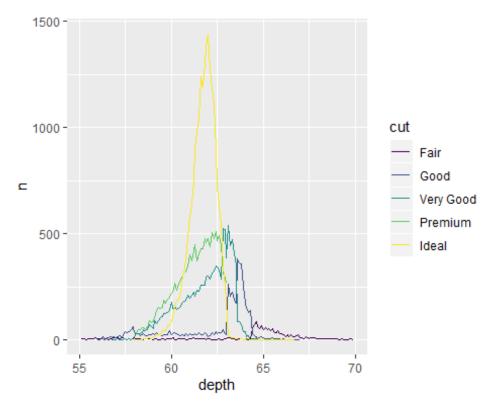
10.4 Group-wise Summaries

dplyr does summaries in two steps: 1. Define the grouping variables with *group by()* 2. Describe how to summarise each group with a single row with *summarise()*

```
by_clarity <- group_by(diamonds, clarity)</pre>
sum_clarity <- summarise(by_clarity, price = mean(price))</pre>
head(sum_clarity)
## # A tibble: 6 x 2
##
     clarity price
     <ord>
             <dbl>
##
## 1 I1
             3924.
## 2 SI2
             5063.
## 3 SI1
             3996.
## 4 VS2
             3925.
## 5 VS1
             3839.
## 6 VVS2
             3284.
ggplot(sum_clarity, aes(clarity, price)) +
  geom_line(aes(group = 1), colour = "grey80") +
  geom_point(size = 2)
```



```
cut_depth <- summarise(group_by(diamonds, cut, depth), n = n())</pre>
cut_depth <- filter(cut_depth, depth > 55, depth < 70)</pre>
head(cut_depth)
## # A tibble: 6 x 3
## # Groups:
               cut [1]
##
     cut
           depth
##
     <ord> <dbl> <int>
## 1 Fair
            55.1
                      3
## 2 Fair
            55.2
                      6
## 3 Fair
            55.3
                      5
## 4 Fair
            55.4
                      2
## 5 Fair
                      3
            55.5
## 6 Fair
            55.6
                      4
ggplot(cut_depth, aes(depth, n, colour = cut)) +
geom_line()
```



10.4.1 Useful Tools

summarise() needs to be used with functions that take a vector of n values and always return a single value - Counts: n(), n distinct(x) - Middle: mean(x), median(x) - Spread: sd(x), mad(x), IQR(x) - Extremes: quartile(x), min(x), max(x) - Positions: first(x), last(x), nth(x, 2)

10.4.2 Statistical Considerations

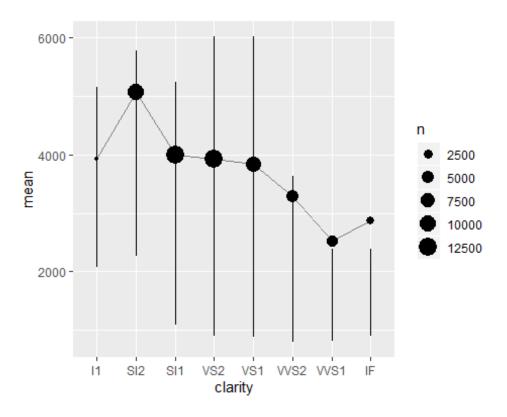
The following example extends our previous summary of the average price by clarity to also include the number of observations in each group, and the upper and lower quartiles. It suggests the mean might be a bad summary for this data - the distributions of price are so highly skewed that the mean is higher than the upper quartile for some of the groups!

```
by clarity = diamonds %>%
  group by(clarity) %>%
  summarise(
    n = n(),
    mean = mean(price),
    lq = quantile(price, 0.25),
    uq = quantile(price, 0.75)
  )
by_clarity
## # A tibble: 8 x 5
     clarity n mean
                               lq
     <ord> <int> <dbl> <dbl> <dbl>
##
## 1 I1
              741 3924. 2080 5161
             9194 5063. 2264
## 2 SI2
                                  5777.
## 2 SI2 9194 5063. 2264 5777.

## 3 SI1 13065 3996. 1089 5250

## 4 VS2 12258 3925. 900 6024.

## 5 VS1 8171 3839. 876 6023
             5066 3284. 794. 3638.
## 6 VVS2
## 7 VVS1
             3655 2523. 816 2379
## 8 IF
             1790 2865. 895 2388.
ggplot(by clarity, aes(clarity, mean)) +
  geom_linerange(aes(ymin = lq, ymax = uq)) +
  geom_line(aes(group = 1), colour = "grey50") +
  geom point(aes(size = n))
```



10.5 Transformation Pipelines

```
cut_depth <- group_by(diamonds, cut, depth)
cut_depth <- summarise(cut_depth, n = n())
cut_depth <- filter(cut_depth, depth > 55, depth < 70)
cut_depth <- mutate(cut_depth, prop = n / sum(n))</pre>
```

Alternative approach with the pipe %>%!!

```
cut_depth <- diamonds %>%
  group_by(cut, depth) %>%
  summarise(n = n()) %>%
  filter(depth > 55, depth < 70) %>%
  mutate(prop = n / sum(n))
```