

Um breve tutorial sobre dplyr com ggplot2

true

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Capítulo 1

Introdução

Palestra do *XIV Programa de Verão DES-ICET/UFLA - 2023*

1.1 Alguns atalhos no Rstudio

Para considerar

Operador Pipe ($\%>\%$): Ctrl + Shift + M (Windows) ou Cmd + Shift + M (Mac).

Criar novos chunks: Ctrl + Alt + I (Windows) ou Cmd + Option + I (Mac).

1.2 Carrega pacotes a serem usados

```
#install.packages("tidyverse")
#install.packages("dplyr")
#install.packages("tidyr")
#install.packages("ggplot2")

# Manipulação de dados
library(dplyr)

# Visualização de gráficos
library(ggplot2)
```

```
library(gridExtra)
library(patchwork)
library(plotly)
library(esquisse)

# Para dados gráfico de perfis
library(nlme)
```

1.3 Descrição dos dados mpg

Dados de economia de combustível de 1999 a 2008 para *38 modelos populares de carros*. Este conjunto de dados contém um subconjunto dos dados de economia de combustível que a EPA disponibiliza em <https://fuelconomy.gov/>. Ele contém apenas modelos que tiveram um novo lançamento a cada ano entre 1999 e 2008 - isso foi usado como um substituto para a popularidade do carro. Um *data frame* com 234 linhas e 11 variáveis:

- *manufacturer* nome do fabricante
- *model* nome do modelo
- *displ* cilindrada do motor, em litros
- *year* ano de fabricação
- *cyl* número de cilindros
- *trans* tipo de transmissão
- *drv* o tipo de trem de força, onde **f** = **tração dianteira**, **r** = **tração traseira** e **4** = **4wd**
- *cty* milhas urbanas por galão
- *hwy* milhas rodoviárias por galão
- *fl* tipo de combustível
- *class* “tipo” de carro

```
#help("mpg")
dados <- mpg
glimpse(dados)
```

```
## Rows: 234
## Columns: 11
## $ manufacturer <chr> "audi", "audi", "audi", "audi", "audi", "audi", "audi", "~
## $ model        <chr> "a4", "a4", "a4", "a4", "a4", "a4", "a4", "a4 quattro", "~
## $ displ        <dbl> 1.8, 1.8, 2.0, 2.0, 2.8, 2.8, 3.1, 1.8, 1.8, 2.0, 2.0, 2.~
## $ year         <int> 1999, 1999, 2008, 2008, 1999, 1999, 2008, 1999, 1999, 200~
## $ cyl          <int> 4, 4, 4, 4, 6, 6, 6, 4, 4, 4, 4, 6, 6, 6, 6, 6, 8, 8, ~
## $ trans        <chr> "auto(l5)", "manual(m5)", "manual(m6)", "auto(av)", "auto~
## $ drv          <chr> "f", "f", "f", "f", "f", "f", "f", "4", "4", "4", "4", "4~
## $ cty          <int> 18, 21, 20, 21, 16, 18, 18, 18, 16, 20, 19, 15, 17, 17, 1~
## $ hwy          <int> 29, 29, 31, 30, 26, 26, 27, 26, 25, 28, 27, 25, 25, 25, 2~
## $ fl           <chr> "p", "p", "p", "p", "p", "p", "p", "p", "p", "p", "p", "p~
## $ class        <chr> "compact", "compact", "compact", "compact", "compact", "c~
```

```
dados <- mutate(.data = dados,
                 across(where(is.character),
                        as.factor))

#View(df)
glimpse(dados)
```

```
## Rows: 234
## Columns: 11
## $ manufacturer <fct> audi, audi, audi, audi, audi, audi, audi, audi, audi, aud~
## $ model        <fct> a4, a4, a4, a4, a4, a4, a4, a4 quattro, a4 quattro, a4 qu~
## $ displ        <dbl> 1.8, 1.8, 2.0, 2.0, 2.8, 2.8, 3.1, 1.8, 1.8, 2.0, 2.0, 2.~
## $ year         <int> 1999, 1999, 2008, 2008, 1999, 1999, 2008, 1999, 1999, 200~
## $ cyl          <int> 4, 4, 4, 4, 6, 6, 6, 4, 4, 4, 4, 6, 6, 6, 6, 6, 8, 8, ~
## $ trans        <fct> auto(l5), manual(m5), manual(m6), auto(av), auto(l5), man~
## $ drv          <fct> f, f, f, f, f, f, f, 4, 4, 4, 4, 4, 4, 4, 4, 4, 4, 4, r, ~
## $ cty          <int> 18, 21, 20, 21, 16, 18, 18, 18, 16, 20, 19, 15, 17, 17, 1~
## $ hwy          <int> 29, 29, 31, 30, 26, 26, 27, 26, 25, 28, 27, 25, 25, 25, 2~
## $ fl           <fct> p, p, p, p, p, p, p, p, p, p, p, p, p, p, p, p, p, p, r, ~
## $ class        <fct> compact, compact, compact, compact, compact, compact, com~
```

1.4 Propaganda 1 (Gustavo Jun Yakushiji)

Assistir os 3 vídeos do **Gustavo Jun Yakushiji** e **Cristian Villegas** no *youtube*

Dia 1 Introdução à Ciência de Dados (Introdução ao R e importação de dados)

Dia 2 Introdução à Ciência de Dados (Introdução ao ggplot2)

Dia 3 Introdução à Ciência de Dados (Introdução ao Tidyverse)

1.5 Propaganda 2 (Gustavo Jun Yakushiji)

Introdução à Ciência de Dados em R, Gustavo Jun Yakushiji; Cristian Villegas

1.6 Propaganda 3

Como pegar o código fonte do meu github? [Link do meu github](#)

Como pegar o arquivo PDF da apresentação? [link](#): Um breve tutorial sobre dplyr com ggplot2 ou [Arquivo PDF](#)

Capítulo 2

dplyr (60 minutos)

2.1 Lista de funções do pacote dplyr

```
ls("package:dplyr")
```

## [1] "%>%"	"across"	"add_count"
## [4] "add_count_"	"add_row"	"add_rownames"
## [7] "add_tally"	"add_tally_"	"all_equal"
## [10] "all_of"	"all_vars"	"anti_join"
## [13] "any_of"	"any_vars"	"arrange"
## [16] "arrange_"	"arrange_all"	"arrange_at"
## [19] "arrange_if"	"as.tbl"	"as_data_frame"
## [22] "as_label"	"as_tibble"	"auto_copy"
## [25] "band_instruments"	"band_instruments2"	"band_members"
## [28] "bench_tbls"	"between"	"bind_cols"
## [31] "bind_rows"	"c_across"	"case_when"
## [34] "changes"	"check_dbplyr"	"coalesce"
## [37] "collapse"	"collect"	"combine"
## [40] "common_by"	"compare_tbls"	"compare_tbls2"
## [43] "compute"	"contains"	"copy_to"
## [46] "count"	"count_"	"cumall"
## [49] "cumany"	"cume_dist"	"cummean"
## [52] "cur_column"	"cur_data"	"cur_data_all"
## [55] "cur_group"	"cur_group_id"	"cur_group_rows"
## [58] "current_vars"	"data_frame"	"data_frame_"
## [61] "db_analyze"	"db_begin"	"db_commit"
## [64] "db_create_index"	"db_create_indexes"	"db_create_table"
## [67] "db_data_type"	"db_desc"	"db_drop_table"

## [70]	"db_explain"	"db_has_table"	"db_insert_into"
## [73]	"db_list_tables"	"db_query_fields"	"db_query_rows"
## [76]	"db_rollback"	"db_save_query"	"db_write_table"
## [79]	"dense_rank"	"desc"	"dim_desc"
## [82]	"distinct"	"distinct_"	"distinct_all"
## [85]	"distinct_at"	"distinct_if"	"distinct_prepare"
## [88]	"do"	"do_"	"dplyr_col_modify"
## [91]	"dplyr_reconstruct"	"dplyr_row_slice"	"ends_with"
## [94]	"enexpr"	"enexprs"	"enquo"
## [97]	"enquos"	"ensym"	"ensyms"
## [100]	"eval_tbls"	"eval_tbls2"	"everything"
## [103]	"explain"	"expr"	"failwith"
## [106]	"filter"	"filter_"	"filter_all"
## [109]	"filter_at"	"filter_if"	"first"
## [112]	"frame_data"	"full_join"	"funs"
## [115]	"funs_"	"glimpse"	"group_by"
## [118]	"group_by_"	"group_by_all"	"group_by_at"
## [121]	"group_by_drop_default"	"group_by_if"	"group_by_prepare"
## [124]	"group_cols"	"group_data"	"group_indices"
## [127]	"group_indices_"	"group_keys"	"group_map"
## [130]	"group_modify"	"group_nest"	"group_rows"
## [133]	"group_size"	"group_split"	"group_trim"
## [136]	"group_vars"	"group_walk"	"grouped_df"
## [139]	"groups"	"id"	"ident"
## [142]	"if_all"	"if_any"	"if_else"
## [145]	"inner_join"	"intersect"	"is.grouped_df"
## [148]	"is.src"	"is.tbl"	"is.grouped_df"
## [151]	"lag"	"last"	"last_col"
## [154]	"lead"	"left_join"	"location"
## [157]	"lst"	"lst_"	"make_tbl"
## [160]	"matches"	"min_rank"	"mutate"
## [163]	"mutate_"	"mutate_all"	"mutate_at"
## [166]	"mutate_each"	"mutate_each_"	"mutate_if"
## [169]	"n"	"n_distinct"	"n_groups"
## [172]	"na_if"	"near"	"nest_by"
## [175]	"nest_join"	"new_grouped_df"	"new_rowwise_df"
## [178]	"nth"	"ntile"	"num_range"
## [181]	"one_of"	"order_by"	"percent_rank"
## [184]	"progress_estimated"	"pull"	"quo"
## [187]	"quo_name"	"quos"	"recode"
## [190]	"recode_factor"	"relocate"	"rename"
## [193]	"rename_"	"rename_all"	"rename_at"
## [196]	"rename_if"	"rename_vars"	"rename_vars_"
## [199]	"rename_with"	"right_join"	"row_number"
## [202]	"rows_append"	"rows_delete"	"rows_insert"
## [205]	"rows_patch"	"rows_update"	"rows_upsert"

## [208]	"rowwise"	"same_src"	"sample_frac"
## [211]	"sample_n"	"select"	"select_"
## [214]	"select_all"	"select_at"	"select_if"
## [217]	"select_var"	"select_vars"	"select_vars_"
## [220]	"semi_join"	"setdiff"	"setequal"
## [223]	"show_query"	"slice"	"slice_"
## [226]	"slice_head"	"slice_max"	"slice_min"
## [229]	"slice_sample"	"slice_tail"	"sql"
## [232]	"sql_escape_ident"	"sql_escape_string"	"sql_join"
## [235]	"sql_select"	"sql_semi_join"	"sql_set_op"
## [238]	"sql_subquery"	"sql_translate_env"	"src"
## [241]	"src_df"	"src_local"	"src_mysql"
## [244]	"src_postgres"	"src_sqlite"	"src_tbls"
## [247]	"starts_with"	"starwars"	"storms"
## [250]	"summarise"	"summarise_"	"summarise_all"
## [253]	"summarise_at"	"summarise_each"	"summarise_each_"
## [256]	"summarise_if"	"summarize"	"summarize_"
## [259]	"summarize_all"	"summarize_at"	"summarize_each"
## [262]	"summarize_each_"	"summarize_if"	"sym"
## [265]	"syms"	"tally"	"tally_"
## [268]	"tbl"	"tbl_df"	"tbl_nongroup_vars"
## [271]	"tbl_ptype"	"tbl_sum"	"tbl_vars"
## [274]	"tibble"	"top_frac"	"top_n"
## [277]	"transmute"	"transmute_"	"transmute_all"
## [280]	"transmute_at"	"transmute_if"	"tribble"
## [283]	"type_sum"	"ungroup"	"union"
## [286]	"union_all"	"validate_grouped_df"	"validate_rowwise_df"
## [289]	"vars"	"with_groups"	"with_order"
## [292]	"wrap_dbplyr_obj"		

2.2 Operador Pipe

```
sqrt(log(44))
```

```
## [1] 1.945299
```

```
44 %>% log %>% sqrt
```

```
## [1] 1.945299
```

2.3 select() para columnas

```
select(dados, manufacturer, model, year)
```

```
## # A tibble: 234 x 3
##   manufacturer model      year
##   <fct>         <fct>    <int>
## 1 audi         a4        1999
## 2 audi         a4        1999
## 3 audi         a4        2008
## 4 audi         a4        2008
## 5 audi         a4        1999
## 6 audi         a4        1999
## 7 audi         a4        2008
## 8 audi         a4 quattro 1999
## 9 audi         a4 quattro 1999
## 10 audi        a4 quattro 2008
## # ... with 224 more rows
```

```
select(dados, starts_with("m"))
```

```
## # A tibble: 234 x 2
##   manufacturer model
##   <fct>         <fct>
## 1 audi         a4
## 2 audi         a4
## 3 audi         a4
## 4 audi         a4
## 5 audi         a4
## 6 audi         a4
## 7 audi         a4
## 8 audi         a4 quattro
## 9 audi         a4 quattro
## 10 audi        a4 quattro
## # ... with 224 more rows
```

```
select(dados, contains("r"))
```

```
## # A tibble: 234 x 4
##   manufacturer year trans      drv
##   <fct>         <int> <fct>    <fct>
## 1 audi         1999 auto(15)  f
```

```
## 2 audi          1999 manual(m5) f
## 3 audi          2008 manual(m6) f
## 4 audi          2008 auto(av)   f
## 5 audi          1999 auto(l5)   f
## 6 audi          1999 manual(m5) f
## 7 audi          2008 auto(av)   f
## 8 audi          1999 manual(m5) 4
## 9 audi          1999 auto(l5)   4
## 10 audi         2008 manual(m6) 4
## # ... with 224 more rows
```

```
select(dados, ends_with("y"))
```

```
## # A tibble: 234 x 2
##   cty    hwy
##   <int> <int>
## 1    18    29
## 2    21    29
## 3    20    31
## 4    21    30
## 5    16    26
## 6    18    26
## 7    18    27
## 8    18    26
## 9    16    25
## 10   20    28
## # ... with 224 more rows
```

```
select(dados, matches("[abc]"))
```

```
## # A tibble: 234 x 6
##   manufacturer year   cyl trans      cty class
##   <fct>         <int> <int> <fct>   <int> <fct>
## 1 audi          1999     4 auto(l5)    18 compact
## 2 audi          1999     4 manual(m5)  21 compact
## 3 audi          2008     4 manual(m6)  20 compact
## 4 audi          2008     4 auto(av)    21 compact
## 5 audi          1999     6 auto(l5)    16 compact
## 6 audi          1999     6 manual(m5)  18 compact
## 7 audi          2008     6 auto(av)    18 compact
## 8 audi          1999     4 manual(m5)  18 compact
## 9 audi          1999     4 auto(l5)    16 compact
## 10 audi         2008     4 manual(m6)  20 compact
## # ... with 224 more rows
```

```
select(dados, starts_with("m"), starts_with("c"))
```

```
## # A tibble: 234 x 5
##   manufacturer model      cyl  cty class
##   <fct>          <fct>    <int> <int> <fct>
## 1 audi          a4         4     18 compact
## 2 audi          a4         4     21 compact
## 3 audi          a4         4     20 compact
## 4 audi          a4         4     21 compact
## 5 audi          a4         6     16 compact
## 6 audi          a4         6     18 compact
## 7 audi          a4         6     18 compact
## 8 audi          a4 quattro  4     18 compact
## 9 audi          a4 quattro  4     16 compact
## 10 audi          a4 quattro  4     20 compact
## # ... with 224 more rows
```

```
select(dados, ends_with("l"), ends_with("s"))
```

```
## # A tibble: 234 x 6
##   model      displ  cyl fl  trans      class
##   <fct>      <dbl> <int> <fct> <fct>    <fct>
## 1 a4         1.8     4 p  auto(l5) compact
## 2 a4         1.8     4 p  manual(m5) compact
## 3 a4         2       4 p  manual(m6) compact
## 4 a4         2       4 p  auto(av) compact
## 5 a4         2.8     6 p  auto(l5) compact
## 6 a4         2.8     6 p  manual(m5) compact
## 7 a4         3.1     6 p  auto(av) compact
## 8 a4 quattro  1.8     4 p  manual(m5) compact
## 9 a4 quattro  1.8     4 p  auto(l5) compact
## 10 a4 quattro  2       4 p  manual(m6) compact
## # ... with 224 more rows
```

```
select(dados, 1:3)
```

```
## # A tibble: 234 x 3
##   manufacturer model      displ
##   <fct>          <fct>    <dbl>
## 1 audi          a4         1.8
## 2 audi          a4         1.8
## 3 audi          a4         2
## 4 audi          a4         2
```

```
## 5 audi          a4          2.8
## 6 audi          a4          2.8
## 7 audi          a4          3.1
## 8 audi          a4 quattro  1.8
## 9 audi          a4 quattro  1.8
## 10 audi         a4 quattro  2
## # ... with 224 more rows
```

```
select(dados, c(2,5,7))
```

```
## # A tibble: 234 x 3
##   model      cyl drv
##   <fct>    <int> <fct>
## 1 a4        4 f
## 2 a4        4 f
## 3 a4        4 f
## 4 a4        4 f
## 5 a4        6 f
## 6 a4        6 f
## 7 a4        6 f
## 8 a4 quattro 4 4
## 9 a4 quattro 4 4
## 10 a4 quattro 4 4
## # ... with 224 more rows
```

```
select(dados, manufacturer:cyl)
```

```
## # A tibble: 234 x 5
##   manufacturer model      displ  year  cyl
##   <fct>         <fct>    <dbl> <int> <int>
## 1 audi         a4        1.8  1999   4
## 2 audi         a4        1.8  1999   4
## 3 audi         a4         2   2008   4
## 4 audi         a4         2   2008   4
## 5 audi         a4        2.8  1999   6
## 6 audi         a4        2.8  1999   6
## 7 audi         a4        3.1  2008   6
## 8 audi         a4 quattro  1.8  1999   4
## 9 audi         a4 quattro  1.8  1999   4
## 10 audi        a4 quattro   2   2008   4
## # ... with 224 more rows
```

```
select(dados, -(manufacturer:cyl))
```

```
## # A tibble: 234 x 6
##   trans     drv   cty   hwy fl   class
##   <fct>    <fct> <int> <int> <fct> <fct>
## 1 auto(l5)  f      18    29 p    compact
## 2 manual(m5) f      21    29 p    compact
## 3 manual(m6) f      20    31 p    compact
## 4 auto(av)   f      21    30 p    compact
## 5 auto(l5)   f      16    26 p    compact
## 6 manual(m5) f      18    26 p    compact
## 7 auto(av)   f      18    27 p    compact
## 8 manual(m5) 4      18    26 p    compact
## 9 auto(l5)   4      16    25 p    compact
## 10 manual(m6) 4      20    28 p    compact
## # ... with 224 more rows
```

2.4 rename()

```
dados1 <- rename(dados,
                 mnfc = manufacturer,
                 mod = model)
dados1
```

```
## # A tibble: 234 x 11
##   mnfc  mod      displ year   cyl trans     drv   cty   hwy fl   class
##   <fct> <fct>    <dbl> <int> <int> <fct>    <fct> <int> <int> <fct> <fct>
## 1 audi  a4         1.8  1999     4 auto(l5)  f      18    29 p    compact
## 2 audi  a4         1.8  1999     4 manual(m5) f      21    29 p    compact
## 3 audi  a4         2    2008     4 manual(m6) f      20    31 p    compact
## 4 audi  a4         2    2008     4 auto(av)   f      21    30 p    compact
## 5 audi  a4         2.8  1999     6 auto(l5)   f      16    26 p    compact
## 6 audi  a4         2.8  1999     6 manual(m5) f      18    26 p    compact
## 7 audi  a4         3.1  2008     6 auto(av)   f      18    27 p    compact
## 8 audi  a4 quattro  1.8  1999     4 manual(m5) 4      18    26 p    compact
## 9 audi  a4 quattro  1.8  1999     4 auto(l5)   4      16    25 p    compact
## 10 audi a4 quattro  2    2008     4 manual(m6) 4      20    28 p    compact
## # ... with 224 more rows
```

```
select(dados,
       mnfc = manufacturer,
       mod = model)
```



```
## # A tibble: 234 x 2
##   mnfc  mod
##   <fct> <fct>
## 1 audi  a4
## 2 audi  a4
## 3 audi  a4
## 4 audi  a4
## 5 audi  a4
## 6 audi  a4
## 7 audi  a4
## 8 audi  a4 quattro
## 9 audi  a4 quattro
## 10 audi  a4 quattro
## # ... with 224 more rows
```

```
select(dados,
       mnfc = manufacturer,
       mod = model,
       everything())
```

```
## # A tibble: 234 x 11
##   mnfc  mod      displ  year  cyl trans      drv    cty  hwy fl  class
##   <fct> <fct>    <dbl> <int> <int> <fct>    <fct> <int> <int> <fct> <fct>
## 1 audi  a4          1.8  1999    4 auto(l5) f        18    29 p  compact
## 2 audi  a4          1.8  1999    4 manual(m5) f        21    29 p  compact
## 3 audi  a4          2    2008    4 manual(m6) f        20    31 p  compact
## 4 audi  a4          2    2008    4 auto(av) f        21    30 p  compact
## 5 audi  a4          2.8  1999    6 auto(l5) f        16    26 p  compact
## 6 audi  a4          2.8  1999    6 manual(m5) f        18    26 p  compact
## 7 audi  a4          3.1  2008    6 auto(av) f        18    27 p  compact
## 8 audi  a4 quattro  1.8  1999    4 manual(m5) 4        18    26 p  compact
## 9 audi  a4 quattro  1.8  1999    4 auto(l5) 4        16    25 p  compact
## 10 audi  a4 quattro  2    2008    4 manual(m6) 4        20    28 p  compact
## # ... with 224 more rows
```

2.5 mutate() para columnas

```
mutate(dados, sqrt_cty = sqrt(cty))
```

```
## # A tibble: 234 x 12
##   manufac~1 model displ  year  cyl trans drv    cty  hwy fl  class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct>    <dbl>
```

```
## 1 audi      a4      1.8 1999      4 auto~ f      18      29 p      comp~ 4.24
## 2 audi      a4      1.8 1999      4 manu~ f      21      29 p      comp~ 4.58
## 3 audi      a4      2    2008      4 manu~ f      20      31 p      comp~ 4.47
## 4 audi      a4      2    2008      4 auto~ f      21      30 p      comp~ 4.58
## 5 audi      a4      2.8 1999      6 auto~ f      16      26 p      comp~ 4
## 6 audi      a4      2.8 1999      6 manu~ f      18      26 p      comp~ 4.24
## 7 audi      a4      3.1 2008      6 auto~ f      18      27 p      comp~ 4.24
## 8 audi      a4 q~    1.8 1999      4 manu~ 4      18      26 p      comp~ 4.24
## 9 audi      a4 q~    1.8 1999      4 auto~ 4      16      25 p      comp~ 4
## 10 audi     a4 q~    2    2008      4 manu~ 4      20      28 p      comp~ 4.47
## # ... with 224 more rows, and abbreviated variable names 1: manufacturer,
## # 2: sqrt_cty
```

```
names(dados)
```

```
## [1] "manufacturer" "model"      "displ"      "year"      "cyl"
## [6] "trans"        "drv"        "cty"        "hwy"      "fl"
## [11] "class"
```

```
dados<- mutate(dados, sqrt_cty = sqrt(cty))
names(dados)
```

```
## [1] "manufacturer" "model"      "displ"      "year"      "cyl"
## [6] "trans"        "drv"        "cty"        "hwy"      "fl"
## [11] "class"        "sqrt_cty"
```

```
dados <- mutate(dados,
`soma de variáveis` = (cty + hwy) / 2)
names(dados)
```

```
## [1] "manufacturer"      "model"      "displ"
## [4] "year"              "cyl"        "trans"
## [7] "drv"               "cty"        "hwy"
## [10] "fl"                "class"      "sqrt_cty"
## [13] "soma de variáveis"
```

```
dados <- mutate(dados,
  car = paste(manufacturer, model, sep = " "),
  `cyl / trans` = paste(cyl, " cylinders", " / ", trans, " transmission", sep = ""))
dados
```

```
## # A tibble: 234 x 15
##   manufac~1 model displ year cyl trans drv cty hwy fl class sqrt_~2
```

```
##      <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 audi      a4      1.8  1999      4 auto~ f      18    29 p    comp~  4.24
## 2 audi      a4      1.8  1999      4 manu~ f      21    29 p    comp~  4.58
## 3 audi      a4      2    2008      4 manu~ f      20    31 p    comp~  4.47
## 4 audi      a4      2    2008      4 auto~ f      21    30 p    comp~  4.58
## 5 audi      a4      2.8  1999      6 auto~ f      16    26 p    comp~   4
## 6 audi      a4      2.8  1999      6 manu~ f      18    26 p    comp~  4.24
## 7 audi      a4      3.1  2008      6 auto~ f      18    27 p    comp~  4.24
## 8 audi      a4 q~    1.8  1999      4 manu~ 4      18    26 p    comp~  4.24
## 9 audi      a4 q~    1.8  1999      4 auto~ 4      16    25 p    comp~   4
## 10 audi     a4 q~    2    2008      4 manu~ 4      20    28 p    comp~  4.47
## # ... with 224 more rows, 3 more variables: `soma de variáveis` <dbl>,
## #   car <chr>, `cyl / trans` <chr>, and abbreviated variable names
## #   1: manufacturer, 2: sqrt_cty
```

2.6 transmute()

```
transmute(dados,
  `avg miles per gallon` = (cty + hwy) / 2)
```

```
## # A tibble: 234 x 1
##   `avg miles per gallon`
##   <dbl>
## 1          23.5
## 2          25
## 3          25.5
## 4          25.5
## 5          21
## 6          22
## 7          22.5
## 8          22
## 9          20.5
## 10         24
## # ... with 224 more rows
```

```
transmute(dados,
  car = paste(manufacturer, model, sep = " "),
  `cyl / trans` = paste(cyl, " cylinders", " / ", trans, " transmission", sep = ""))
```

```
## # A tibble: 234 x 2
##   car      `cyl / trans`
##   <chr>      <chr>
```

```
## 1 audi a4          4 cylinders / auto(l5) transmission
## 2 audi a4          4 cylinders / manual(m5) transmission
## 3 audi a4          4 cylinders / manual(m6) transmission
## 4 audi a4          4 cylinders / auto(av) transmission
## 5 audi a4          6 cylinders / auto(l5) transmission
## 6 audi a4          6 cylinders / manual(m5) transmission
## 7 audi a4          6 cylinders / auto(av) transmission
## 8 audi a4 quattro 4 cylinders / manual(m5) transmission
## 9 audi a4 quattro 4 cylinders / auto(l5) transmission
## 10 audi a4 quattro 4 cylinders / manual(m6) transmission
## # ... with 224 more rows
```

2.7 filter() para linhas

```
filter(dados, manufacturer == "audi")
```

```
## # A tibble: 18 x 15
##   manufac~1 model displ  year   cyl trans drv   cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 audi      a4      1.8  1999     4 auto~ f     18    29 p   comp~  4.24
## 2 audi      a4      1.8  1999     4 manu~ f     21    29 p   comp~  4.58
## 3 audi      a4      2    2008     4 manu~ f     20    31 p   comp~  4.47
## 4 audi      a4      2    2008     4 auto~ f     21    30 p   comp~  4.58
## 5 audi      a4      2.8  1999     6 auto~ f     16    26 p   comp~  4
## 6 audi      a4      2.8  1999     6 manu~ f     18    26 p   comp~  4.24
## 7 audi      a4      3.1  2008     6 auto~ f     18    27 p   comp~  4.24
## 8 audi      a4 q~    1.8  1999     4 manu~ 4     18    26 p   comp~  4.24
## 9 audi      a4 q~    1.8  1999     4 auto~ 4     16    25 p   comp~  4
## 10 audi     a4 q~    2    2008     4 manu~ 4     20    28 p   comp~  4.47
## 11 audi     a4 q~    2    2008     4 auto~ 4     19    27 p   comp~  4.36
## 12 audi     a4 q~    2.8  1999     6 auto~ 4     15    25 p   comp~  3.87
## 13 audi     a4 q~    2.8  1999     6 manu~ 4     17    25 p   comp~  4.12
## 14 audi     a4 q~    3.1  2008     6 auto~ 4     17    25 p   comp~  4.12
## 15 audi     a4 q~    3.1  2008     6 manu~ 4     15    25 p   comp~  3.87
## 16 audi     a6 q~    2.8  1999     6 auto~ 4     15    24 p   mids~  3.87
## 17 audi     a6 q~    3.1  2008     6 auto~ 4     17    25 p   mids~  4.12
## 18 audi     a6 q~    4.2  2008     8 auto~ 4     16    23 p   mids~  4
## # ... with 3 more variables: `soma de variáveis` <dbl>, car <chr>,
## #   `cyl / trans` <chr>, and abbreviated variable names 1: manufacturer,
## #   2: sqrt_cty
```

```
filter(dados, manufacturer == "audi" & year == "1999")
```

```
## # A tibble: 9 x 15
##   manufact~1 model displ year   cyl trans drv   cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 audi      a4      1.8  1999     4 auto~ f     18    29 p   comp~ 4.24
## 2 audi      a4      1.8  1999     4 manu~ f     21    29 p   comp~ 4.58
## 3 audi      a4      2.8  1999     6 auto~ f     16    26 p   comp~ 4
## 4 audi      a4      2.8  1999     6 manu~ f     18    26 p   comp~ 4.24
## 5 audi      a4 q~    1.8  1999     4 manu~ 4     18    26 p   comp~ 4.24
## 6 audi      a4 q~    1.8  1999     4 auto~ 4     16    25 p   comp~ 4
## 7 audi      a4 q~    2.8  1999     6 auto~ 4     15    25 p   comp~ 3.87
## 8 audi      a4 q~    2.8  1999     6 manu~ 4     17    25 p   comp~ 4.12
## 9 audi      a6 q~    2.8  1999     6 auto~ 4     15    24 p   mids~ 3.87
## # ... with 3 more variables: `soma de variáveis` <dbl>, car <chr>,
## #   `cyl / trans` <chr>, and abbreviated variable names 1: manufacturer,
## #   2: sqrt_cty
```

```
filter(dados, manufacturer == "audi", year == 1999)
```

```
## # A tibble: 9 x 15
##   manufact~1 model displ year   cyl trans drv   cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 audi      a4      1.8  1999     4 auto~ f     18    29 p   comp~ 4.24
## 2 audi      a4      1.8  1999     4 manu~ f     21    29 p   comp~ 4.58
## 3 audi      a4      2.8  1999     6 auto~ f     16    26 p   comp~ 4
## 4 audi      a4      2.8  1999     6 manu~ f     18    26 p   comp~ 4.24
## 5 audi      a4 q~    1.8  1999     4 manu~ 4     18    26 p   comp~ 4.24
## 6 audi      a4 q~    1.8  1999     4 auto~ 4     16    25 p   comp~ 4
## 7 audi      a4 q~    2.8  1999     6 auto~ 4     15    25 p   comp~ 3.87
## 8 audi      a4 q~    2.8  1999     6 manu~ 4     17    25 p   comp~ 4.12
## 9 audi      a6 q~    2.8  1999     6 auto~ 4     15    24 p   mids~ 3.87
## # ... with 3 more variables: `soma de variáveis` <dbl>, car <chr>,
## #   `cyl / trans` <chr>, and abbreviated variable names 1: manufacturer,
## #   2: sqrt_cty
```

```
filter(dados, manufacturer == "audi" | manufacturer == "dodge") %>%
  print(n = 20)
```

```
## # A tibble: 55 x 15
##   manufac~1 model displ year   cyl trans drv   cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 audi      a4      1.8  1999     4 auto~ f     18    29 p   comp~ 4.24
```

```
## 2 audi      a4      1.8 1999      4 manu~ f      21      29 p      comp~ 4.58
## 3 audi      a4      2    2008     4 manu~ f      20      31 p      comp~ 4.47
## 4 audi      a4      2    2008     4 auto~ f      21      30 p      comp~ 4.58
## 5 audi      a4      2.8 1999     6 auto~ f      16      26 p      comp~ 4
## 6 audi      a4      2.8 1999     6 manu~ f      18      26 p      comp~ 4.24
## 7 audi      a4      3.1 2008     6 auto~ f      18      27 p      comp~ 4.24
## 8 audi      a4 q~    1.8 1999     4 manu~ 4      18      26 p      comp~ 4.24
## 9 audi      a4 q~    1.8 1999     4 auto~ 4      16      25 p      comp~ 4
## 10 audi     a4 q~    2    2008     4 manu~ 4      20      28 p      comp~ 4.47
## 11 audi     a4 q~    2    2008     4 auto~ 4      19      27 p      comp~ 4.36
## 12 audi     a4 q~    2.8 1999     6 auto~ 4      15      25 p      comp~ 3.87
## 13 audi     a4 q~    2.8 1999     6 manu~ 4      17      25 p      comp~ 4.12
## 14 audi     a4 q~    3.1 2008     6 auto~ 4      17      25 p      comp~ 4.12
## 15 audi     a4 q~    3.1 2008     6 manu~ 4      15      25 p      comp~ 3.87
## 16 audi     a6 q~    2.8 1999     6 auto~ 4      15      24 p      mids~ 3.87
## 17 audi     a6 q~    3.1 2008     6 auto~ 4      17      25 p      mids~ 4.12
## 18 audi     a6 q~    4.2 2008     8 auto~ 4      16      23 p      mids~ 4
## 19 dodge    cara~    2.4 1999     4 auto~ f      18      24 r      mini~ 4.24
## 20 dodge    cara~    3    1999     6 auto~ f      17      24 r      mini~ 4.12
## # ... with 35 more rows, 3 more variables: `soma de variáveis` <dbl>,
## #   car <chr>, `cyl / trans` <chr>, and abbreviated variable names
## #   1: manufacturer, 2: sqrt_cty
```

```
filter(dados, manufacturer %in% c("audi", "dodge")) %>%
  print(n = 20)
```

```
## # A tibble: 55 x 15
##   manufac~1 model displ  year   cyl trans drv   cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 audi      a4      1.8 1999     4 auto~ f     18    29 p   comp~ 4.24
## 2 audi      a4      1.8 1999     4 manu~ f     21    29 p   comp~ 4.58
## 3 audi      a4      2    2008     4 manu~ f     20    31 p   comp~ 4.47
## 4 audi      a4      2    2008     4 auto~ f     21    30 p   comp~ 4.58
## 5 audi      a4      2.8 1999     6 auto~ f     16    26 p   comp~ 4
## 6 audi      a4      2.8 1999     6 manu~ f     18    26 p   comp~ 4.24
## 7 audi      a4      3.1 2008     6 auto~ f     18    27 p   comp~ 4.24
## 8 audi      a4 q~    1.8 1999     4 manu~ 4     18    26 p   comp~ 4.24
## 9 audi      a4 q~    1.8 1999     4 auto~ 4     16    25 p   comp~ 4
## 10 audi     a4 q~    2    2008     4 manu~ 4     20    28 p   comp~ 4.47
## 11 audi     a4 q~    2    2008     4 auto~ 4     19    27 p   comp~ 4.36
## 12 audi     a4 q~    2.8 1999     6 auto~ 4     15    25 p   comp~ 3.87
## 13 audi     a4 q~    2.8 1999     6 manu~ 4     17    25 p   comp~ 4.12
## 14 audi     a4 q~    3.1 2008     6 auto~ 4     17    25 p   comp~ 4.12
## 15 audi     a4 q~    3.1 2008     6 manu~ 4     15    25 p   comp~ 3.87
## 16 audi     a6 q~    2.8 1999     6 auto~ 4     15    24 p   mids~ 3.87
```

```
## 17 audi      a6 q~   3.1  2008      6 auto~ 4      17    25 p    mids~   4.12
## 18 audi      a6 q~   4.2  2008      8 auto~ 4      16    23 p    mids~    4
## 19 dodge     cara~   2.4  1999      4 auto~ f      18    24 r    mini~   4.24
## 20 dodge     cara~    3    1999      6 auto~ f      17    24 r    mini~   4.12
## # ... with 35 more rows, 3 more variables: `soma de variáveis` <dbl>,
## #   car <chr>, `cyl / trans` <chr>, and abbreviated variable names
## #   1: manufacturer, 2: sqrt_cty
```

```
filter(dados, hwy >= 30) %>%
  select(hwy) %>%
  print(n = 26)
```

```
## # A tibble: 26 x 1
##       hwy
##   <int>
## 1     31
## 2     30
## 3     30
## 4     33
## 5     32
## 6     32
## 7     32
## 8     34
## 9     36
## 10    36
## 11    30
## 12    31
## 13    31
## 14    32
## 15    31
## 16    31
## 17    31
## 18    31
## 19    30
## 20    33
## 21    35
## 22    37
## 23    35
## 24    44
## 25    44
## 26    41
```

```
filter(dados, year != 1999) %>%
  select(year) %>%
  print(n = 30)
```

```
## # A tibble: 117 x 1
##   year
##   <int>
## 1 2008
## 2 2008
## 3 2008
## 4 2008
## 5 2008
## 6 2008
## 7 2008
## 8 2008
## 9 2008
## 10 2008
## 11 2008
## 12 2008
## 13 2008
## 14 2008
## 15 2008
## 16 2008
## 17 2008
## 18 2008
## 19 2008
## 20 2008
## 21 2008
## 22 2008
## 23 2008
## 24 2008
## 25 2008
## 26 2008
## 27 2008
## 28 2008
## 29 2008
## 30 2008
## # ... with 87 more rows
```

```
filter(dados, between(cty, 15, 22))
```

```
## # A tibble: 143 x 15
##   manufac~1 model displ year   cyl trans drv   cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct>   <dbl>
## 1 audi      a4      1.8 1999     4 auto~ f     18    29 p   comp~ 4.24
## 2 audi      a4      1.8 1999     4 manu~ f     21    29 p   comp~ 4.58
## 3 audi      a4      2    2008     4 manu~ f     20    31 p   comp~ 4.47
## 4 audi      a4      2    2008     4 auto~ f     21    30 p   comp~ 4.58
## 5 audi      a4      2.8 1999     6 auto~ f     16    26 p   comp~ 4
```



```
## 6 audi      a4      2.8 1999      6 manu~ f      18    26 p      comp~ 4.24
## 7 audi      a4      3.1 2008      6 auto~ f      18    27 p      comp~ 4.24
## 8 audi      a4 q~    1.8 1999      4 manu~ 4      18    26 p      comp~ 4.24
## 9 audi      a4 q~    1.8 1999      4 auto~ 4      16    25 p      comp~ 4
## 10 audi     a4 q~    2    2008      4 manu~ 4      20    28 p      comp~ 4.47
## # ... with 133 more rows, 3 more variables: `soma de variáveis` <dbl>,
## #   car <chr>, `cyl / trans` <chr>, and abbreviated variable names
## #   1: manufacturer, 2: sqrt_cty
```

2.8 slice() para linhas

```
slice(dados, 1:5)
```

```
## # A tibble: 5 x 15
##   manufact~1 model displ  year    cyl trans drv    cty    hwy fl    class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 audi      a4      1.8 1999      4 auto~ f      18    29 p      comp~ 4.24
## 2 audi      a4      1.8 1999      4 manu~ f      21    29 p      comp~ 4.58
## 3 audi      a4      2    2008      4 manu~ f      20    31 p      comp~ 4.47
## 4 audi      a4      2    2008      4 auto~ f      21    30 p      comp~ 4.58
## 5 audi      a4      2.8 1999      6 auto~ f      16    26 p      comp~ 4
## # ... with 3 more variables: `soma de variáveis` <dbl>, car <chr>,
## #   `cyl / trans` <chr>, and abbreviated variable names 1: manufacturer,
## #   2: sqrt_cty
```

```
# dados[1:5,]
```

```
slice(dados, 20:30)
```

```
## # A tibble: 11 x 15
##   manufac~1 model displ  year    cyl trans drv    cty    hwy fl    class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 chevrolet c150~    5.3 2008      8 auto~ r      11    15 e      suv     3.32
## 2 chevrolet c150~    5.3 2008      8 auto~ r      14    20 r      suv     3.74
## 3 chevrolet c150~    5.7 1999      8 auto~ r      13    17 r      suv     3.61
## 4 chevrolet c150~    6    2008      8 auto~ r      12    17 r      suv     3.46
## 5 chevrolet corv~    5.7 1999      8 manu~ r      16    26 p      2sea~ 4
## 6 chevrolet corv~    5.7 1999      8 auto~ r      15    23 p      2sea~ 3.87
## 7 chevrolet corv~    6.2 2008      8 manu~ r      16    26 p      2sea~ 4
## 8 chevrolet corv~    6.2 2008      8 auto~ r      15    25 p      2sea~ 3.87
## 9 chevrolet corv~    7    2008      8 manu~ r      15    24 p      2sea~ 3.87
## 10 chevrolet k150~    5.3 2008      8 auto~ 4      14    19 r      suv     3.74
```

```
## 11 chevrolet k150~ 5.3 2008 8 auto~ 4 11 14 e suv 3.32
## # ... with 3 more variables: `soma de variáveis` <dbl>, car <chr>,
## # `cyl / trans` <chr>, and abbreviated variable names 1: manufacturer,
## # 2: sqrt_cty
```

```
# dados[20:30,]
```

2.9 arrange() para linhas

```
# ordenar "displ" de menor a maior
arrange(dados, displ)
```

```
## # A tibble: 234 x 15
##   manufac~1 model displ year cyl trans drv cty hwy fl class sqrt_~2
##   <fct> <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 honda civic 1.6 1999 4 manu~ f 28 33 r subc~ 5.29
## 2 honda civic 1.6 1999 4 auto~ f 24 32 r subc~ 4.90
## 3 honda civic 1.6 1999 4 manu~ f 25 32 r subc~ 5
## 4 honda civic 1.6 1999 4 manu~ f 23 29 p subc~ 4.80
## 5 honda civic 1.6 1999 4 auto~ f 24 32 r subc~ 4.90
## 6 audi a4 1.8 1999 4 auto~ f 18 29 p comp~ 4.24
## 7 audi a4 1.8 1999 4 manu~ f 21 29 p comp~ 4.58
## 8 audi a4 q~ 1.8 1999 4 manu~ 4 18 26 p comp~ 4.24
## 9 audi a4 q~ 1.8 1999 4 auto~ 4 16 25 p comp~ 4
## 10 honda civic 1.8 2008 4 manu~ f 26 34 r subc~ 5.10
## # ... with 224 more rows, 3 more variables: `soma de variáveis` <dbl>,
## # car <chr>, `cyl / trans` <chr>, and abbreviated variable names
## # 1: manufacturer, 2: sqrt_cty
```

```
arrange(dados, displ) %>%
  print(n=20)
```

```
## # A tibble: 234 x 15
##   manufac~1 model displ year cyl trans drv cty hwy fl class sqrt_~2
##   <fct> <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 honda civic 1.6 1999 4 manu~ f 28 33 r subc~ 5.29
## 2 honda civic 1.6 1999 4 auto~ f 24 32 r subc~ 4.90
## 3 honda civic 1.6 1999 4 manu~ f 25 32 r subc~ 5
## 4 honda civic 1.6 1999 4 manu~ f 23 29 p subc~ 4.80
## 5 honda civic 1.6 1999 4 auto~ f 24 32 r subc~ 4.90
## 6 audi a4 1.8 1999 4 auto~ f 18 29 p comp~ 4.24
```

```
## 7 audi      a4      1.8 1999      4 manu~ f      21 29 p      comp~ 4.58
## 8 audi      a4 q~    1.8 1999      4 manu~ 4      18 26 p      comp~ 4.24
## 9 audi      a4 q~    1.8 1999      4 auto~ 4      16 25 p      comp~ 4
## 10 honda    civic    1.8 2008      4 manu~ f      26 34 r      subc~ 5.10
## 11 honda    civic    1.8 2008      4 auto~ f      25 36 r      subc~ 5
## 12 honda    civic    1.8 2008      4 auto~ f      24 36 c      subc~ 4.90
## 13 toyota    coro~    1.8 1999      4 auto~ f      24 30 r      comp~ 4.90
## 14 toyota    coro~    1.8 1999      4 auto~ f      24 33 r      comp~ 4.90
## 15 toyota    coro~    1.8 1999      4 manu~ f      26 35 r      comp~ 5.10
## 16 toyota    coro~    1.8 2008      4 manu~ f      28 37 r      comp~ 5.29
## 17 toyota    coro~    1.8 2008      4 auto~ f      26 35 r      comp~ 5.10
## 18 volkswag~ pass~    1.8 1999      4 manu~ f      21 29 p      mids~ 4.58
## 19 volkswag~ pass~    1.8 1999      4 auto~ f      18 29 p      mids~ 4.24
## 20 volkswag~ jetta    1.9 1999      4 manu~ f      33 44 d      comp~ 5.74
## # ... with 214 more rows, 3 more variables: `soma de variáveis` <dbl>,
## #   car <chr>, `cyl / trans` <chr>, and abbreviated variable names
## #   1: manufacturer, 2: sqrt_cty
```

```
# ordenar "displ" de maior a menor
arrange(dados, desc(displ))
```

```
## # A tibble: 234 x 15
##   manufac~1 model displ year   cyl trans drv      cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 chevrolet corv~    7   2008     8 manu~ r      15   24 p   2sea~ 3.87
## 2 chevrolet k150~    6.5 1999     8 auto~ 4      14   17 d   suv   3.74
## 3 chevrolet corv~    6.2 2008     8 manu~ r      16   26 p   2sea~ 4
## 4 chevrolet corv~    6.2 2008     8 auto~ r      15   25 p   2sea~ 3.87
## 5 jeep      gran~    6.1 2008     8 auto~ 4      11   14 p   suv   3.32
## 6 chevrolet c150~    6   2008     8 auto~ r      12   17 r   suv   3.46
## 7 dodge     dura~    5.9 1999     8 auto~ 4      11   15 r   suv   3.32
## 8 dodge     ram ~    5.9 1999     8 auto~ 4      11   15 r   pick~ 3.32
## 9 chevrolet c150~    5.7 1999     8 auto~ r      13   17 r   suv   3.61
## 10 chevrolet corv~    5.7 1999     8 manu~ r      16   26 p   2sea~ 4
## # ... with 224 more rows, 3 more variables: `soma de variáveis` <dbl>,
## #   car <chr>, `cyl / trans` <chr>, and abbreviated variable names
## #   1: manufacturer, 2: sqrt_cty
```

```
arrange(dados, desc(displ)) %>%
  print(n=20)
```

```
## # A tibble: 234 x 15
##   manufac~1 model displ year   cyl trans drv      cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
```

```
## 1 chevrolet corv~ 7 2008 8 manu~ r 15 24 p 2sea~ 3.87
## 2 chevrolet k150~ 6.5 1999 8 auto~ 4 14 17 d suv 3.74
## 3 chevrolet corv~ 6.2 2008 8 manu~ r 16 26 p 2sea~ 4
## 4 chevrolet corv~ 6.2 2008 8 auto~ r 15 25 p 2sea~ 3.87
## 5 jeep gran~ 6.1 2008 8 auto~ 4 11 14 p suv 3.32
## 6 chevrolet c150~ 6 2008 8 auto~ r 12 17 r suv 3.46
## 7 dodge dura~ 5.9 1999 8 auto~ 4 11 15 r suv 3.32
## 8 dodge ram ~ 5.9 1999 8 auto~ 4 11 15 r pick~ 3.32
## 9 chevrolet c150~ 5.7 1999 8 auto~ r 13 17 r suv 3.61
## 10 chevrolet corv~ 5.7 1999 8 manu~ r 16 26 p 2sea~ 4
## 11 chevrolet corv~ 5.7 1999 8 auto~ r 15 23 p 2sea~ 3.87
## 12 chevrolet k150~ 5.7 1999 8 auto~ 4 11 15 r suv 3.32
## 13 dodge dura~ 5.7 2008 8 auto~ 4 13 18 r suv 3.61
## 14 dodge ram ~ 5.7 2008 8 auto~ 4 13 17 r pick~ 3.61
## 15 jeep gran~ 5.7 2008 8 auto~ 4 13 18 r suv 3.61
## 16 toyota land~ 5.7 2008 8 auto~ 4 13 18 r suv 3.61
## 17 nissan path~ 5.6 2008 8 auto~ 4 12 18 p suv 3.46
## 18 ford expe~ 5.4 1999 8 auto~ r 11 17 r suv 3.32
## 19 ford expe~ 5.4 2008 8 auto~ r 12 18 r suv 3.46
## 20 ford f150~ 5.4 1999 8 auto~ 4 11 15 r pick~ 3.32
## # ... with 214 more rows, 3 more variables: `soma de variáveis` <dbl>,
## # car <chr>, `cyl / trans` <chr>, and abbreviated variable names
## # 1: manufacturer, 2: sqrt_cty
```

```
select(dados, displ, cty) %>%
  arrange(displ, cty) %>%
  print(n = 20)
```

```
## # A tibble: 234 x 2
##   displ cty
##   <dbl> <int>
## 1  1.6 23
## 2  1.6 24
## 3  1.6 24
## 4  1.6 25
## 5  1.6 28
## 6  1.8 16
## 7  1.8 18
## 8  1.8 18
## 9  1.8 18
## 10 1.8 21
## 11 1.8 21
## 12 1.8 24
## 13 1.8 24
## 14 1.8 24
```

```
## 15  1.8    25
## 16  1.8    26
## 17  1.8    26
## 18  1.8    26
## 19  1.8    28
## 20  1.9    29
## # ... with 214 more rows
```

```
select(dados, displ, cty) %>%
  arrange(displ, desc(cty)) %>%
  print(n = 20)
```

```
## # A tibble: 234 x 2
##   displ  cty
##   <dbl> <int>
## 1  1.6    28
## 2  1.6    25
## 3  1.6    24
## 4  1.6    24
## 5  1.6    23
## 6  1.8    28
## 7  1.8    26
## 8  1.8    26
## 9  1.8    26
## 10 1.8    25
## 11 1.8    24
## 12 1.8    24
## 13 1.8    24
## 14 1.8    21
## 15 1.8    21
## 16 1.8    18
## 17 1.8    18
## 18 1.8    18
## 19 1.8    16
## 20 1.9    35
## # ... with 214 more rows
```

2.10 distinct() para linhas

```
dados_exemplo <- data.frame(id = 1:3,
                             name = c("John", "Max", "Julia"))
dados_exemplo
```

```
##   id name
## 1  1 John
## 2  2  Max
## 3  3 Julia
```

```
# bind_rows == rbind()
dados_exemplo <- bind_rows(dados_exemplo, slice(dados_exemplo, 2))
dados_exemplo
```

```
##   id name
## 1  1 John
## 2  2  Max
## 3  3 Julia
## 4  2  Max
```

```
distinct(dados_exemplo)
```

```
##   id name
## 1  1 John
## 2  2  Max
## 3  3 Julia
```

```
dados_exemplo2 <- data.frame(id = c(1,1,2),
                             name = c("John", "Max", "Julia"))
dados_exemplo2
```

```
##   id name
## 1  1 John
## 2  1  Max
## 3  2 Julia
```

```
distinct(dados_exemplo2)
```

```
##   id name
## 1  1 John
## 2  1  Max
## 3  2 Julia
```

```
dados_duplicados <- select(dados, manufacturer, model)
dados_duplicados
```

```
## # A tibble: 234 x 2
##   manufacturer model
##   <fct>          <fct>
## 1 audi          a4
## 2 audi          a4
## 3 audi          a4
## 4 audi          a4
## 5 audi          a4
## 6 audi          a4
## 7 audi          a4
## 8 audi          a4 quattro
## 9 audi          a4 quattro
## 10 audi         a4 quattro
## # ... with 224 more rows
```

```
dados_ao_duplicados <- distinct(dados_duplicados)
dados_ao_duplicados
```

```
## # A tibble: 38 x 2
##   manufacturer model
##   <fct>          <fct>
## 1 audi          a4
## 2 audi          a4 quattro
## 3 audi          a6 quattro
## 4 chevrolet     c1500 suburban 2wd
## 5 chevrolet     corvette
## 6 chevrolet     k1500 tahoe 4wd
## 7 chevrolet     malibu
## 8 dodge         caravan 2wd
## 9 dodge         dakota pickup 4wd
## 10 dodge        durango 4wd
## # ... with 28 more rows
```

2.11 summarise()

```
summarise(dados, `média hwy` = mean(hwy))
```

```
## # A tibble: 1 x 1
##   `média hwy`
##   <dbl>
## 1         23.4
```

```
summarise(dados,
  `num. de dados` = n(),
  `num. modelos` = n_distinct(model))
```

```
## # A tibble: 1 x 2
##   `num. de dados` `num. modelos`
##           <int>           <int>
## 1             234             38
```

```
# levels(dados$model)
summarise(dados,
  `mín. hwy` = min(hwy, na.rm = TRUE),
  `mín. cty` = min(cty, na.rm = TRUE),
  `máx. hwy` = max(hwy, na.rm = TRUE),
  `máx. cty` = max(cty, na.rm = TRUE))
```

```
## # A tibble: 1 x 4
##   `mín. hwy` `mín. cty` `máx. hwy` `máx. cty`
##       <int>    <int>    <int>    <int>
## 1         12         9        44        35
```

```
dados %>%
  summarise_at(c("hwy", "cty"), list(min, max), na.rm = TRUE)
```

```
## # A tibble: 1 x 4
##   hwy_fn1 cty_fn1 hwy_fn2 cty_fn2
##     <int>  <int>  <int>  <int>
## 1      12     9     44     35
```

```
dados %>%
  summarise_if(is.numeric, list(min, max), na.rm = TRUE)
```

```
## # A tibble: 1 x 14
##   displ_fn1 year_fn1 cyl_fn1 cty_fn1 hwy_fn1 sqrt_cty_~1 soma ~2 displ~3 year_~4
##       <dbl>   <int>   <int>   <int>   <int>       <dbl>  <dbl>  <dbl>  <int>
## 1       1.6    1999     4       9      12         3    10.5     7    2008
## # ... with 5 more variables: cyl_fn2 <int>, cty_fn2 <int>, hwy_fn2 <int>,
## #   sqrt_cty_fn2 <dbl>, `soma de variáveis_fn2` <dbl>, and abbreviated variable
## #   names 1: sqrt_cty_fn1, 2: `soma de variáveis_fn1`, 3: displ_fn2,
## #   4: year_fn2
```



```
dados %>%
  summarise_if(is.numeric, min, na.rm = TRUE)
```

```
## # A tibble: 1 x 7
##   displ year   cyl   cty   hwy sqrt_cty `soma de variáveis`
##   <dbl> <int> <int> <int> <int>   <dbl>         <dbl>
## 1   1.6  1999     4     9    12     3         10.5
```

```
dados %>%
  summarise_if(is.numeric, max, na.rm = TRUE)
```

```
## # A tibble: 1 x 7
##   displ year   cyl   cty   hwy sqrt_cty `soma de variáveis`
##   <dbl> <int> <int> <int> <int>   <dbl>         <dbl>
## 1     7  2008     8    35    44   5.92         39.5
```

```
Tiago<- function(dados){
  sd(dados)/mean(dados)
}
```

```
dados %>%
  summarise_if(is.numeric, Tiago)
```

```
## # A tibble: 1 x 7
##   displ year   cyl   cty   hwy sqrt_cty `soma de variáveis`
##   <dbl> <dbl> <dbl> <dbl> <dbl>   <dbl>         <dbl>
## 1 0.372 0.00225 0.274 0.252 0.254   0.125         0.251
```

2.12 group_by()

```
group_by(dados, manufacturer)
```

```
## # A tibble: 234 x 15
## # Groups:   manufacturer [15]
##   manufac~1 model displ year   cyl trans drv   cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct>   <dbl>
## 1 audi      a4      1.8  1999     4 auto~ f    18    29 p    comp~  4.24
## 2 audi      a4      1.8  1999     4 manu~ f    21    29 p    comp~  4.58
## 3 audi      a4      2    2008     4 manu~ f    20    31 p    comp~  4.47
## 4 audi      a4      2    2008     4 auto~ f    21    30 p    comp~  4.58
```

```
## 5 audi      a4      2.8 1999      6 auto~ f      16      26 p      comp~      4
## 6 audi      a4      2.8 1999      6 manu~ f      18      26 p      comp~      4.24
## 7 audi      a4      3.1 2008      6 auto~ f      18      27 p      comp~      4.24
## 8 audi      a4 q~    1.8 1999      4 manu~ 4      18      26 p      comp~      4.24
## 9 audi      a4 q~    1.8 1999      4 auto~ 4      16      25 p      comp~      4
## 10 audi     a4 q~    2      2008      4 manu~ 4      20      28 p      comp~      4.47
## # ... with 224 more rows, 3 more variables: `soma de variáveis` <dbl>,
## #   car <chr>, `cyl / trans` <chr>, and abbreviated variable names
## #   1: manufacturer, 2: sqrt_cty
```

```
dados %>%
  group_by(manufacturer) %>%
  summarise(`num. carros` = n())
```

```
## # A tibble: 15 x 2
##   manufacturer `num. carros`
##   <fct>          <int>
## 1 audi              18
## 2 chevrolet         19
## 3 dodge             37
## 4 ford              25
## 5 honda              9
## 6 hyundai           14
## 7 jeep              8
## 8 land rover         4
## 9 lincoln           3
## 10 mercury           4
## 11 nissan            13
## 12 pontiac           5
## 13 subaru            14
## 14 toyota            34
## 15 volkswagen        27
```

```
dados %>%
  group_by(model) %>%
  summarise(`média hwy` = mean(hwy),
            `min. hwy` = min(hwy),
            `max. hwy` = max(hwy))
```

```
## # A tibble: 38 x 4
##   model          `média hwy` `min. hwy` `max. hwy`
##   <fct>          <dbl>      <int>      <int>
## 1 4runner 4wd      18.8         17         20
## 2 a4              28.3         26         31
```

```
## 3 a4 quattro          25.8      25      28
## 4 a6 quattro          24       23      25
## 5 altima              28.7      26      32
## 6 c1500 suburban 2wd  17.8      15      20
## 7 camry               28.3      26      31
## 8 camry solara        28.1      26      31
## 9 caravan 2wd         22.4      17      24
## 10 civic              32.6      29      36
## # ... with 28 more rows
```

2.13 count()

```
count(dados)
```

```
## # A tibble: 1 x 1
##       n
##   <int>
## 1   234
```

```
dados %>%
  group_by(manufacturer) %>%
  count()
```

```
## # A tibble: 15 x 2
## # Groups:   manufacturer [15]
##   manufacturer      n
##   <fct>          <int>
## 1 audi             18
## 2 chevrolet        19
## 3 dodge            37
## 4 ford             25
## 5 honda             9
## 6 hyundai          14
## 7 jeep              8
## 8 land rover        4
## 9 lincoln           3
## 10 mercury          4
## 11 nissan           13
## 12 pontiac          5
## 13 subaru           14
## 14 toyota           34
## 15 volkswagen       27
```

```
# Equivalente com o código anterior
```

```
dados %>%
  group_by(manufacturer) %>%
  summarise(cars = n())
```

```
## # A tibble: 15 x 2
##   manufacturer cars
##   <fct>         <int>
## 1 audi          18
## 2 chevrolet     19
## 3 dodge         37
## 4 ford          25
## 5 honda          9
## 6 hyundai       14
## 7 jeep          8
## 8 land rover     4
## 9 lincoln        3
## 10 mercury       4
## 11 nissan        13
## 12 pontiac       5
## 13 subaru        14
## 14 toyota        34
## 15 volkswagen    27
```

2.14 sample_n()

```
set.seed(567)
sample_n(dados, size = 10, replace = F)
```

```
## # A tibble: 10 x 15
##   manufac~1 model displ  year  cyl trans drv   cty  hwy fl   class sqrt_~2
##   <fct>    <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 mercury moun~   5   1999    8 auto~ 4    13   17 r    suv    3.61
## 2 chevrolet corv~   7   2008    8 manu~ r    15   24 p    2sea~  3.87
## 3 dodge    ram ~  4.7  2008    8 manu~ 4    12   16 r    pick~  3.46
## 4 toyota   land~  4.7  1999    8 auto~ 4    11   15 r    suv    3.32
## 5 volkswag~ jetta  2    1999    4 auto~ f    19   26 r    comp~  4.36
## 6 dodge    cara~  3.8  1999    6 auto~ f    15   21 r    mini~  3.87
## 7 honda    civic  1.8  2008    4 auto~ f    25   36 r    subc~  5
## 8 ford     must~  4.6  1999    8 auto~ r    15   21 r    subc~  3.87
## 9 chevrolet c150~  5.3  2008    8 auto~ r    14   20 r    suv    3.74
## 10 ford     expe~  5.4  1999    8 auto~ r    11   17 r    suv    3.32
```

```
## # ... with 3 more variables: `soma de variáveis` <dbl>, car <chr>,
## #   `cyl / trans` <chr>, and abbreviated variable names 1: manufacturer,
## #   2: sqrt_cty
```

```
sample_n(dados, size = 10, replace = T)
```

```
## # A tibble: 10 x 15
##   manufac~1 model displ year   cyl trans drv   cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 chevrolet c150~  5.3  2008     8 auto~ r     11    15 e   suv     3.32
## 2 volkwag~ gti    2    2008     4 auto~ f     22    29 p   comp~  4.69
## 3 dodge     dako~  4.7  2008     8 auto~ 4     14    19 r   pick~  3.74
## 4 ford      expl~  4.6  2008     8 auto~ 4     13    19 r   suv     3.61
## 5 dodge     cara~  3.8  2008     6 auto~ f     16    23 r   mini~  4
## 6 chevrolet k150~  5.3  2008     8 auto~ 4     14    19 r   suv     3.74
## 7 dodge     dura~  5.2  1999     8 auto~ 4     11    16 r   suv     3.32
## 8 toyota    camry  2.4  2008     4 manu~ f     21    31 r   mids~  4.58
## 9 toyota    camry  3    1999     6 manu~ f     18    26 r   mids~  4.24
## 10 subaru   impr~  2.2  1999     4 auto~ 4     21    26 r   subc~  4.58
## # ... with 3 more variables: `soma de variáveis` <dbl>, car <chr>,
## #   `cyl / trans` <chr>, and abbreviated variable names 1: manufacturer,
## #   2: sqrt_cty
```

2.15 sample_frac()

```
sample_frac(dados, size = 0.1, replace = F)
```

```
## # A tibble: 23 x 15
##   manufac~1 model displ year   cyl trans drv   cty   hwy fl   class sqrt_~2
##   <fct>      <fct> <dbl> <int> <int> <fct> <fct> <int> <int> <fct> <fct> <dbl>
## 1 toyota    coro~  1.8  2008     4 manu~ f     28    37 r   comp~  5.29
## 2 lincoln   navi~  5.4  1999     8 auto~ r     11    17 r   suv     3.32
## 3 honda     civic  1.6  1999     4 auto~ f     24    32 r   subc~  4.90
## 4 audi      a6 q~  2.8  1999     6 auto~ 4     15    24 p   mids~  3.87
## 5 nissan     path~  4    2008     6 auto~ 4     14    20 p   suv     3.74
## 6 toyota    camry  3.5  2008     6 auto~ f     19    28 r   mids~  4.36
## 7 subaru    impr~  2.5  2008     4 auto~ 4     20    25 p   comp~  4.47
## 8 toyota    toyo~  3.4  1999     6 auto~ 4     15    19 r   pick~  3.87
## 9 audi      a4 q~  3.1  2008     6 manu~ 4     15    25 p   comp~  3.87
## 10 toyota    coro~  1.8  1999     4 manu~ f     26    35 r   comp~  5.10
## # ... with 13 more rows, 3 more variables: `soma de variáveis` <dbl>,
## #   car <chr>, `cyl / trans` <chr>, and abbreviated variable names
## #   1: manufacturer, 2: sqrt_cty
```


Capítulo 3

ggplot2 (60 minutos)

Alguns links

The R Graph Gallery

120 registered extensions available to explore

link 1: patchwork

link 2: patchwork

3.1 Lista de funções do pacote ggplot2

```
ls("package:ggplot2")
```

```
## [1] "%+%"          "%+replace%"
## [3] "aes"           "aes_"
## [5] "aes_all"       "aes_auto"
## [7] "aes_q"         "aes_string"
## [9] "after_scale"   "after_stat"
## [11] "alpha"         "annotate"
## [13] "annotation_custom" "annotation_logticks"
## [15] "annotation_map" "annotation_raster"
## [17] "arrow"         "as_label"
## [19] "as_labeller"   "autolayer"
## [21] "autoplot"      "AxisSecondary"
## [23] "benchplot"     "binned_scale"
## [25] "borders"       "calc_element"
## [27] "combine_vars"  "continuous_scale"
```

## [29] "Coord"	"coord_cartesian"
## [31] "coord_equal"	"coord_fixed"
## [33] "coord_flip"	"coord_map"
## [35] "coord_munch"	"coord_polar"
## [37] "coord_quickmap"	"coord_sf"
## [39] "coord_trans"	"CoordCartesian"
## [41] "CoordFixed"	"CoordFlip"
## [43] "CoordMap"	"CoordPolar"
## [45] "CoordQuickmap"	"CoordSf"
## [47] "CoordTrans"	"cut_interval"
## [49] "cut_number"	"cut_width"
## [51] "derive"	"diamonds"
## [53] "discrete_scale"	"draw_key_abline"
## [55] "draw_key_blank"	"draw_key_boxplot"
## [57] "draw_key_crossbar"	"draw_key_dotplot"
## [59] "draw_key_label"	"draw_key_linerange"
## [61] "draw_key_path"	"draw_key_point"
## [63] "draw_key_pointrange"	"draw_key_polygon"
## [65] "draw_key_rect"	"draw_key_smooth"
## [67] "draw_key_text"	"draw_key_timeseries"
## [69] "draw_key_vline"	"draw_key_vpath"
## [71] "dup_axis"	"economics"
## [73] "economics_long"	"el_def"
## [75] "element_blank"	"element_grob"
## [77] "element_line"	"element_rect"
## [79] "element_render"	"element_text"
## [81] "enexpr"	"enexprs"
## [83] "enquo"	"enquos"
## [85] "ensym"	"ensyms"
## [87] "expand_limits"	"expand_scale"
## [89] "expansion"	"expr"
## [91] "Facet"	"facet_grid"
## [93] "facet_null"	"facet_wrap"
## [95] "FacetGrid"	"FacetNull"
## [97] "FacetWrap"	"faithfuld"
## [99] "find_panel"	"flip_data"
## [101] "flipped_names"	"fortify"
## [103] "Geom"	"geom_abline"
## [105] "geom_area"	"geom_bar"
## [107] "geom_bin_2d"	"geom_bin2d"
## [109] "geom_blank"	"geom_boxplot"
## [111] "geom_col"	"geom_contour"
## [113] "geom_contour_filled"	"geom_count"
## [115] "geom_crossbar"	"geom_curve"
## [117] "geom_density"	"geom_density_2d"
## [119] "geom_density_2d_filled"	"geom_density2d"


```

## [121] "geom_density2d_filled"      "geom_dotplot"
## [123] "geom_errorbar"             "geom_errorbarh"
## [125] "geom_freqpoly"             "geom_function"
## [127] "geom_hex"                  "geom_histogram"
## [129] "geom_hline"                "geom_jitter"
## [131] "geom_label"                "geom_line"
## [133] "geom_linerange"            "geom_map"
## [135] "geom_path"                 "geom_point"
## [137] "geom_pointrange"           "geom_polygon"
## [139] "geom_qq"                   "geom_qq_line"
## [141] "geom_quantile"             "geom_raster"
## [143] "geom_rect"                 "geom_ribbon"
## [145] "geom_rug"                  "geom_segment"
## [147] "geom_sf"                   "geom_sf_label"
## [149] "geom_sf_text"              "geom_smooth"
## [151] "geom_spoke"                 "geom_step"
## [153] "geom_text"                 "geom_tile"
## [155] "geom_violin"               "geom_vline"
## [157] "GeomAblin"                 "GeomAnnotationMap"
## [159] "GeomArea"                  "GeomBar"
## [161] "GeomBlank"                 "GeomBoxplot"
## [163] "GeomCol"                   "GeomContour"
## [165] "GeomContourFilled"         "GeomCrossbar"
## [167] "GeomCurve"                 "GeomCustomAnn"
## [169] "GeomDensity"               "GeomDensity2d"
## [171] "GeomDensity2dFilled"       "GeomDotplot"
## [173] "GeomErrorbar"              "GeomErrorbarh"
## [175] "GeomFunction"              "GeomHex"
## [177] "GeomHline"                 "GeomLabel"
## [179] "GeomLine"                  "GeomLinerange"
## [181] "GeomLogticks"              "GeomMap"
## [183] "GeomPath"                  "GeomPoint"
## [185] "GeomPointrange"            "GeomPolygon"
## [187] "GeomQuantile"              "GeomRaster"
## [189] "GeomRasterAnn"             "GeomRect"
## [191] "GeomRibbon"                "GeomRug"
## [193] "GeomSegment"               "GeomSf"
## [195] "GeomSmooth"                "GeomSpoke"
## [197] "GeomStep"                  "GeomText"
## [199] "GeomTile"                  "GeomViolin"
## [201] "GeomVline"                 "get_alt_text"
## [203] "get_element_tree"          "gg_dep"
## [205] "ggplot"                    "ggplot_add"
## [207] "ggplot_build"              "ggplot_gtable"
## [209] "ggplotGrob"                "ggproto"
## [211] "ggproto_parent"            "ggsave"

```

## [213]	"ggtitle"	"guide_axis"
## [215]	"guide_bins"	"guide_colorbar"
## [217]	"guide_colorsteps"	"guide_colourbar"
## [219]	"guide_coloursteps"	"guide_gengrob"
## [221]	"guide_geom"	"guide_legend"
## [223]	"guide_merge"	"guide_none"
## [225]	"guide_train"	"guide_transform"
## [227]	"guides"	"has_flipped_aes"
## [229]	"is.Coord"	"is.facet"
## [231]	"is.ggplot"	"is.ggproto"
## [233]	"is.theme"	"label_both"
## [235]	"label_bquote"	"label_context"
## [237]	"label_parsed"	"label_value"
## [239]	"label_wrap_gen"	"labeller"
## [241]	"labs"	"last_plot"
## [243]	"layer"	"layer_data"
## [245]	"layer_grob"	"layer_scales"
## [247]	"layer_sf"	"Layout"
## [249]	"lims"	"luv_colours"
## [251]	"map_data"	"margin"
## [253]	"max_height"	"max_width"
## [255]	"mean_cl_boot"	"mean_cl_normal"
## [257]	"mean_sdl"	"mean_se"
## [259]	"median_hilow"	"merge_element"
## [261]	"midwest"	"mpg"
## [263]	"msleep"	"panel_cols"
## [265]	"panel_rows"	"Position"
## [267]	"position_dodge"	"position_dodge2"
## [269]	"position_fill"	"position_identity"
## [271]	"position_jitter"	"position_jitterdodge"
## [273]	"position_nudge"	"position_stack"
## [275]	"PositionDodge"	"PositionDodge2"
## [277]	"PositionFill"	"PositionIdentity"
## [279]	"PositionJitter"	"PositionJitterdodge"
## [281]	"PositionNudge"	"PositionStack"
## [283]	"presidential"	"qplot"
## [285]	"quickplot"	"quo"
## [287]	"quo_name"	"quos"
## [289]	"register_theme_elements"	"rel"
## [291]	"remove_missing"	"render_axes"
## [293]	"render_strips"	"reset_theme_settings"
## [295]	"resolution"	"Scale"
## [297]	"scale_alpha"	"scale_alpha_binned"
## [299]	"scale_alpha_continuous"	"scale_alpha_date"
## [301]	"scale_alpha_datetime"	"scale_alpha_discrete"
## [303]	"scale_alpha_identity"	"scale_alpha_manual"

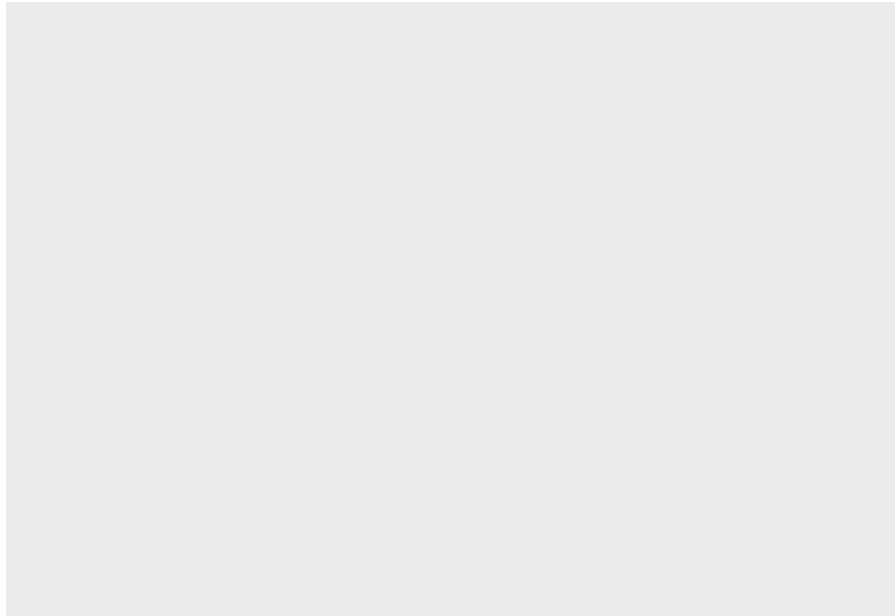
## [305]	"scale_alpha_ordinal"	"scale_color_binned"
## [307]	"scale_color_brewer"	"scale_color_continuous"
## [309]	"scale_color_date"	"scale_color_datetime"
## [311]	"scale_color_discrete"	"scale_color_distiller"
## [313]	"scale_color_fermenter"	"scale_color_gradient"
## [315]	"scale_color_gradient2"	"scale_color_gradientn"
## [317]	"scale_color_grey"	"scale_color_hue"
## [319]	"scale_color_identity"	"scale_color_manual"
## [321]	"scale_color_ordinal"	"scale_color_steps"
## [323]	"scale_color_steps2"	"scale_color_stepsn"
## [325]	"scale_color_viridis_b"	"scale_color_viridis_c"
## [327]	"scale_color_viridis_d"	"scale_colour_binned"
## [329]	"scale_colour_brewer"	"scale_colour_continuous"
## [331]	"scale_colour_date"	"scale_colour_datetime"
## [333]	"scale_colour_discrete"	"scale_colour_distiller"
## [335]	"scale_colour_fermenter"	"scale_colour_gradient"
## [337]	"scale_colour_gradient2"	"scale_colour_gradientn"
## [339]	"scale_colour_grey"	"scale_colour_hue"
## [341]	"scale_colour_identity"	"scale_colour_manual"
## [343]	"scale_colour_ordinal"	"scale_colour_steps"
## [345]	"scale_colour_steps2"	"scale_colour_stepsn"
## [347]	"scale_colour_viridis_b"	"scale_colour_viridis_c"
## [349]	"scale_colour_viridis_d"	"scale_continuous_identity"
## [351]	"scale_discrete_identity"	"scale_discrete_manual"
## [353]	"scale_fill_binned"	"scale_fill_brewer"
## [355]	"scale_fill_continuous"	"scale_fill_date"
## [357]	"scale_fill_datetime"	"scale_fill_discrete"
## [359]	"scale_fill_distiller"	"scale_fill_fermenter"
## [361]	"scale_fill_gradient"	"scale_fill_gradient2"
## [363]	"scale_fill_gradientn"	"scale_fill_grey"
## [365]	"scale_fill_hue"	"scale_fill_identity"
## [367]	"scale_fill_manual"	"scale_fill_ordinal"
## [369]	"scale_fill_steps"	"scale_fill_steps2"
## [371]	"scale_fill_stepsn"	"scale_fill_viridis_b"
## [373]	"scale_fill_viridis_c"	"scale_fill_viridis_d"
## [375]	"scale_linetype"	"scale_linetype_binned"
## [377]	"scale_linetype_continuous"	"scale_linetype_discrete"
## [379]	"scale_linetype_identity"	"scale_linetype_manual"
## [381]	"scale_linewidth"	"scale_linewidth_binned"
## [383]	"scale_linewidth_continuous"	"scale_linewidth_date"
## [385]	"scale_linewidth_datetime"	"scale_linewidth_discrete"
## [387]	"scale_linewidth_ordinal"	"scale_radius"
## [389]	"scale_shape"	"scale_shape_binned"
## [391]	"scale_shape_continuous"	"scale_shape_discrete"
## [393]	"scale_shape_identity"	"scale_shape_manual"
## [395]	"scale_shape_ordinal"	"scale_size"

## [397] "scale_size_area"	"scale_size_binned"
## [399] "scale_size_binned_area"	"scale_size_continuous"
## [401] "scale_size_date"	"scale_size_datetime"
## [403] "scale_size_discrete"	"scale_size_identity"
## [405] "scale_size_manual"	"scale_size_ordinal"
## [407] "scale_type"	"scale_x_binned"
## [409] "scale_x_continuous"	"scale_x_date"
## [411] "scale_x_datetime"	"scale_x_discrete"
## [413] "scale_x_log10"	"scale_x_reverse"
## [415] "scale_x_sqrt"	"scale_x_time"
## [417] "scale_y_binned"	"scale_y_continuous"
## [419] "scale_y_date"	"scale_y_datetime"
## [421] "scale_y_discrete"	"scale_y_log10"
## [423] "scale_y_reverse"	"scale_y_sqrt"
## [425] "scale_y_time"	"ScaleBinned"
## [427] "ScaleBinnedPosition"	"ScaleContinuous"
## [429] "ScaleContinuousDate"	"ScaleContinuousDatetime"
## [431] "ScaleContinuousIdentity"	"ScaleContinuousPosition"
## [433] "ScaleDiscrete"	"ScaleDiscreteIdentity"
## [435] "ScaleDiscretePosition"	"seals"
## [437] "sec_axis"	"set_last_plot"
## [439] "sf_transform_xy"	"should_stop"
## [441] "stage"	"standardise_aes_names"
## [443] "stat"	"Stat"
## [445] "stat_align"	"stat_bin"
## [447] "stat_bin_2d"	"stat_bin_hex"
## [449] "stat_bin2d"	"stat_binhex"
## [451] "stat_boxplot"	"stat_contour"
## [453] "stat_contour_filled"	"stat_count"
## [455] "stat_density"	"stat_density_2d"
## [457] "stat_density_2d_filled"	"stat_density2d"
## [459] "stat_density2d_filled"	"stat_ecdf"
## [461] "stat_ellipse"	"stat_function"
## [463] "stat_identity"	"stat_qq"
## [465] "stat_qq_line"	"stat_quantile"
## [467] "stat_sf"	"stat_sf_coordinates"
## [469] "stat_smooth"	"stat_spoke"
## [471] "stat_sum"	"stat_summary"
## [473] "stat_summary_2d"	"stat_summary_bin"
## [475] "stat_summary_hex"	"stat_summary2d"
## [477] "stat_unique"	"stat_ydensity"
## [479] "StatAlign"	"StatBin"
## [481] "StatBin2d"	"StatBindot"
## [483] "StatBinhex"	"StatBoxplot"
## [485] "StatContour"	"StatContourFilled"
## [487] "StatCount"	"StatDensity"

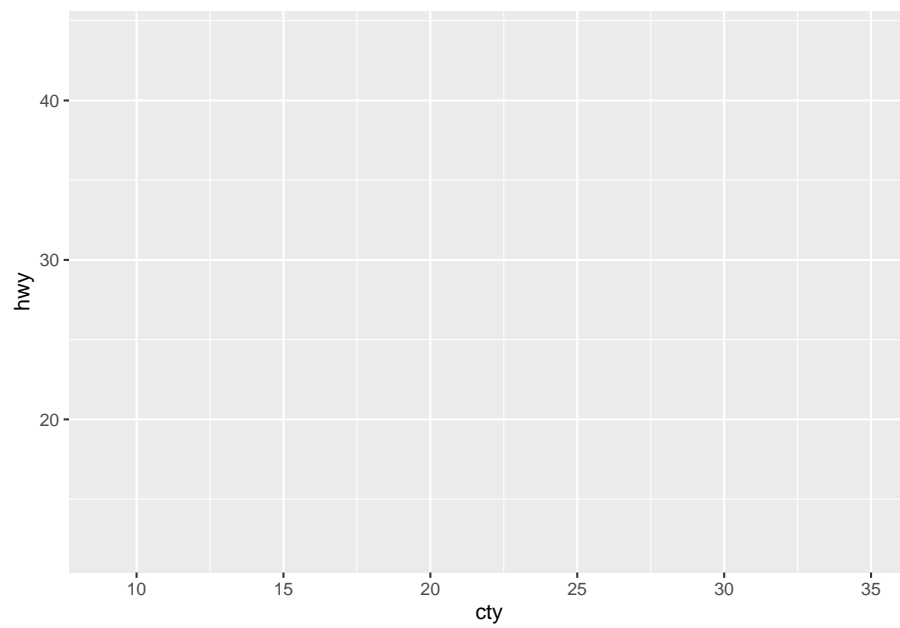
```
## [489] "StatDensity2d"           "StatDensity2dFilled"
## [491] "StatEcdf"                "StatEllipse"
## [493] "StatFunction"           "StatIdentity"
## [495] "StatQq"                  "StatQqLine"
## [497] "StatQuantile"           "StatSf"
## [499] "StatSfCoordinates"      "StatSmooth"
## [501] "StatSum"                 "StatSummary"
## [503] "StatSummary2d"          "StatSummaryBin"
## [505] "StatSummaryHex"         "StatUnique"
## [507] "StatYdensity"           "summarise_coord"
## [509] "summarise_layers"       "summarise_layout"
## [511] "sym"                     "syms"
## [513] "theme"                   "theme_bw"
## [515] "theme_classic"          "theme_dark"
## [517] "theme_get"              "theme_gray"
## [519] "theme_grey"             "theme_light"
## [521] "theme_linedraw"         "theme_minimal"
## [523] "theme_replace"          "theme_set"
## [525] "theme_test"             "theme_update"
## [527] "theme_void"             "transform_position"
## [529] "txhousing"              "unit"
## [531] "update_geom_defaults"   "update_labels"
## [533] "update_stat_defaults"   "vars"
## [535] "waiver"                 "wrap_dims"
## [537] "xlab"                   "xlim"
## [539] "ylab"                   "ylim"
## [541] "zeroGrob"
```

3.2 Primeiros passos usando geom_point

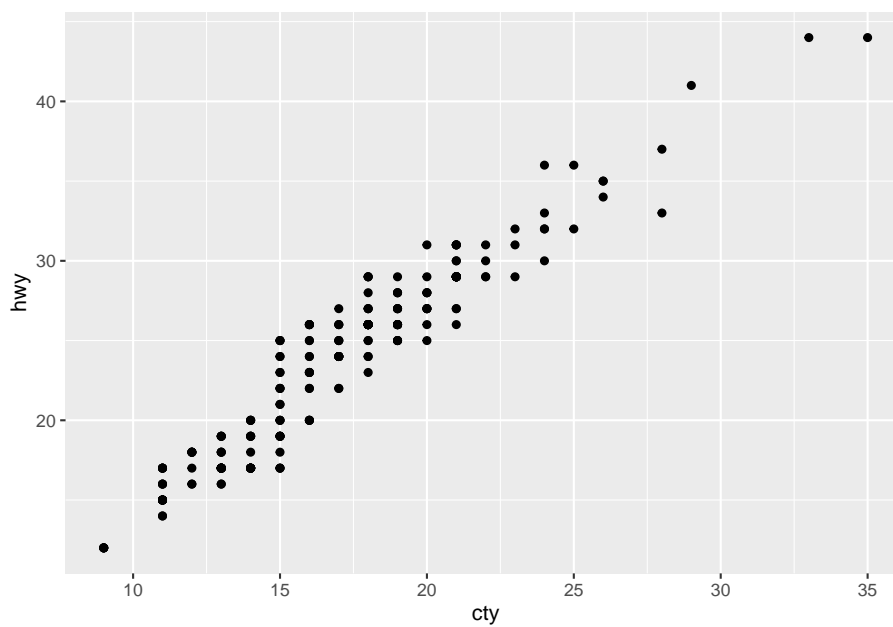
```
ggplot(dados)
```



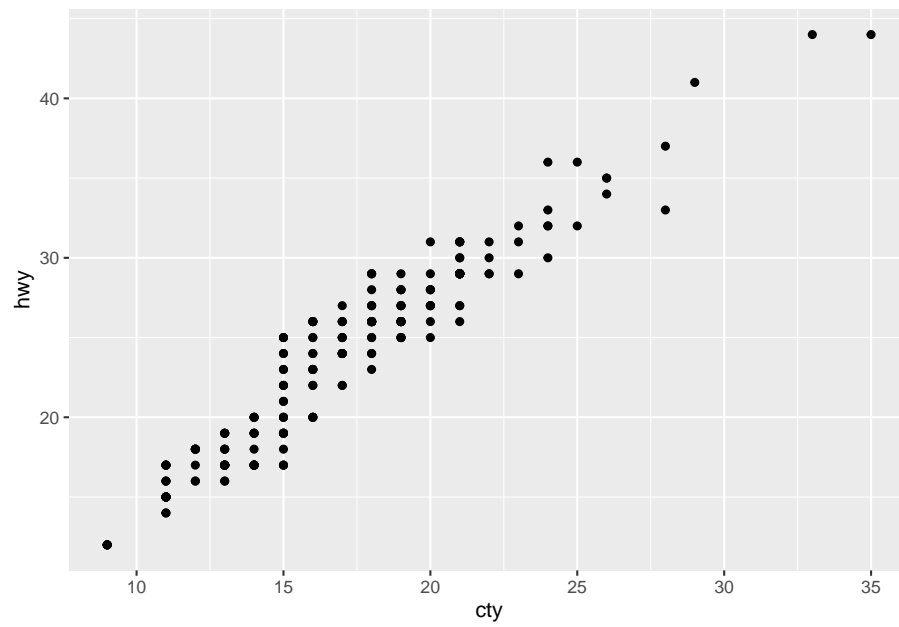
```
ggplot(dados, aes(x = cty, y = hwy))
```



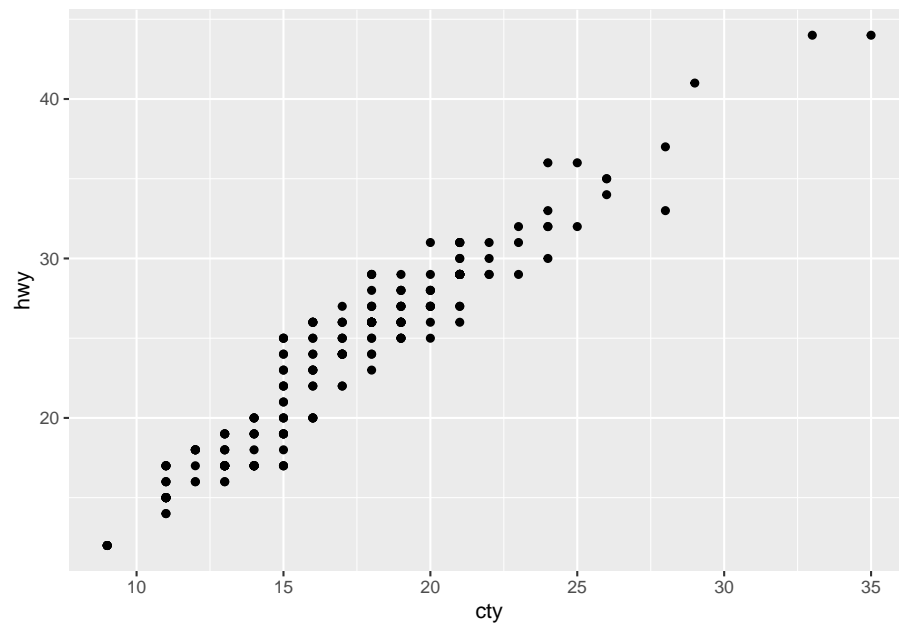
```
# Alternativas  
ggplot(dados, aes(x = cty, y = hwy)) +  
  geom_point()
```



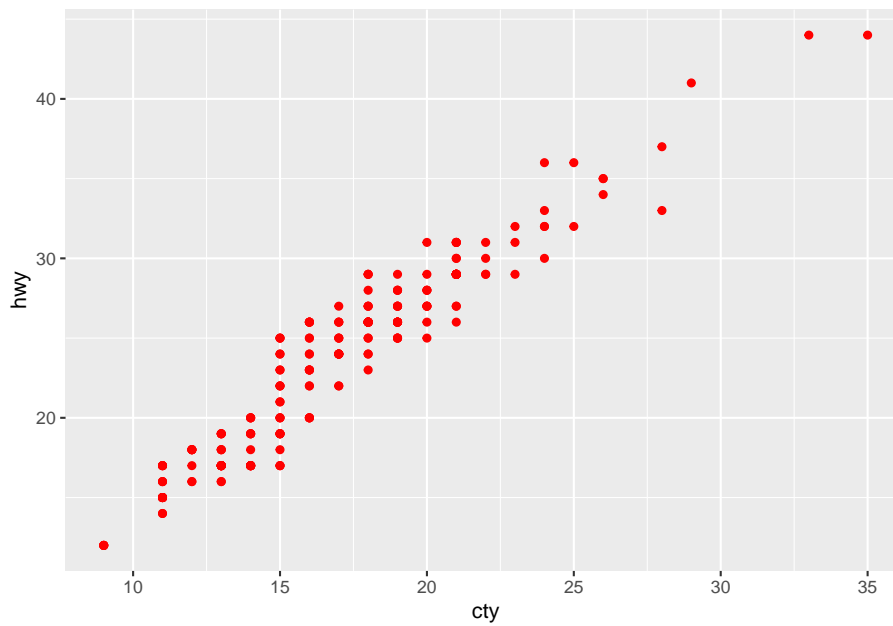
```
ggplot(dados) +  
  geom_point(aes(x = cty, y = hwy))
```



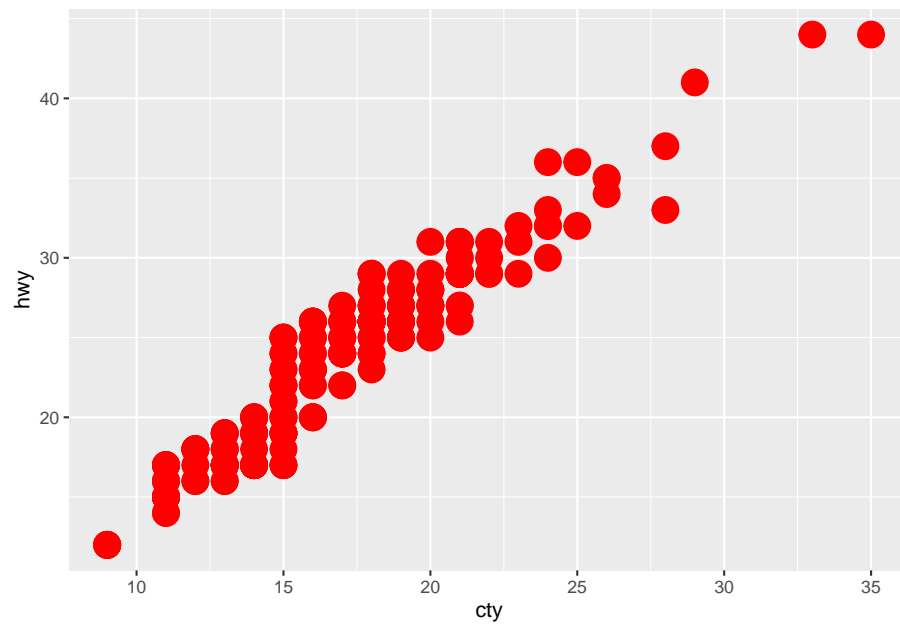
```
ggplot() +  
  geom_point(data = dados, aes(x = cty, y = hwy))
```



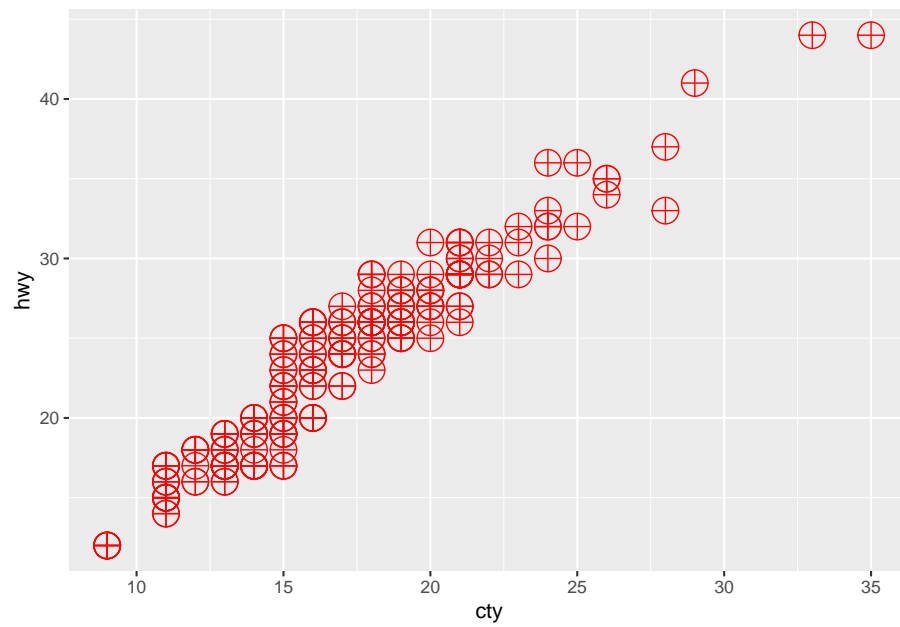

```
# Fim  
ggplot(dados, aes(x = cty, y = hwy)) +  
  geom_point(colour = "red")
```



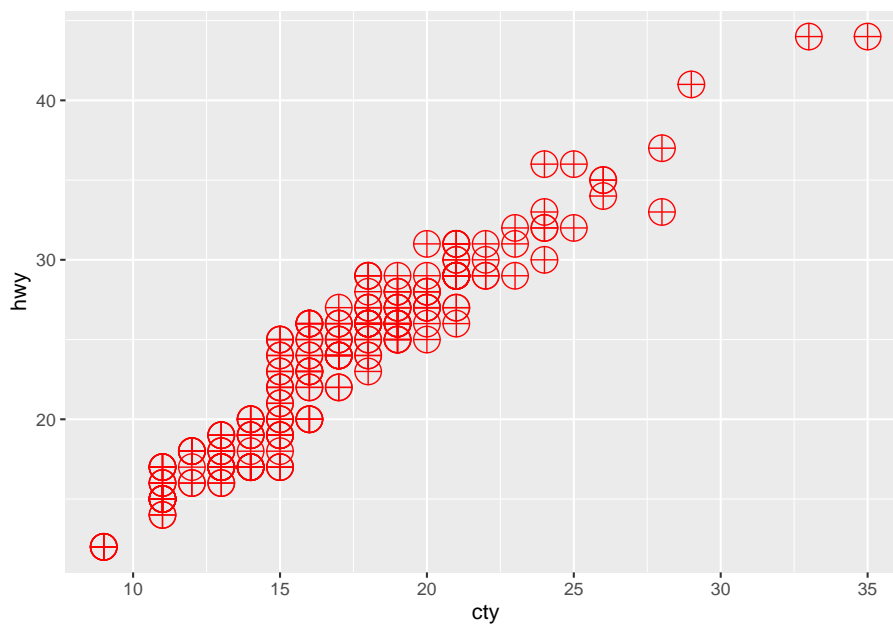
```
ggplot(dados, aes(x = cty, y = hwy)) +  
  geom_point(colour = "red", size = 6)
```



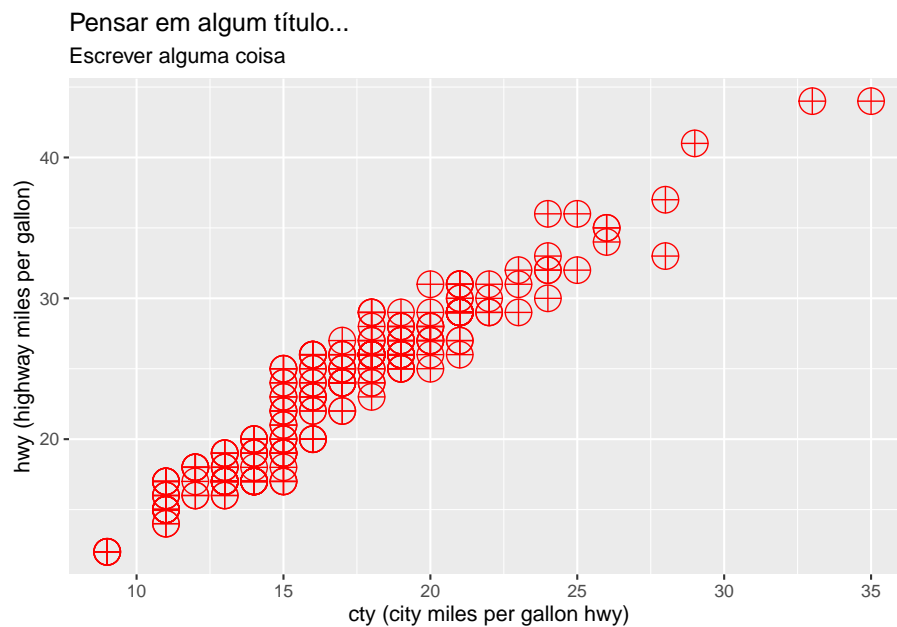
```
ggplot(dados, aes(x = cty, y = hwy)) +  
  geom_point(colour = "red", size = 6, shape = 10)
```



```
# Alternativa
ggplot(dados, aes(x = cty, y = hwy)) +
  geom_point(colour = "red", size = 6, shape = "circle plus")
```



```
ggplot(dados, aes(x = cty, y = hwy)) +
  geom_point(colour = "red", size = 6, shape = 10) +
  labs(x = "cty (city miles per gallon hwy)",
       y = "hwy (highway miles per gallon)",
       title = "Pensar em algum titulo...",
       subtitle = "Escrever alguma coisa")
```

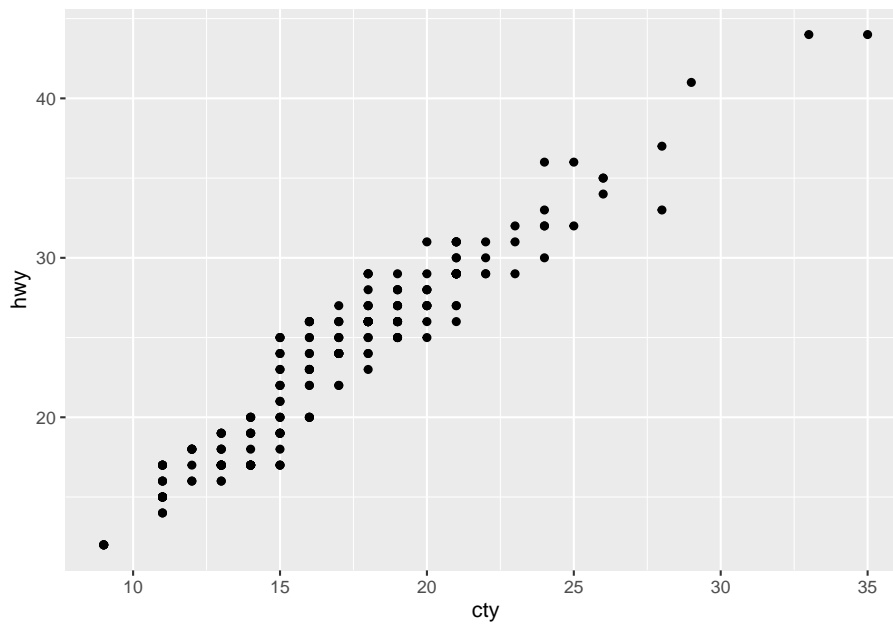


3.2.1 Mais detalhes sobre `geom_point`

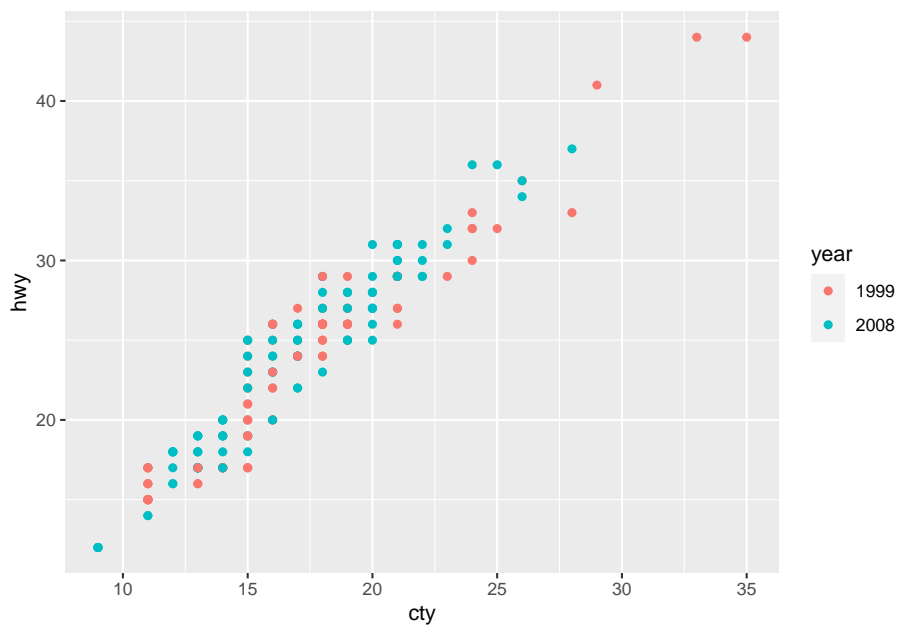
`geom_point()` understands the following aesthetics (required aesthetics are in bold):

- **x**
- **y**
- alpha
- colour
- fill
- group
- shape
- size
- stroke

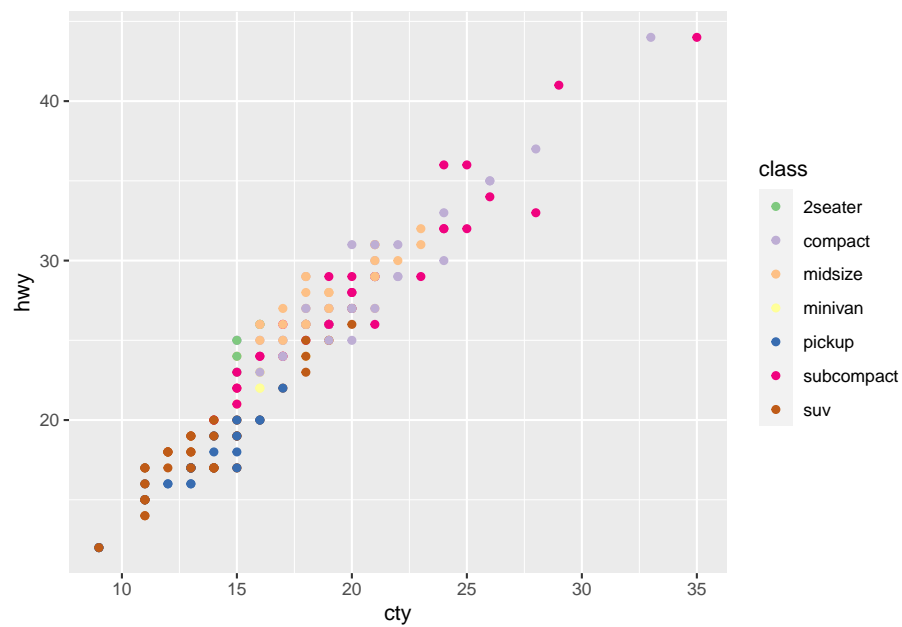
```
ggplot(dados, aes(x = cty, y = hwy)) +  
  geom_point()
```



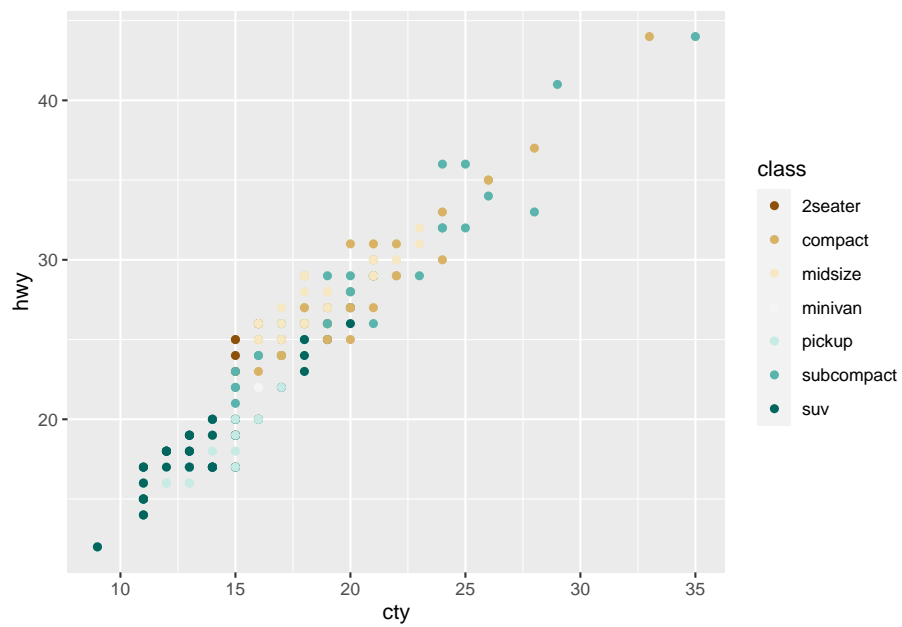
```
ggplot(dados, aes(x = cty, y = hwy, col = factor(year))) +  
  geom_point() +  
  labs(col = "year")
```



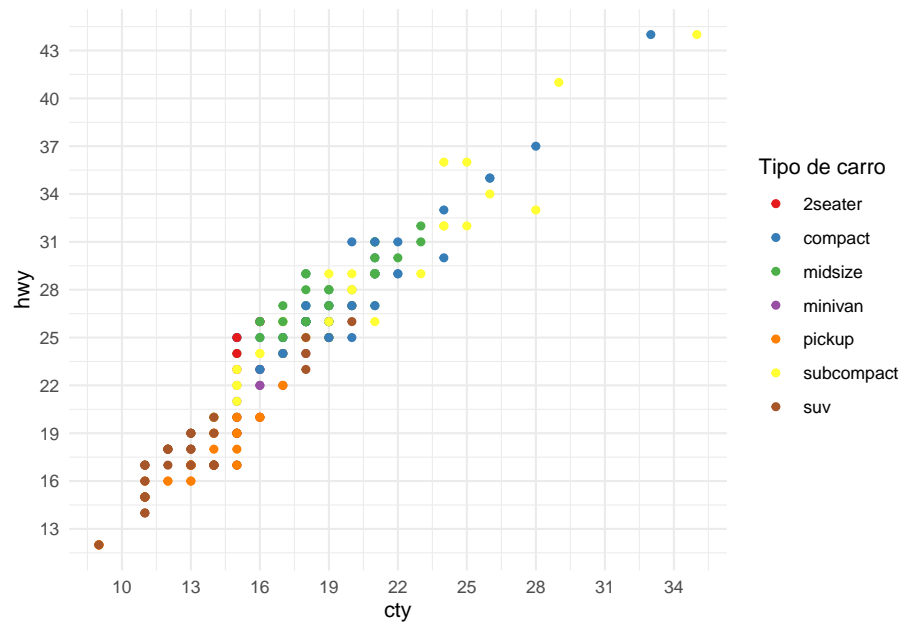
```
# Alternativa
ggplot(dados, aes(x = cty, y = hwy, col = factor(class))) +
  geom_point() +
  labs(col = "class")+
  scale_color_brewer(type = "qual")
```



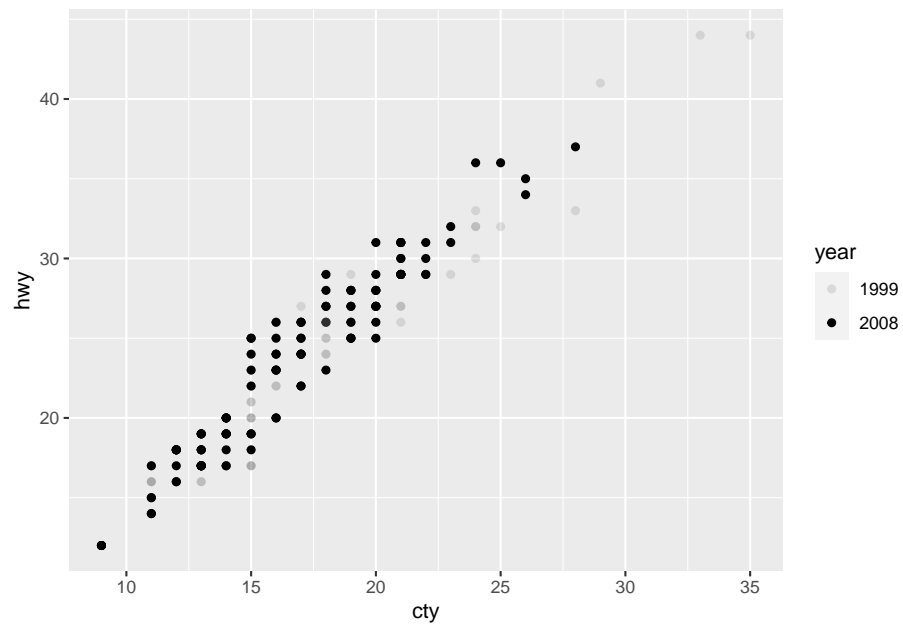
```
ggplot(dados, aes(x = cty, y = hwy, col = factor(class))) +
  geom_point() +
  labs(col = "class")+
  scale_color_brewer(type = "div")
```



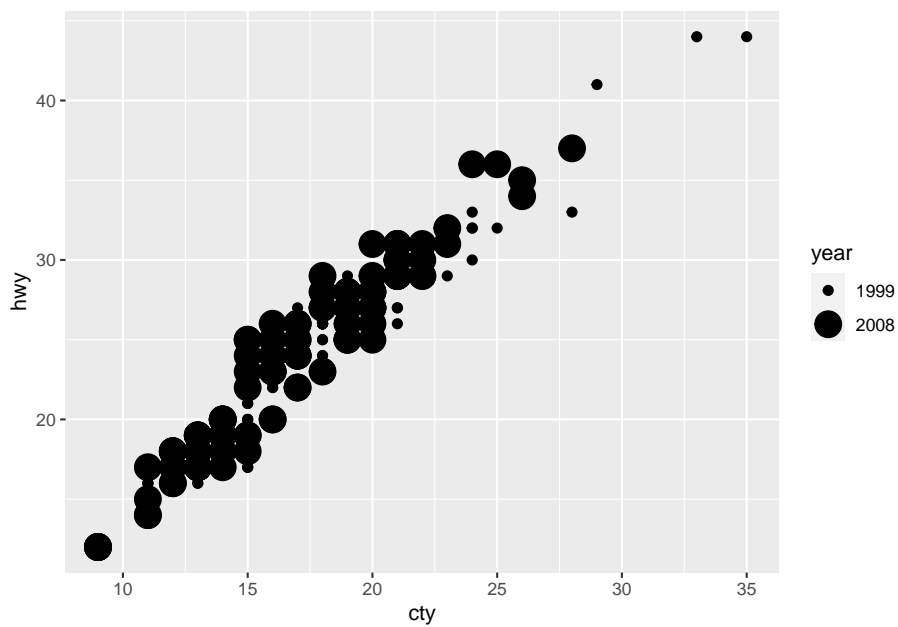
```
ggplot(dados, aes(x = cty, y = hwy, col = factor(class))) +  
  geom_point() +  
  labs(col = "class") +  
  scale_color_brewer(palette = "Set1", name = "Tipo de carro") +  
  scale_y_continuous(breaks = seq(10, 60, 3)) +  
  scale_x_continuous(breaks = seq(10, 40, 3)) +  
  theme_minimal()
```



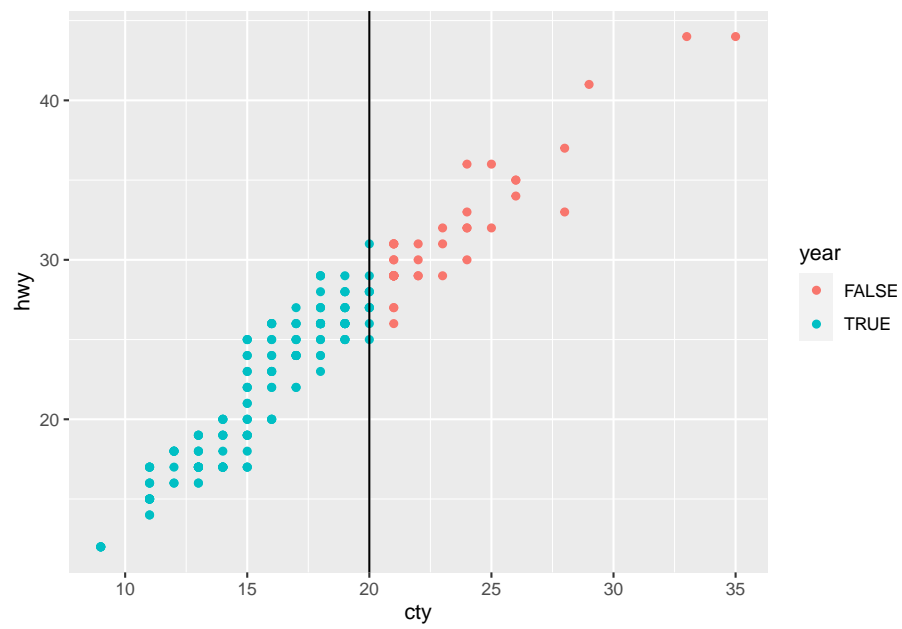
```
ggplot(dados, aes(x = cty, y = hwy, alpha = factor(year))) +  
  geom_point() +  
  labs(alpha = "year")
```




```
ggplot(dados, aes(x = cty, y = hwy, size = factor(year))) +  
  geom_point() +  
  labs(size = "year")
```

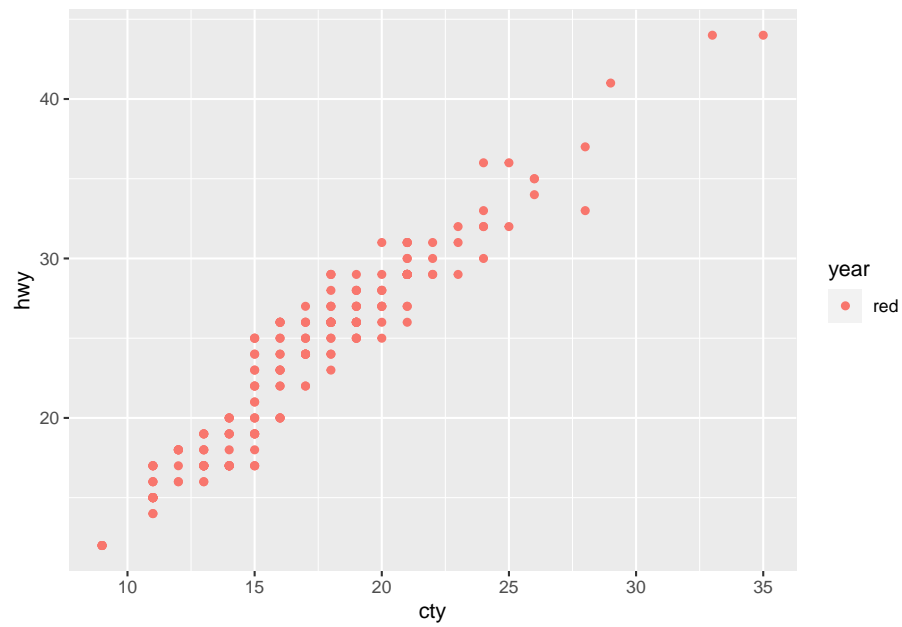


```
# Alternativa  
ggplot(dados, aes(x = cty, y = hwy, col = cty <= 20)) +  
  geom_point() +  
  geom_vline(xintercept = 20)+  
  labs(col = "year")
```

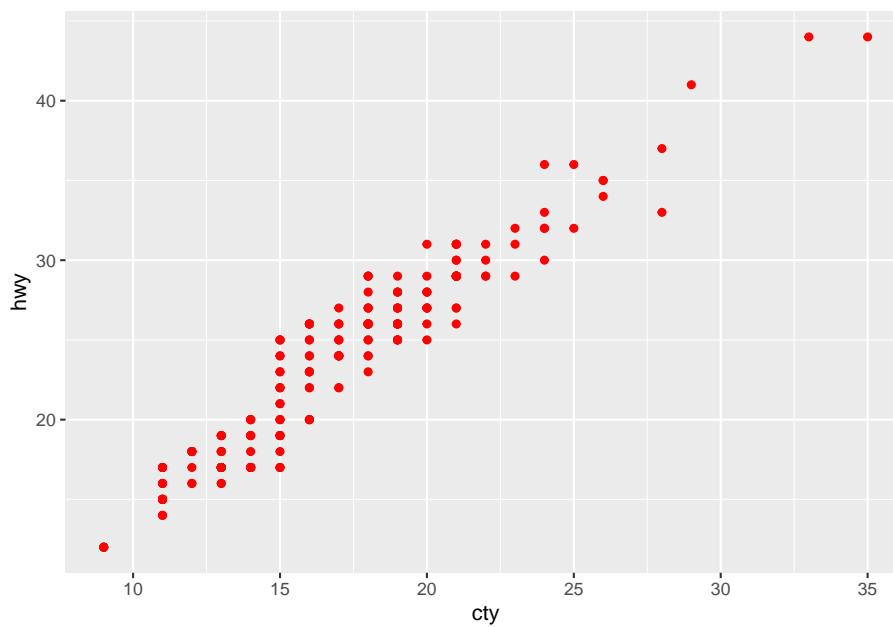


```
# Erro comum
```

```
ggplot(dados, aes(x = cty, y = hwy, col = "red")) +  
  geom_point()+  
  labs(col = "year")
```

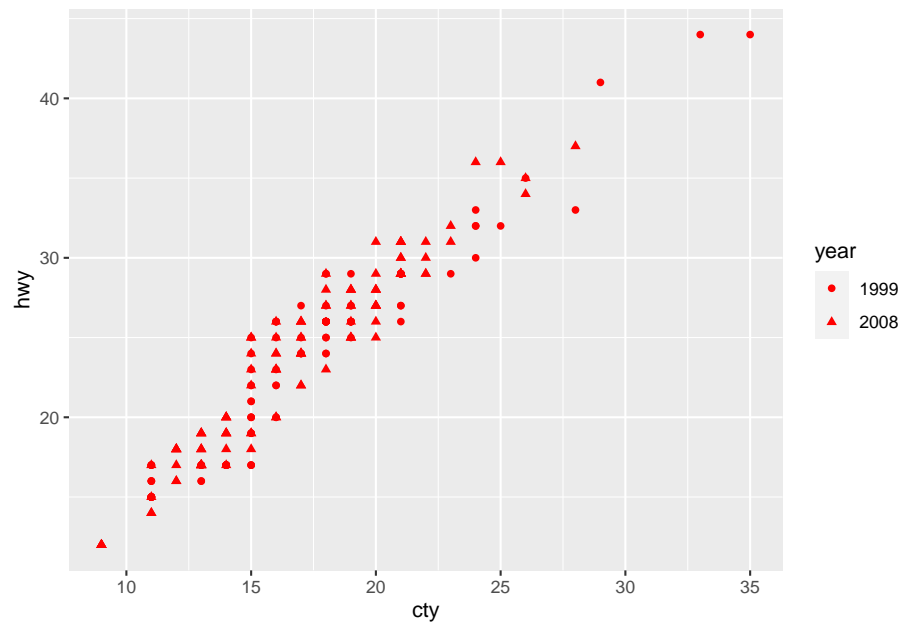


```
ggplot(dados, aes(x = cty, y = hwy)) +  
  geom_point(col = "red")+  
  labs(col = "year")
```

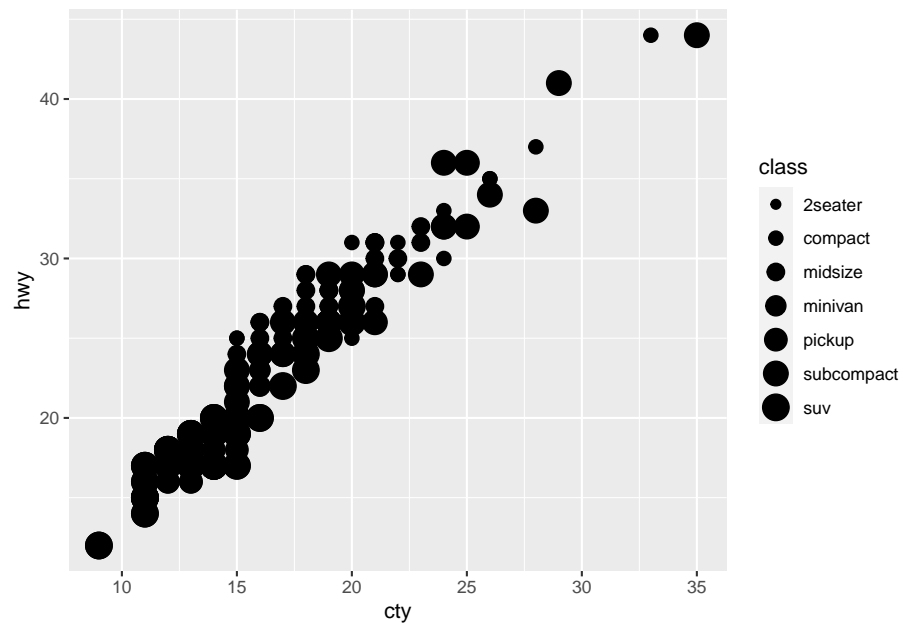


```
# Fim Erro comum
```

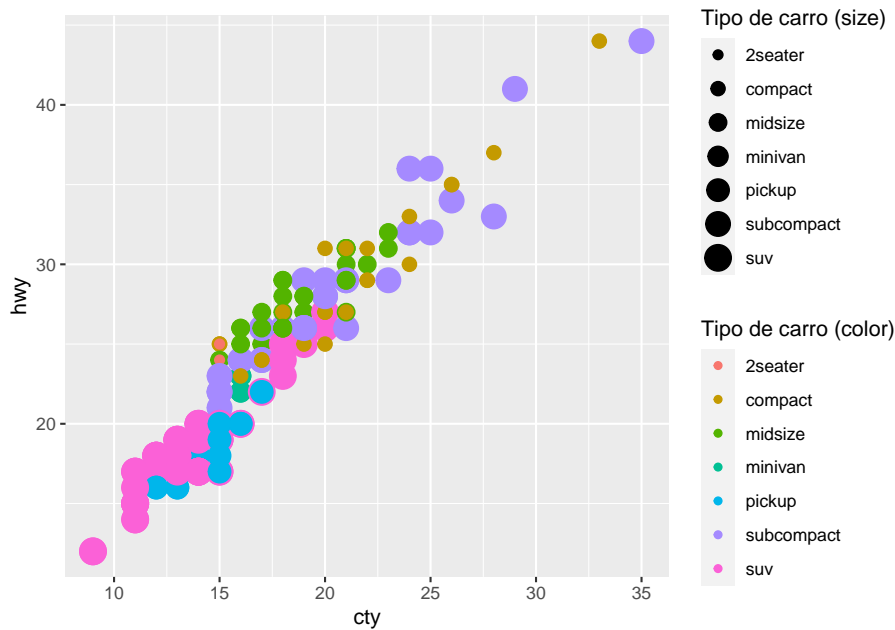
```
ggplot(dados, aes(x = cty, y = hwy, shape = factor(year))) +  
  geom_point(col = "red") +  
  labs(shape = "year")
```



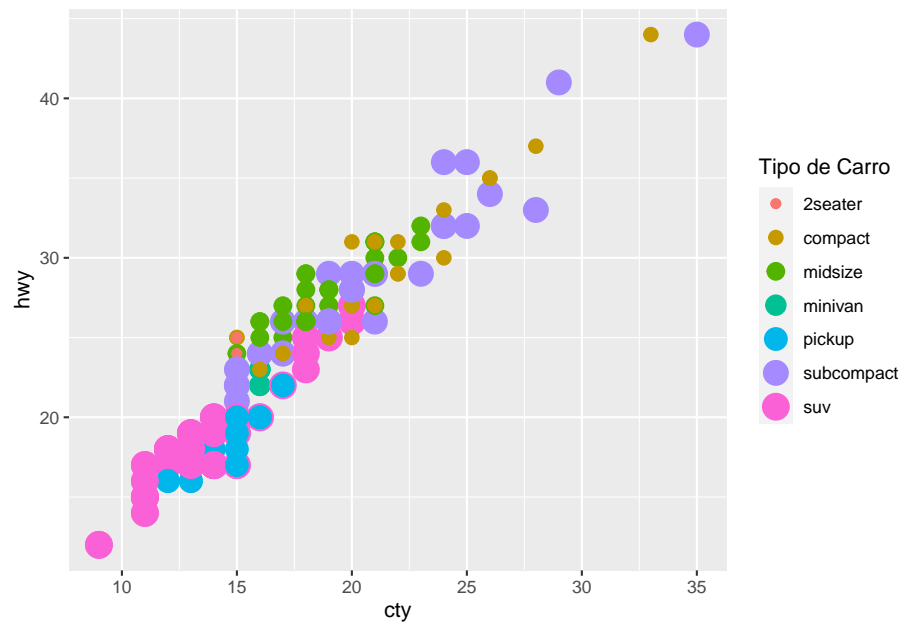
```
ggplot(dados, aes(x = cty, y = hwy, size = class)) +  
  geom_point() +  
  labs(size = "class")
```



```
ggplot(dados, aes(x = cty, y = hwy,
                  size = class,
                  col = class)) +
  geom_point() +
  guides(colour = guide_legend("Tipo de carro (color)"),
         size = guide_legend("Tipo de carro (size)"))
```

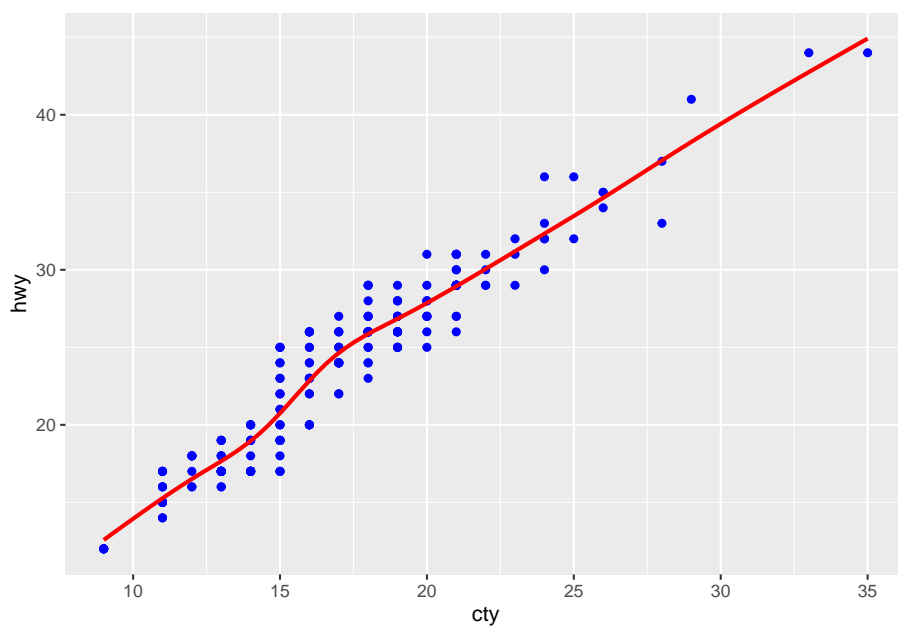


```
ggplot(dados, aes(x = cty, y = hwy,
                  size = class,
                  col = class)) +
  geom_point() +
  labs(col = "Tipo de Carro", size = "Tipo de Carro")+
  guides(col = "legend")
```

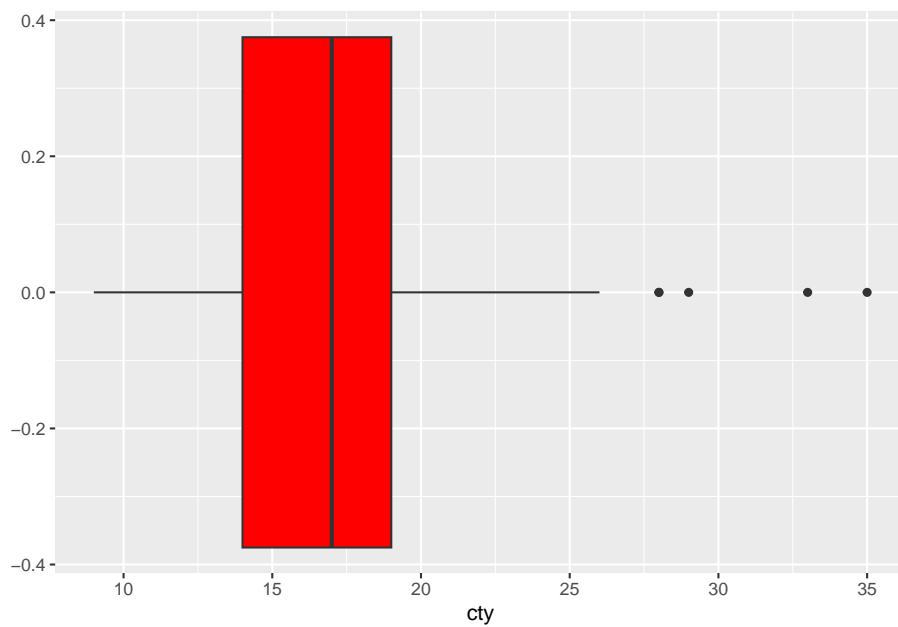


3.3 smooth, boxplot, histogram

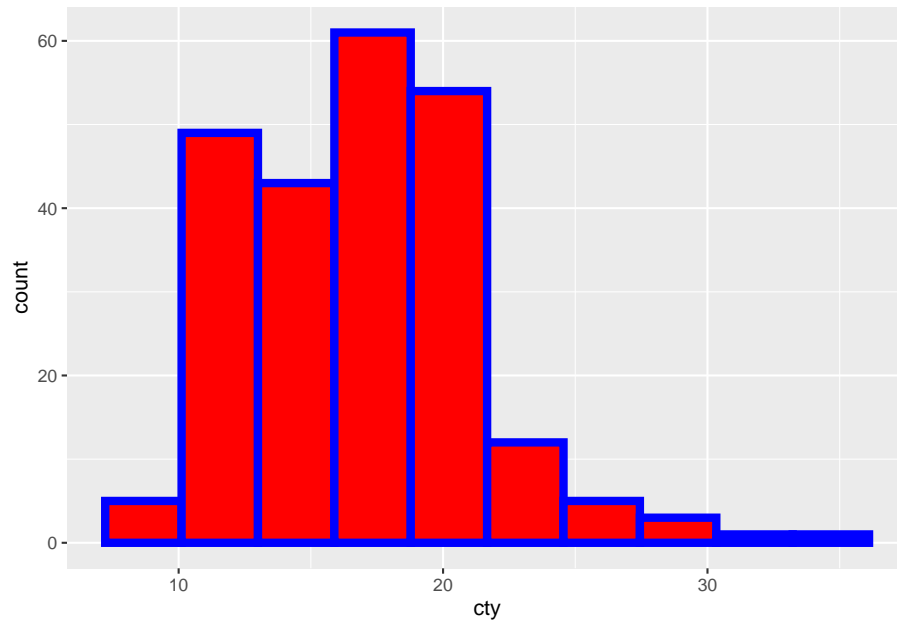
```
v1<- ggplot(dados, aes(x = cty, y = hwy)) +
  geom_point(col = "blue")+
  geom_smooth(method = mgcv::gam,
              formula = y ~ s(x, bs = "cs") ,
              col = "red",
              se = FALSE)
v1
```



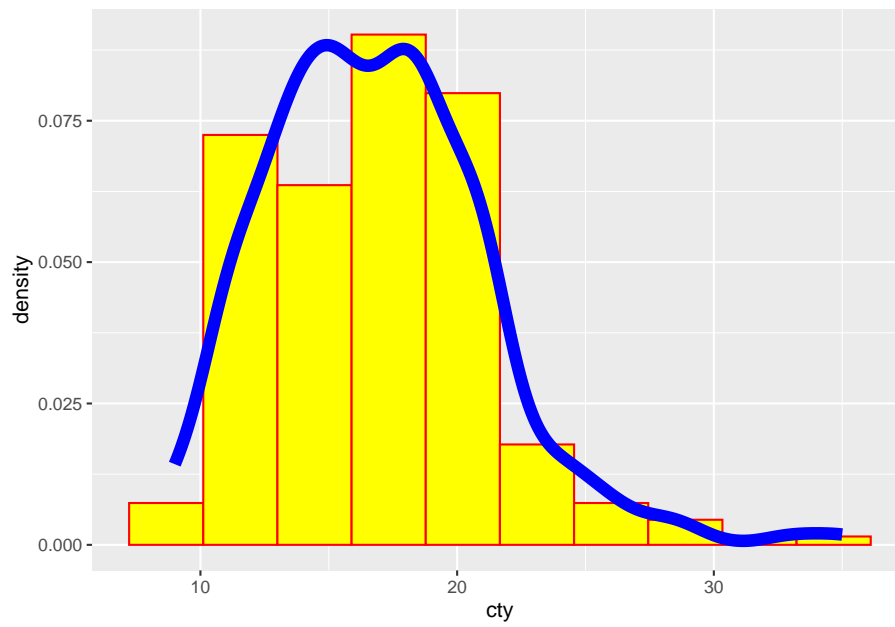
```
v2 <- ggplot(dados, aes(x = cty)) +  
  geom_boxplot(fill = "red")  
v2
```



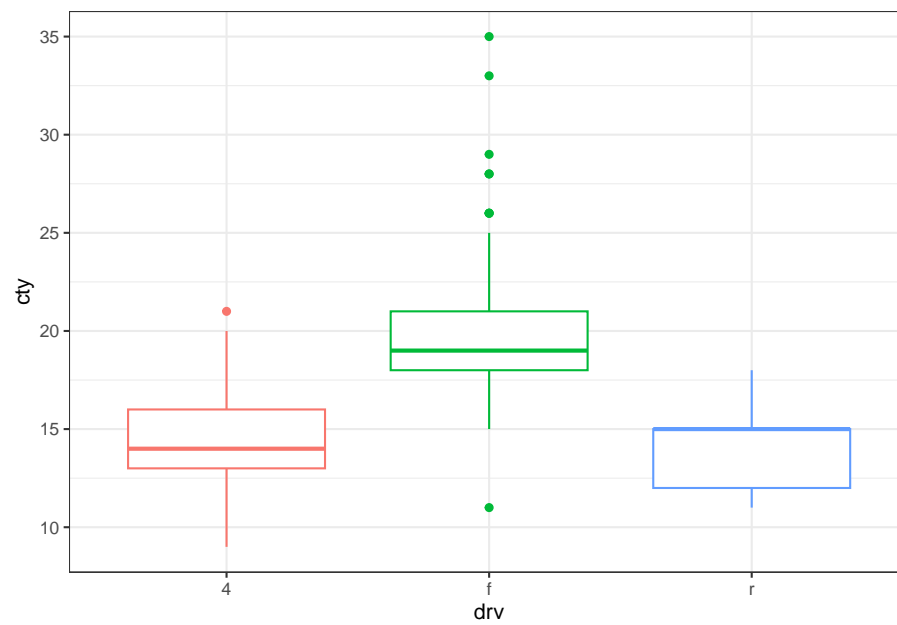
```
v3 <- ggplot(dados, aes(x = cty)) +  
  geom_histogram(bins = 10, fill = "red", col = "blue", lwd=2)  
v3
```



```
v4<- ggplot(dados, aes(x = cty)) +  
  geom_histogram(aes(y = after_stat(density)),  
    bins = 10, fill = "yellow", col = "red") +  
  geom_density(col = "blue", lwd =3)  
v4
```

```
# Adicional (estatistic experimental)
ggplot(dados, aes(x = drv, y = cty, col = drv)) +
  geom_boxplot()+
  theme_bw()+
  theme(legend.position = "none")
```



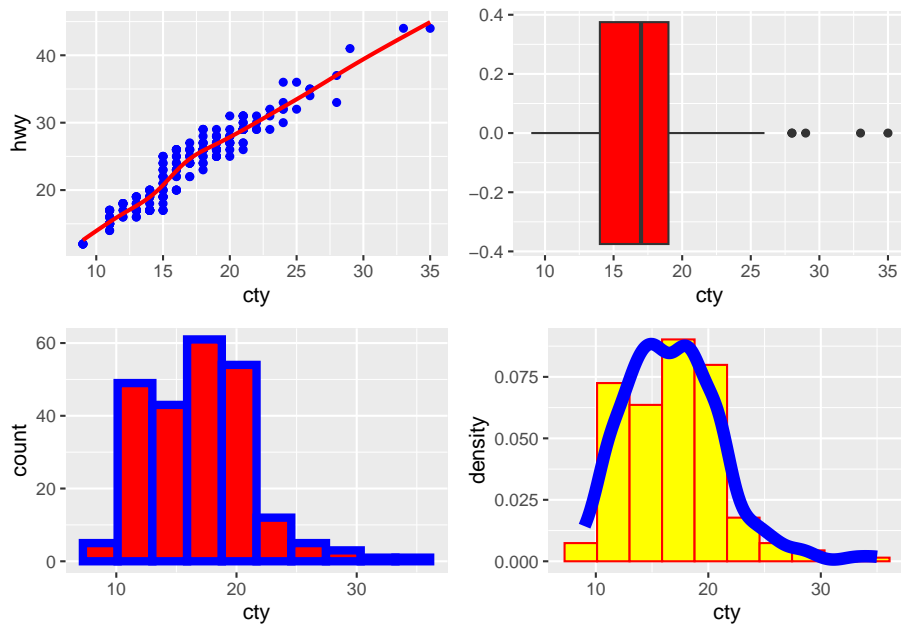
3.4 gridExtra e patchwork

Alguns links

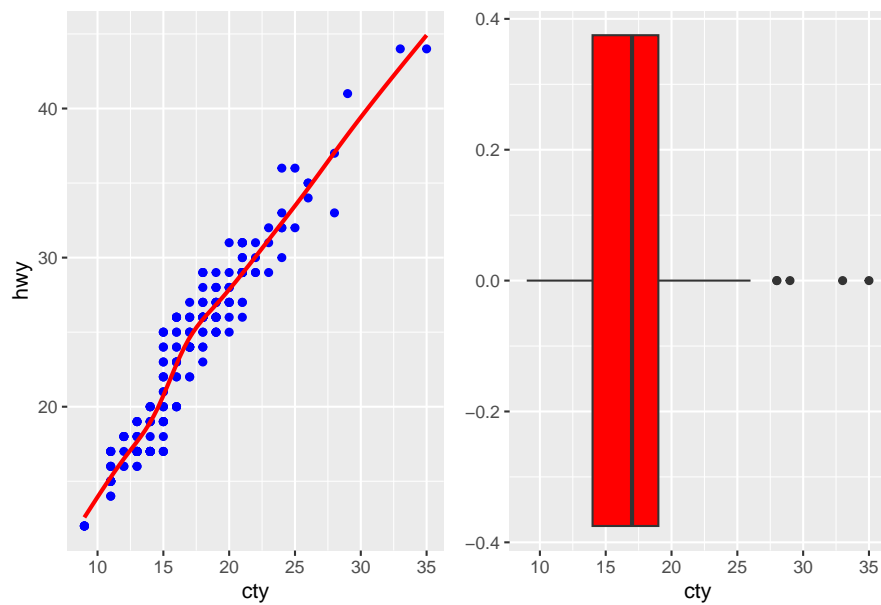
link 1: patchwork

link 2: patchwork

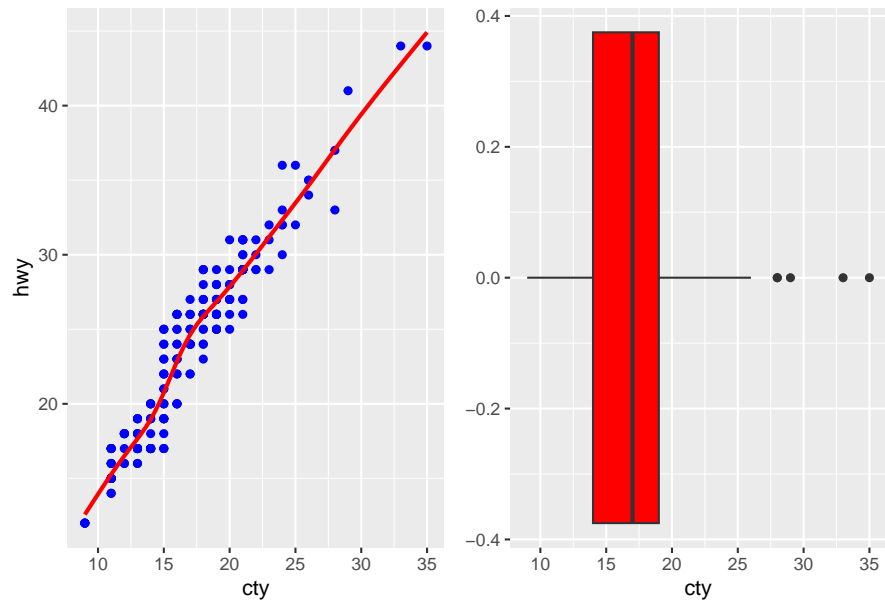
```
# gridExtra  
grid.arrange(v1, v2, v3, v4)
```



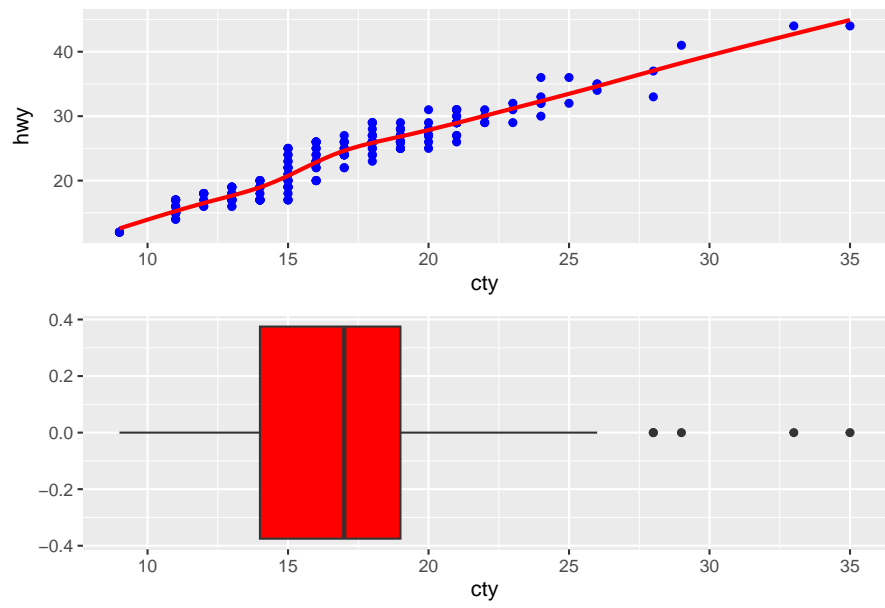
```
# patchwork  
v1 + v2
```

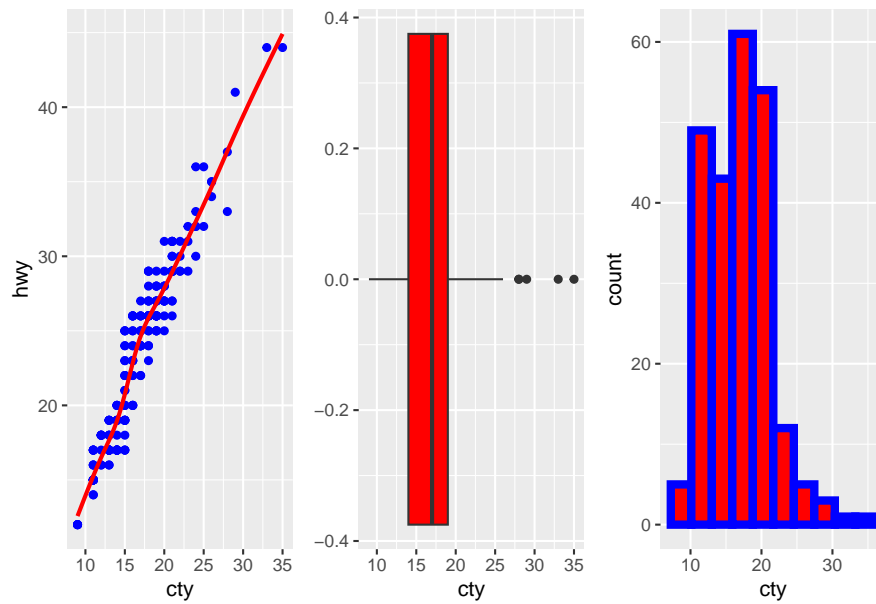
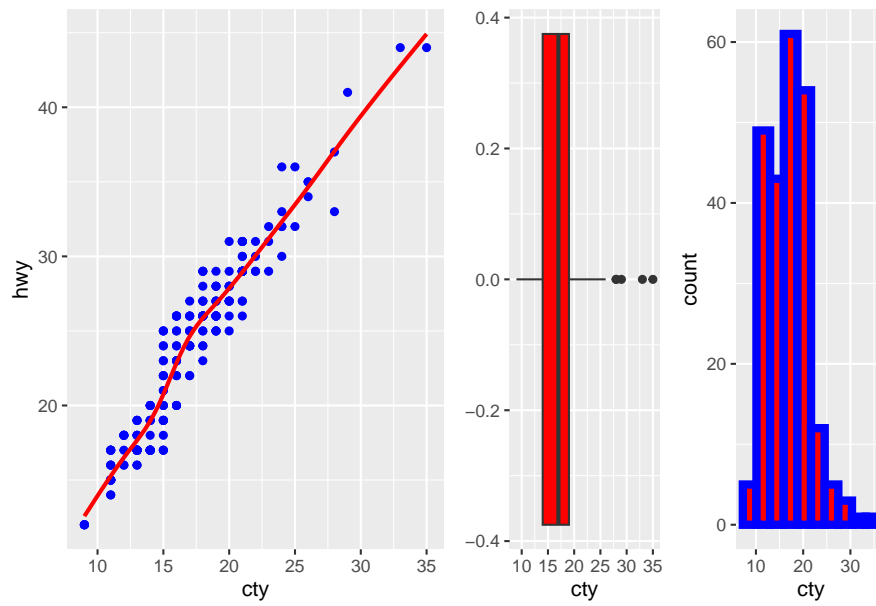


v1 | v2

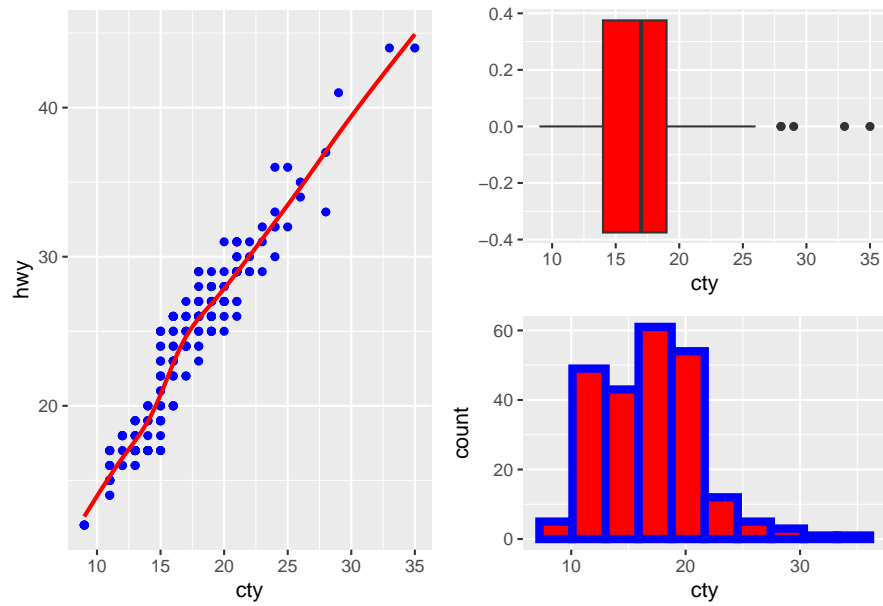


v1 / v2

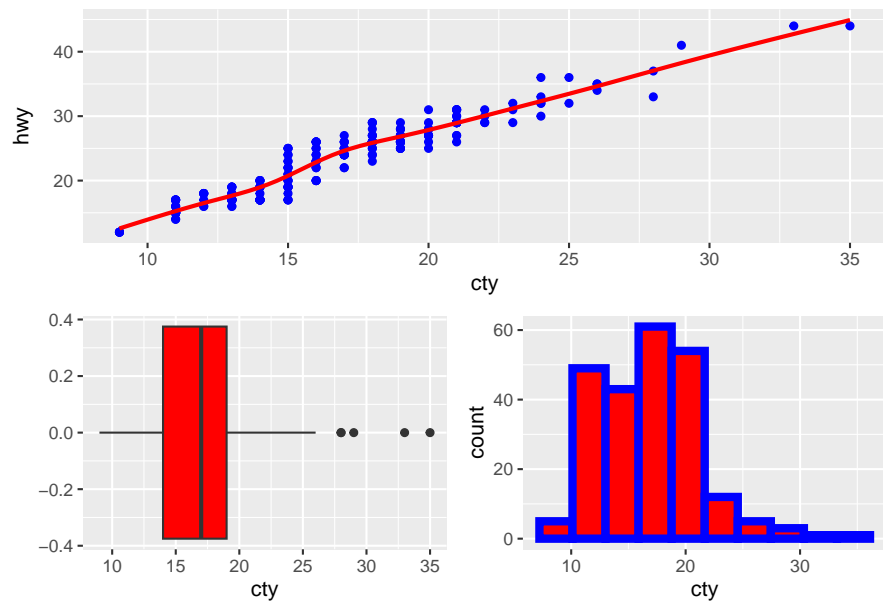


$v1 + v2 + v3$  $v1 + (v2 + v3)$ 

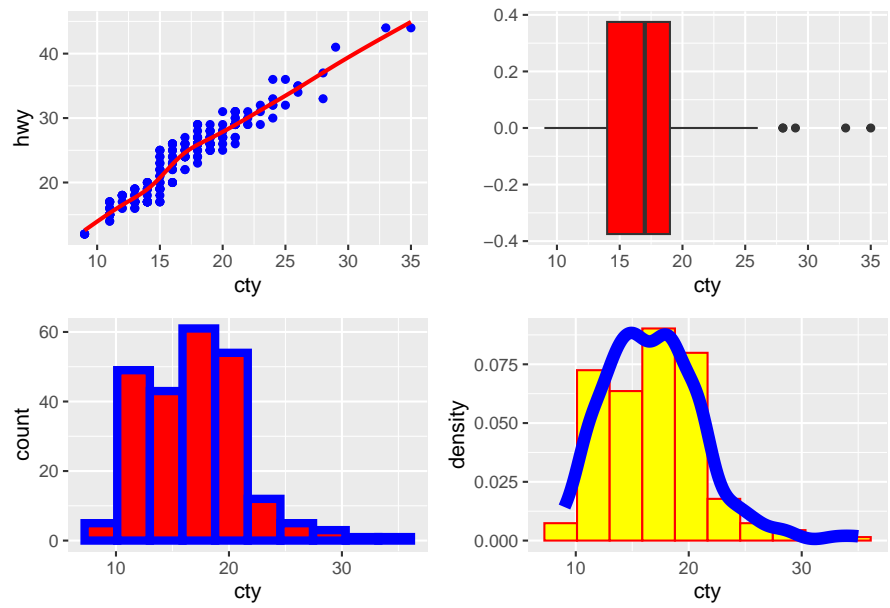
v1 | (v2 / v3)



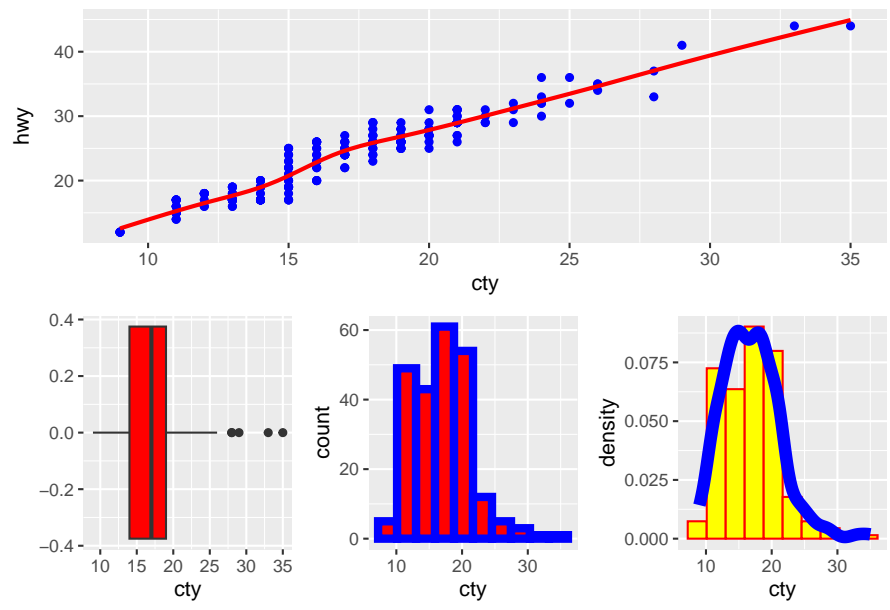
v1 / (v2 + v3)



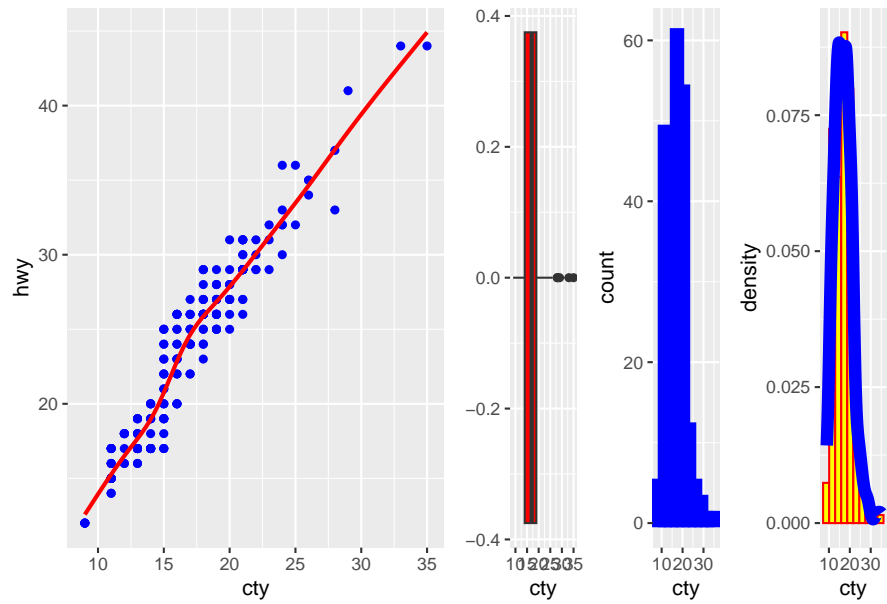
v1 + v2 + v3 + v4



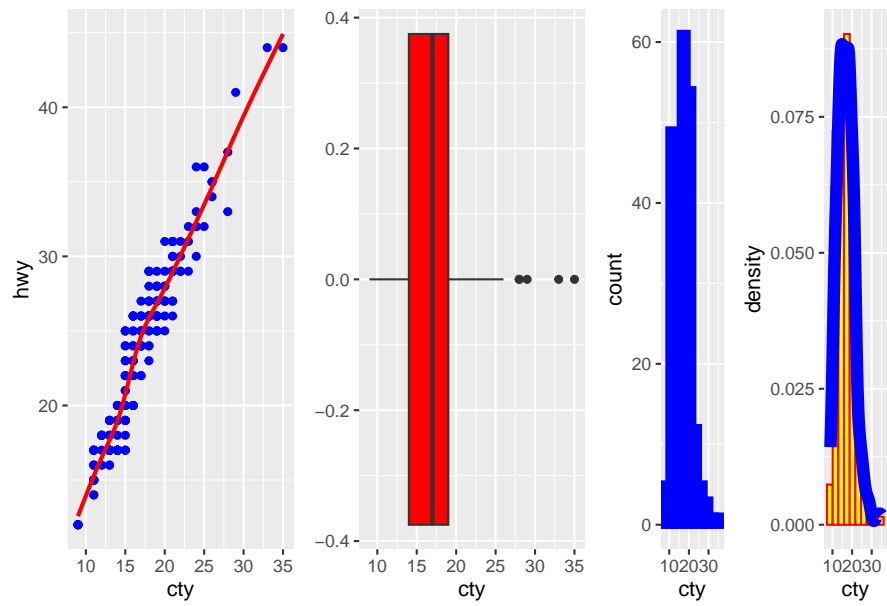
v1/(v2+v3+v4)



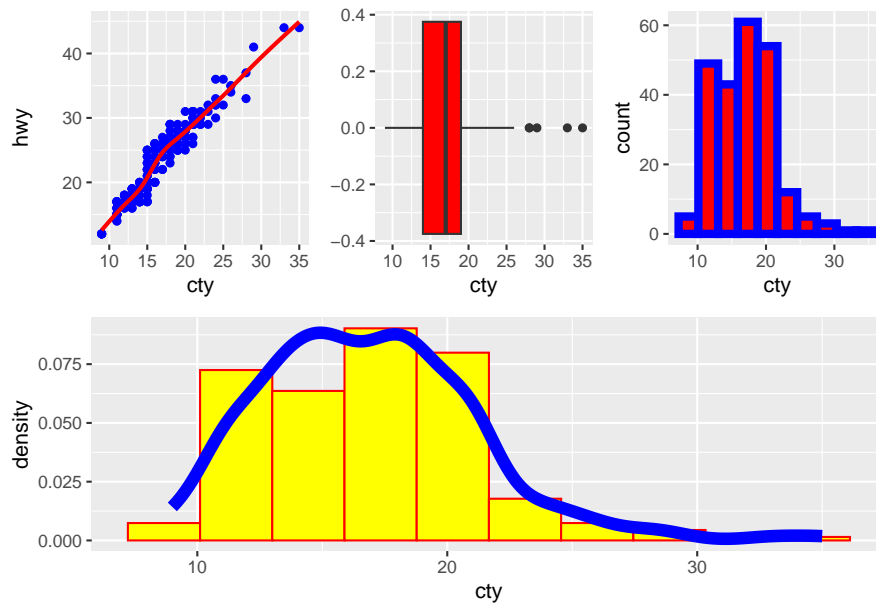
```
v1 + (v2 + v3 + v4)
```



```
v1 + v2 + (v3 + v4)
```

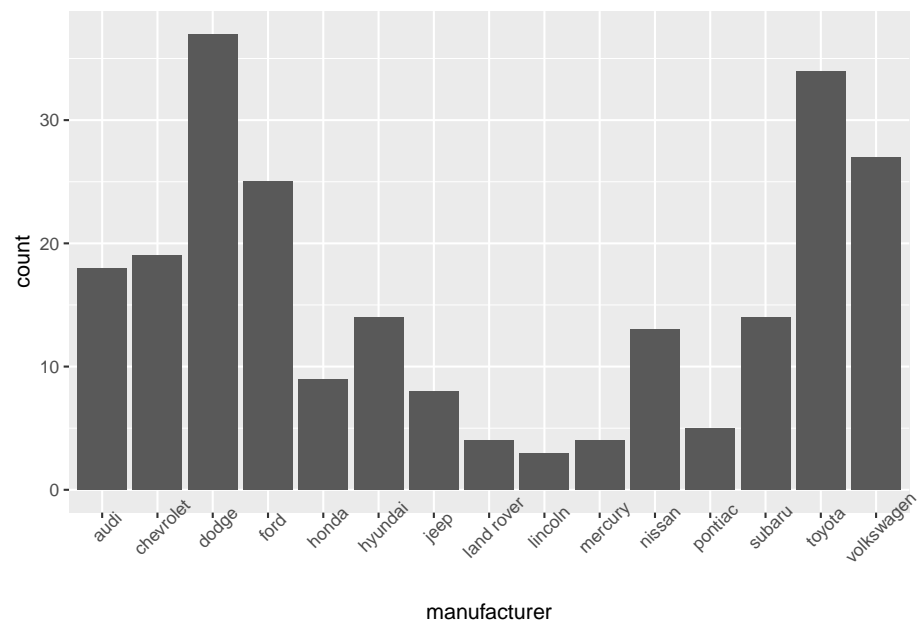



```
(v1 | v2 | v3) / v4
```

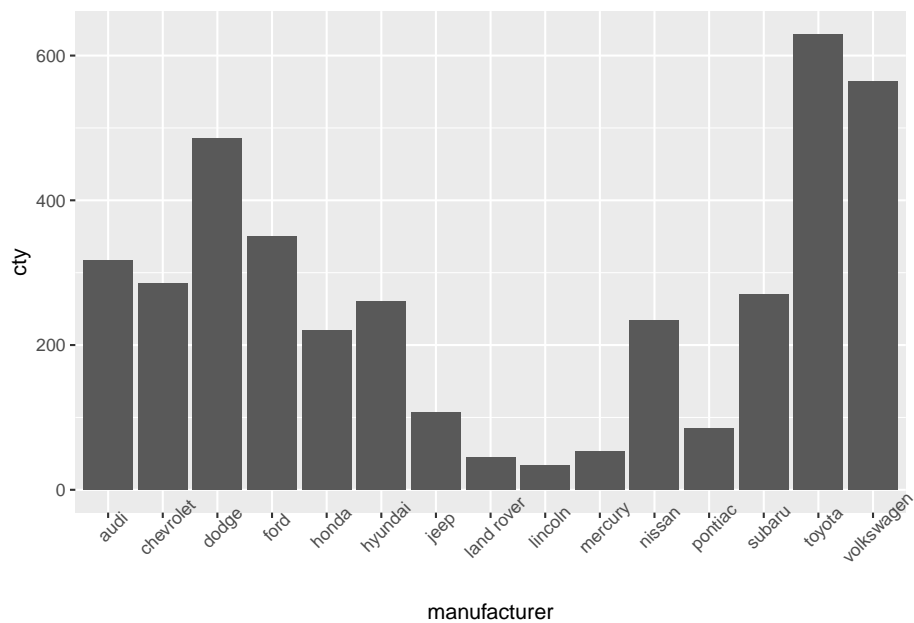


3.5 bar, col, density, density2d

```
v5 <- ggplot(dados , aes(x = manufacturer)) +  
  geom_bar()+  
  theme(axis.text.x = element_text(angle = 45))  
v5
```



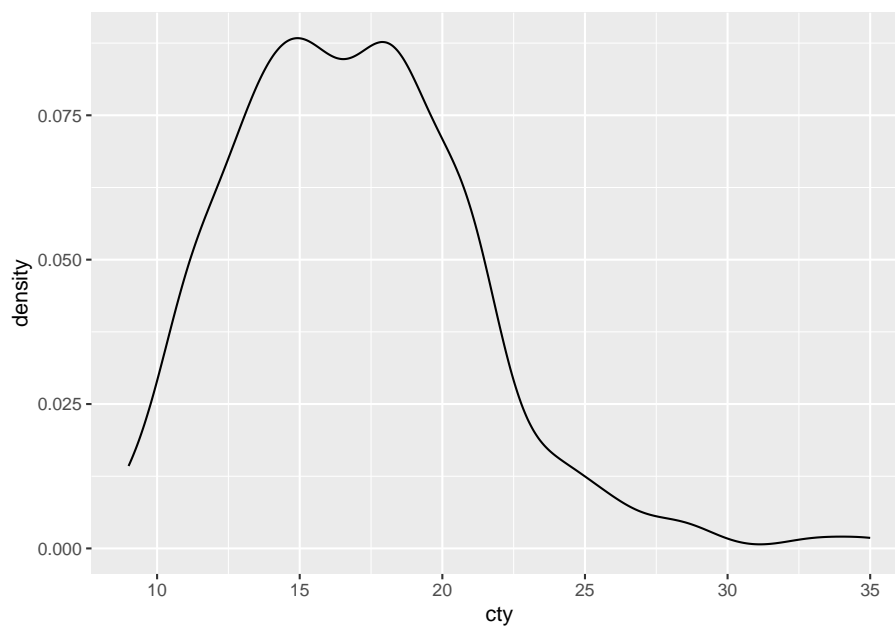
```
# Dúvidas no geom_col
v6 <- ggplot(dados , aes(x = manufacturer, y = cty)) +
  geom_col()+
  theme(axis.text.x = element_text(angle = 45))
v6
```



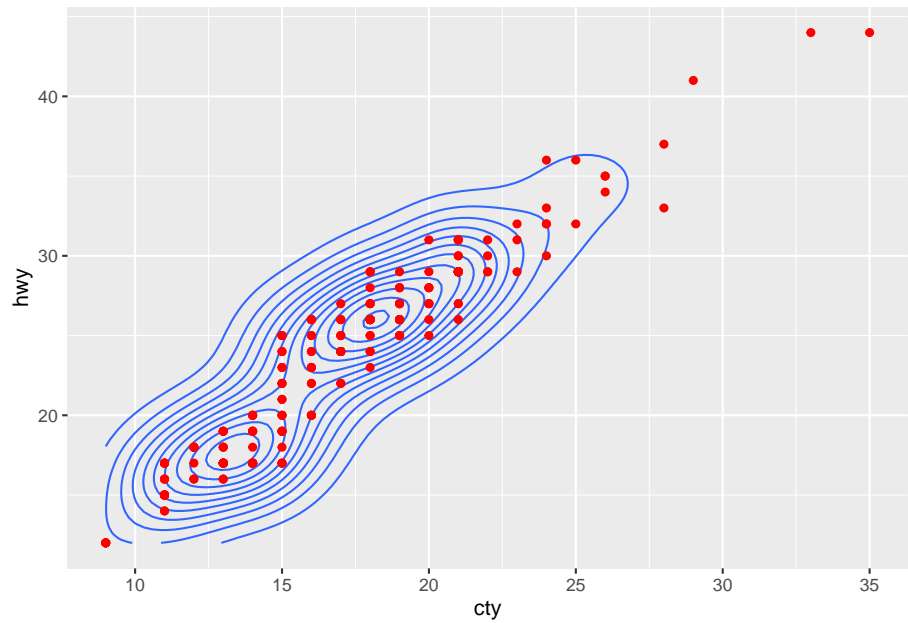
```
dados %>%
  select(manufacturer, cty) %>%
  group_by(manufacturer) %>%
  summarise(soma_total_cty = sum(cty),
            n = n())
```

```
## # A tibble: 15 x 3
##   manufacturer soma_total_cty     n
##   <fct>          <int> <int>
## 1 audi           317    18
## 2 chevrolet      285    19
## 3 dodge          486    37
## 4 ford           350    25
## 5 honda          220     9
## 6 hyundai        261    14
## 7 jeep           108     8
## 8 land rover      46     4
## 9 lincoln         34     3
## 10 mercury         53     4
## 11 nissan          235    13
## 12 pontiac         85     5
## 13 subaru          270    14
## 14 toyota          630    34
## 15 volkswagen      565    27
```

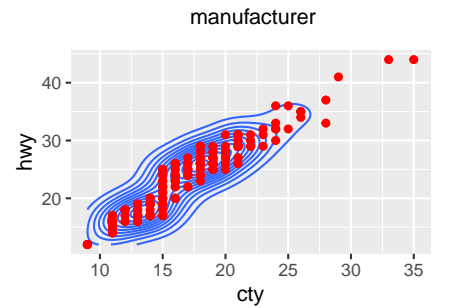
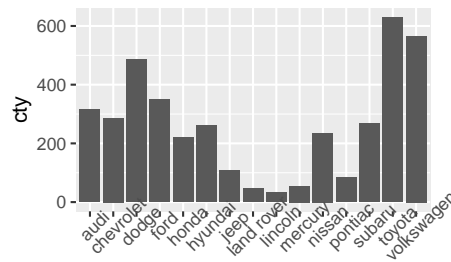
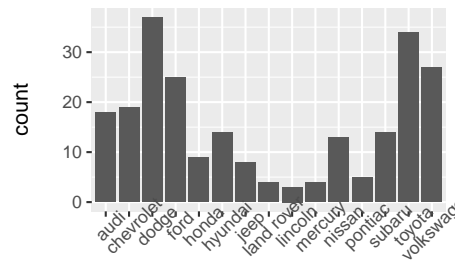
```
# dados %>%  
#   filter(manufacturer == "audi") %>%  
#   select(cty) %>%  
#   sum()  
v7 <- ggplot(dados , aes(x = cty)) +  
  geom_density()  
v7
```



```
v8 <- ggplot(dados, aes(x = cty, y = hwy)) +  
  geom_density2d()+  
  geom_point(colour = "red")  
v8
```



$(v5+v6)/ (v7 + v8)$



```
# Deixar pra depois...
```

```
dados %>%
  select(manufacturer, hwy, year) %>%
  filter(manufacturer == "audi", year == "1999") %>%
  summarise(media = max(hwy))
```

```
## # A tibble: 1 x 1
##   media
##   <int>
## 1     29
```

```
# plotly
```

```
ggplotly(
  ggplot(dados, aes(x = manufacturer, y = hwy, fill = factor(year))) +
    geom_col(position = "dodge") +
    labs(fill = "year") +
    theme(axis.text.x = element_text(angle = 45)))
```

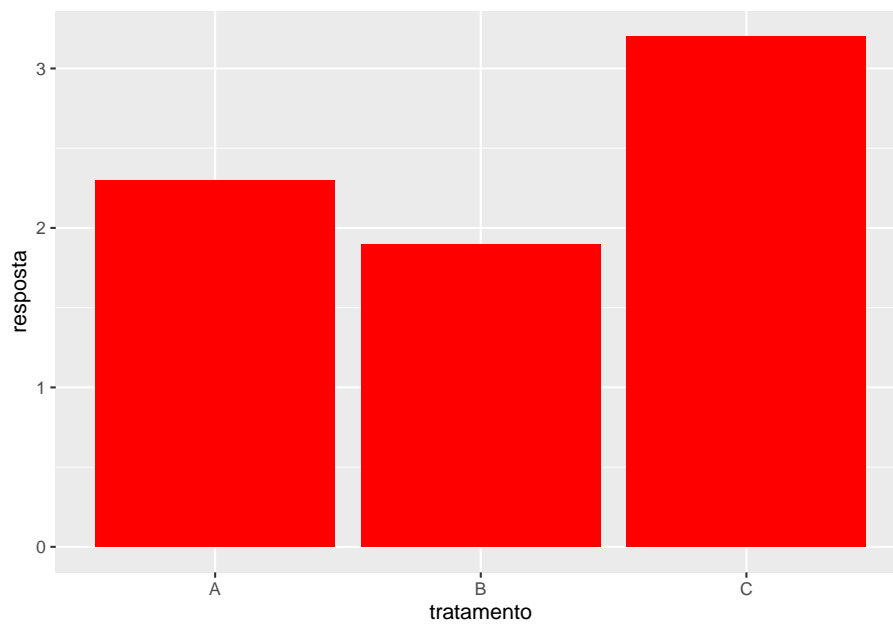
```
dados %>% select(manufacturer, hwy, year) %>%
  group_by(manufacturer, year) %>%
  summarise(media = mean(hwy))
```

```
# Para pensar
```

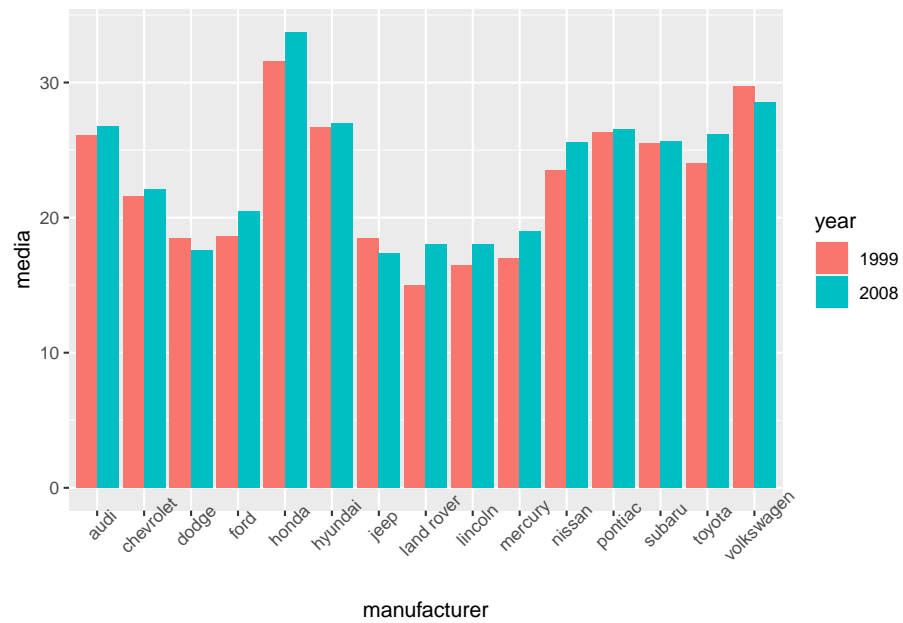
```
(dados_trat <- data.frame(tratamento = LETTERS[1:3],
                          resposta = c(2.3, 1.9, 3.2)))
```

```
##   tratamento resposta
## 1          A      2.3
## 2          B      1.9
## 3          C      3.2
```

```
ggplot(dados_trat, aes(tratamento, resposta)) +
  geom_col(fill = "red")
```

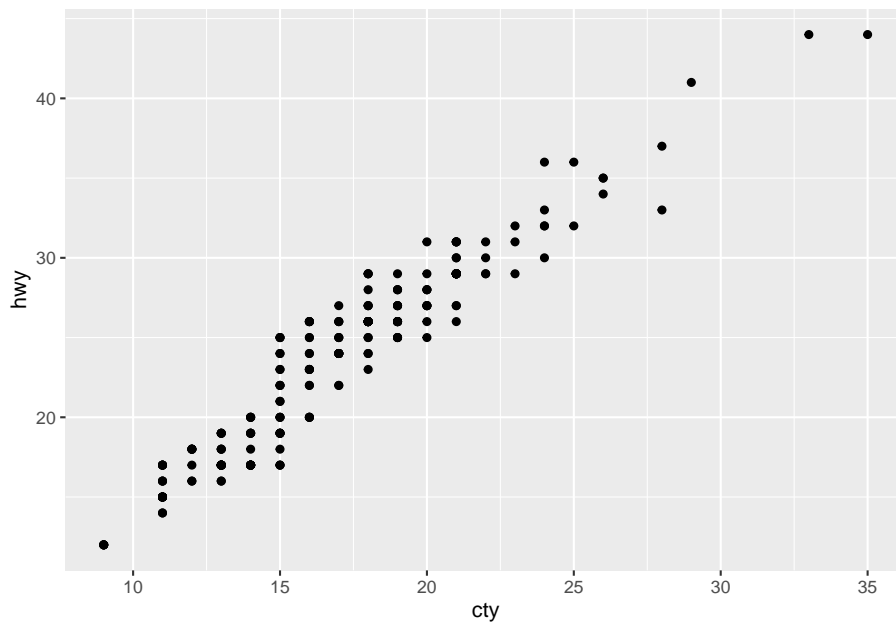


```
# Mais detalhes...
dados %>% select(manufacturer, hwy, year) %>%
  group_by(manufacturer, year) %>%
  summarise(media = mean(hwy), .groups = "drop") %>%
  ggplot(aes(x = manufacturer, y = media, fill = factor(year)))+
  geom_col(position = "dodge")+
  labs(fill = "year") +
  theme(axis.text.x = element_text(angle = 45))
```

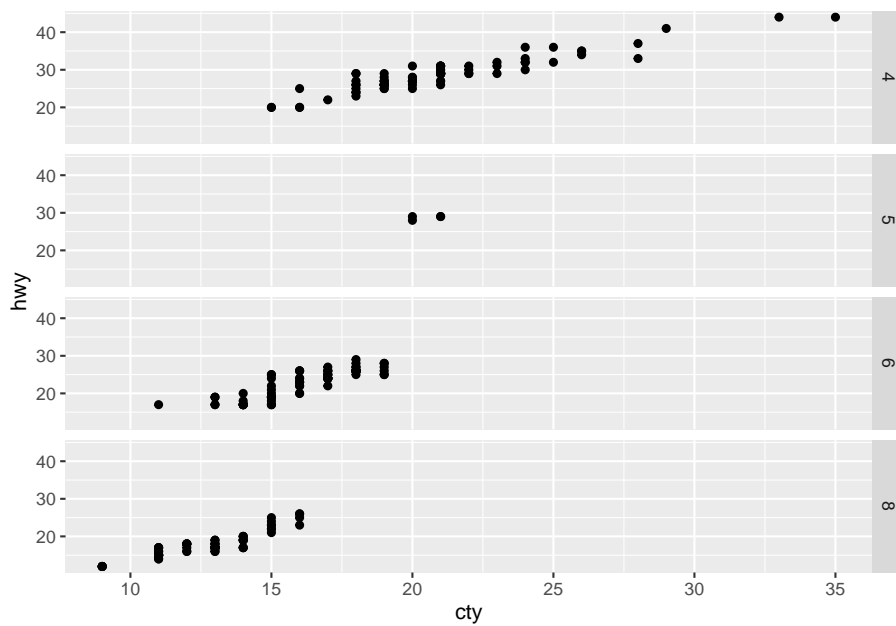


3.6 facet_grid, facet_wrap

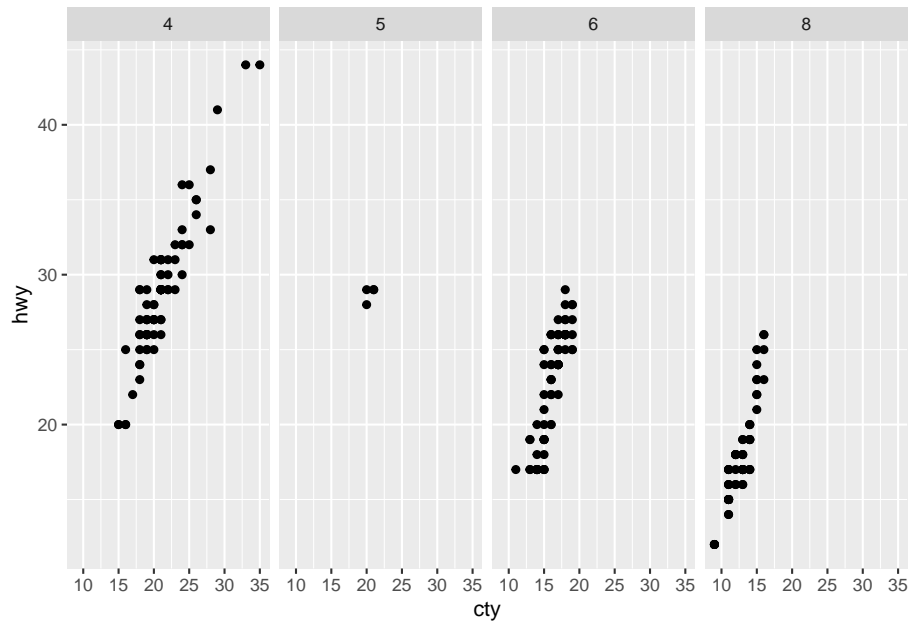
```
p1<- ggplot(dados, aes(x = cty, y = hwy)) +  
  geom_point()  
p1
```

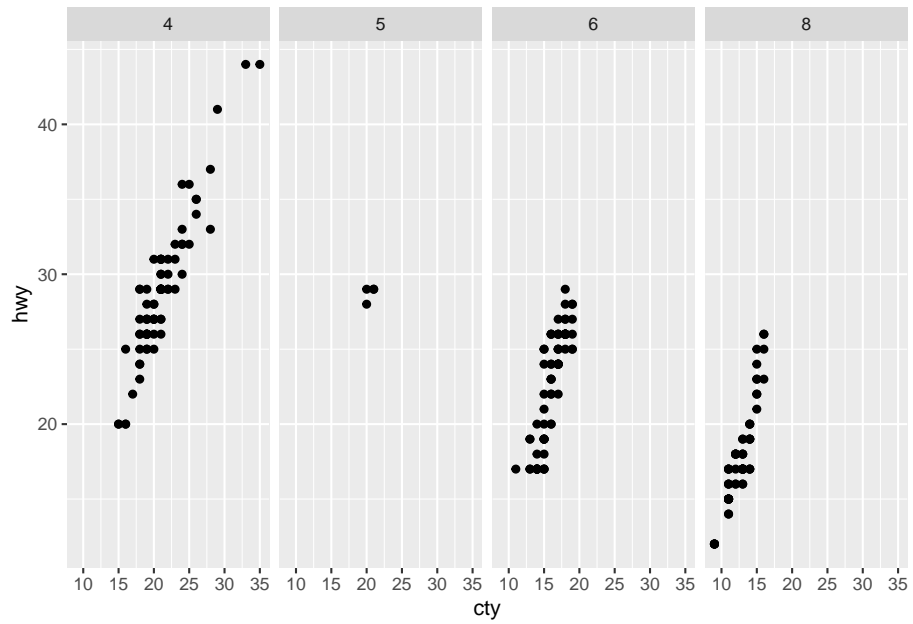
```
p1 + facet_grid(rows = vars(cyl))
```



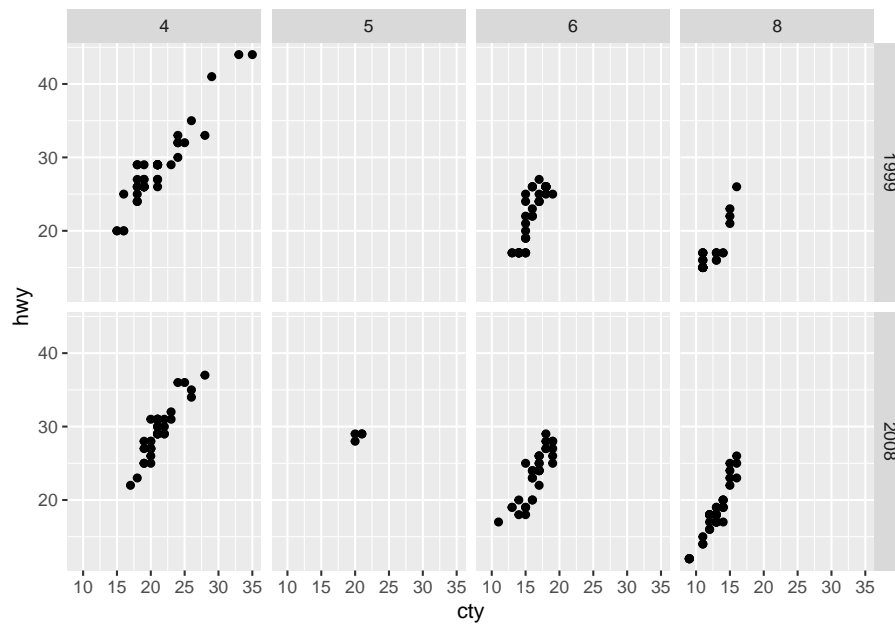
```
p1 + facet_grid(cols = vars(cyl))
```



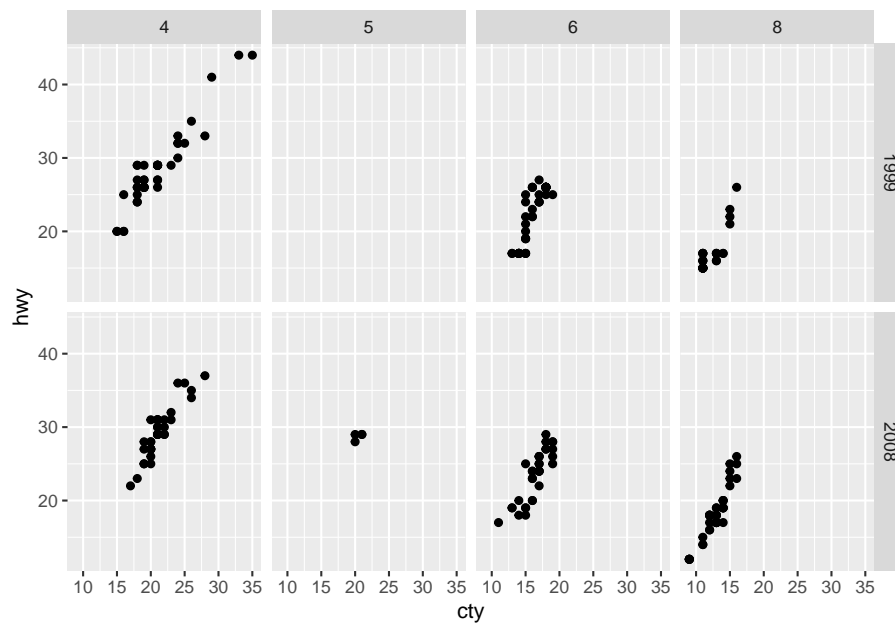
```
p1 + facet_grid(~cyl)
```



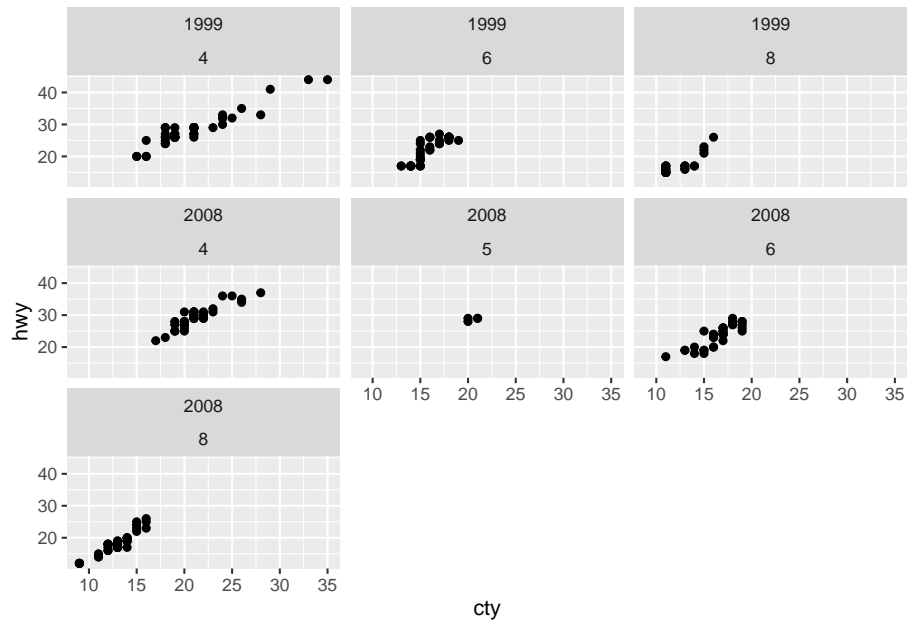
```
p1 + facet_grid(rows = vars(year), cols = vars(cyl))
```



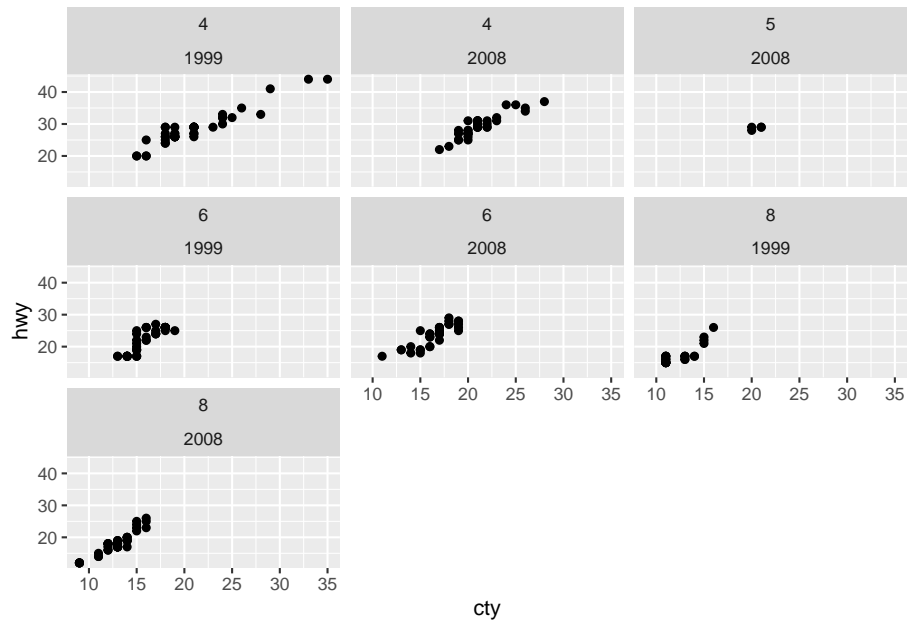
```
p1 + facet_grid(year~cyl)
```



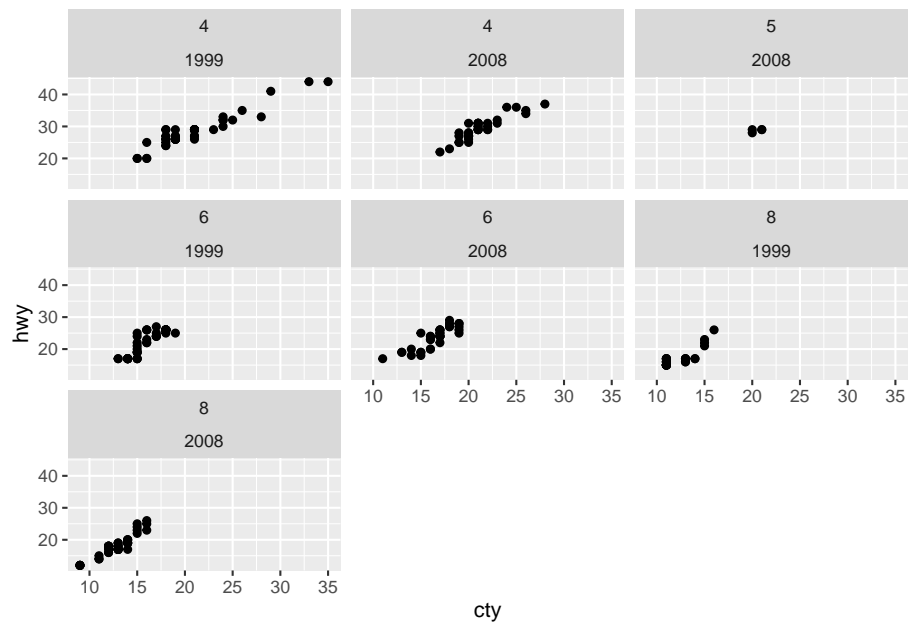
```
p1 + facet_wrap(year ~ cyl)
```



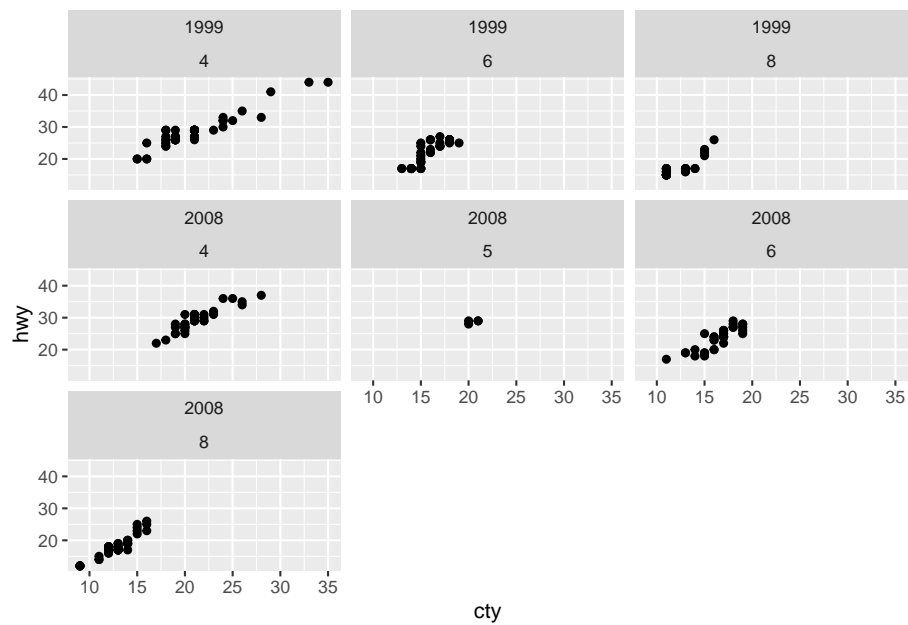
```
p1 + facet_wrap(cyl ~ year)
```



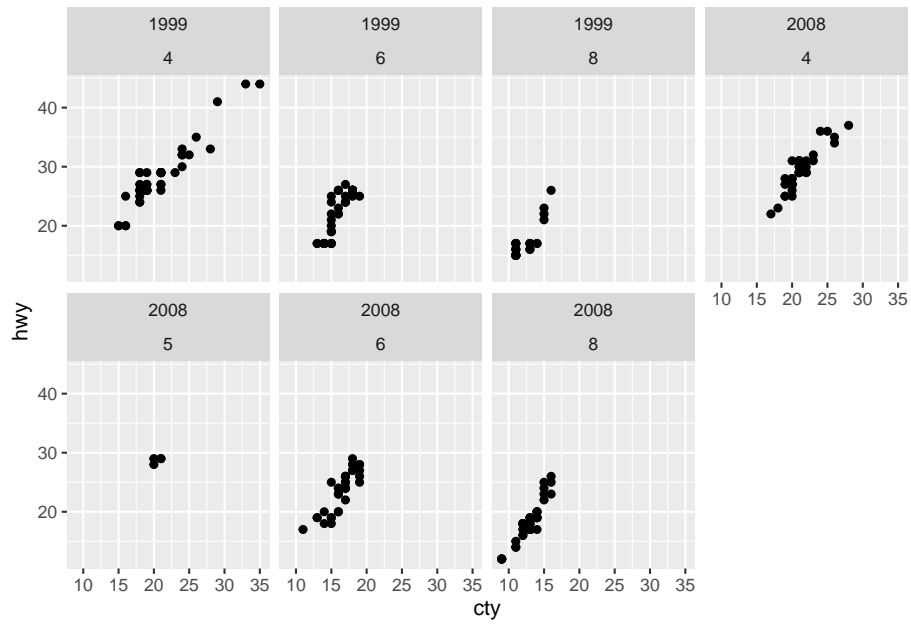
```
p1 + facet_wrap(~cyl + year)
```



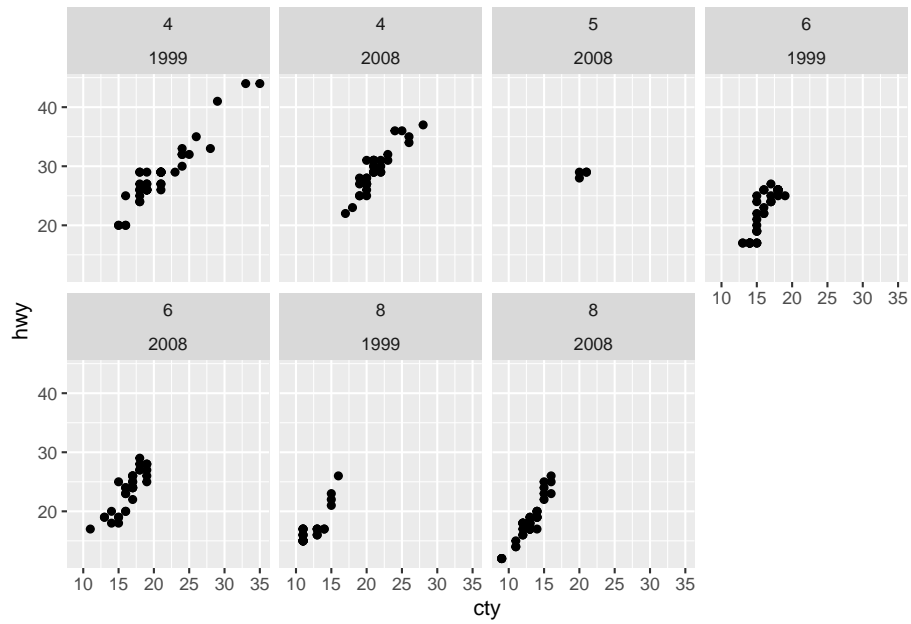
```
p1 + facet_wrap(~year + cyl)
```



```
p1 + facet_wrap(year ~ cyl, ncol = 4)
```

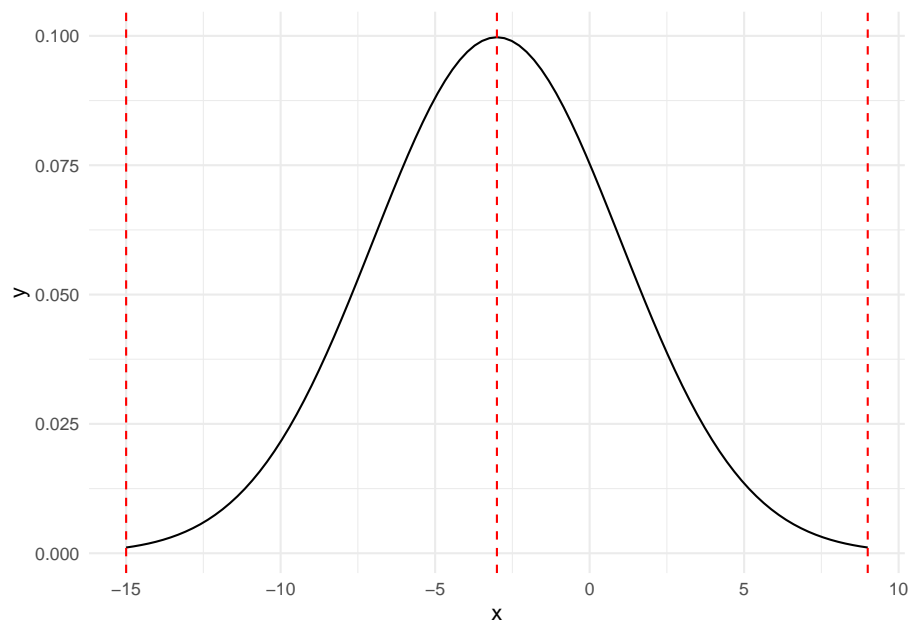


```
p1 + facet_wrap(cyl ~ year, ncol = 4)
```



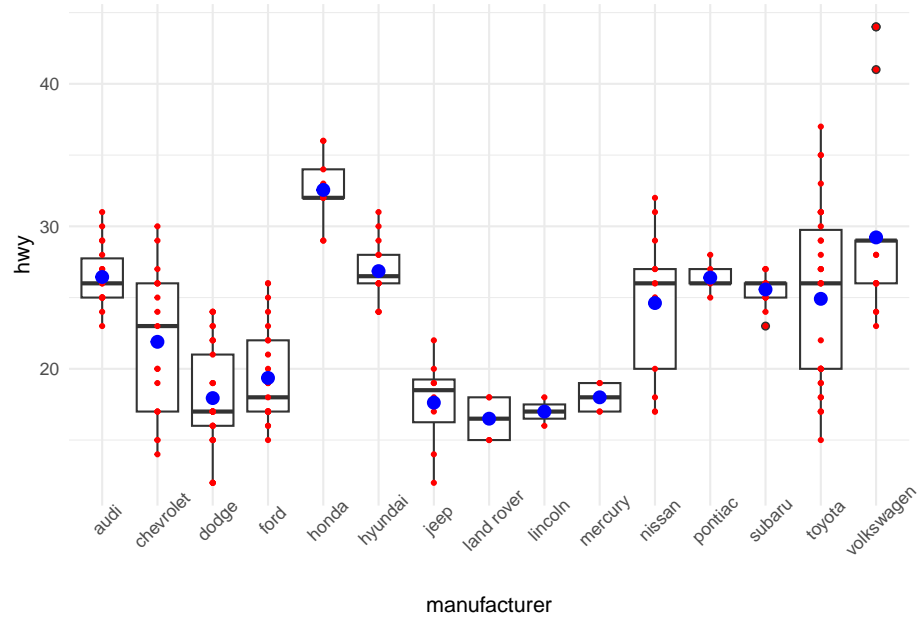
3.7 stat_function

```
a<- -3 # média
b<- 4 # desv. padrão
ggplot(data.frame(x = c(a - 3*b, a + 3*b)), aes(x)) +
  stat_function(fun = dnorm, args = list(mean = a, sd = b))+
  geom_vline(xintercept = c(a - 3*b, a, a + 3*b), col = "red", lty = 2)+
  theme_minimal()
```



3.8 stat_summary

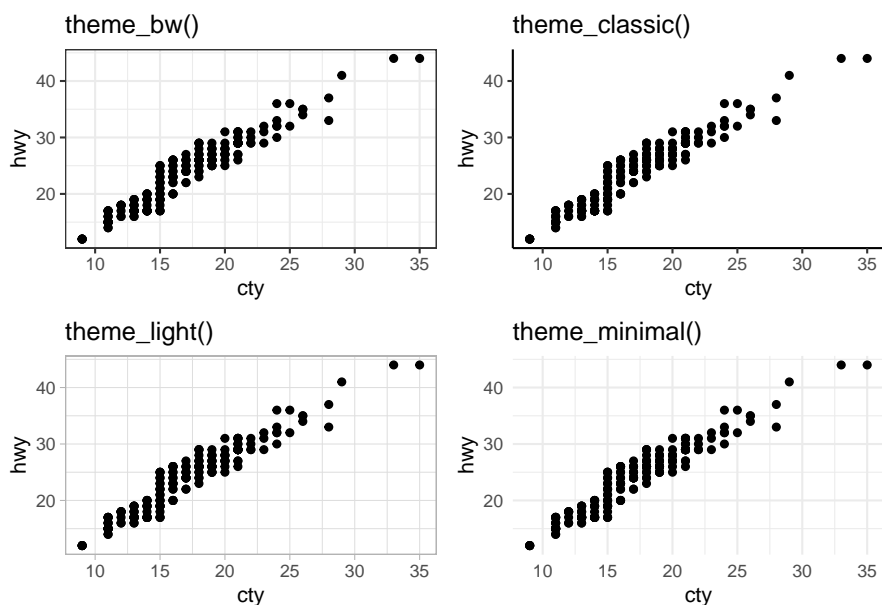
```
ggplot(dados, aes(x = manufacturer, y = hwy)) +
  geom_boxplot()+
  geom_point(col = "red", size=0.8)+
  stat_summary(fun = mean, col = "blue")+
  theme_minimal()+
  theme(axis.text.x = element_text(angle = 45))
```



3.9 theme_*()

```
a1<- p1 + theme_bw() + labs(title = "theme_bw()")
a2<- p1 + theme_classic() + labs(title = "theme_classic()")
a3<- p1 + theme_light() + labs(title = "theme_light()")
a4<- p1 + theme_minimal() + labs(title = "theme_minimal()")

a1 + a2 + a3 + a4
```

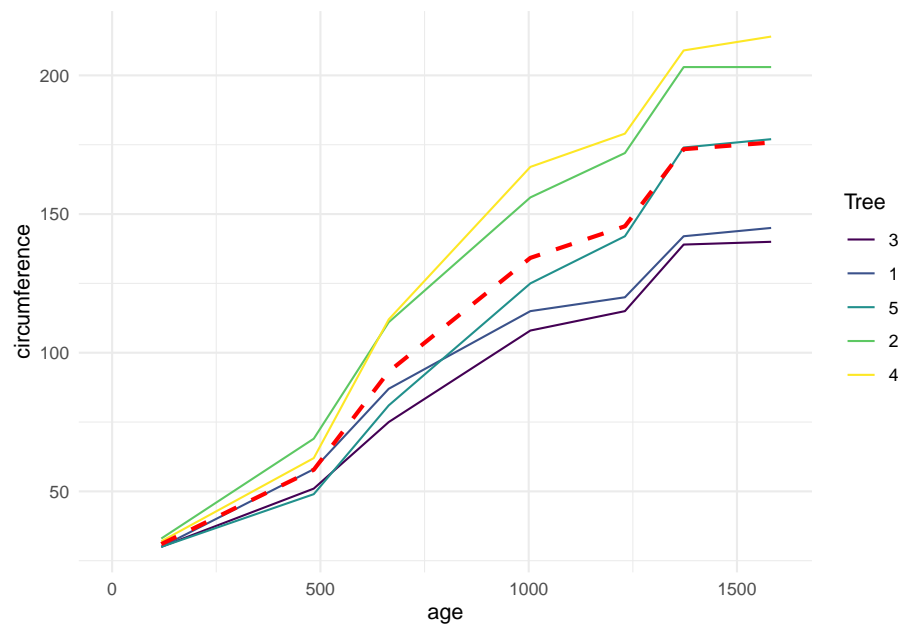



3.10 Gráfico de perfis (Spaguetti plot)

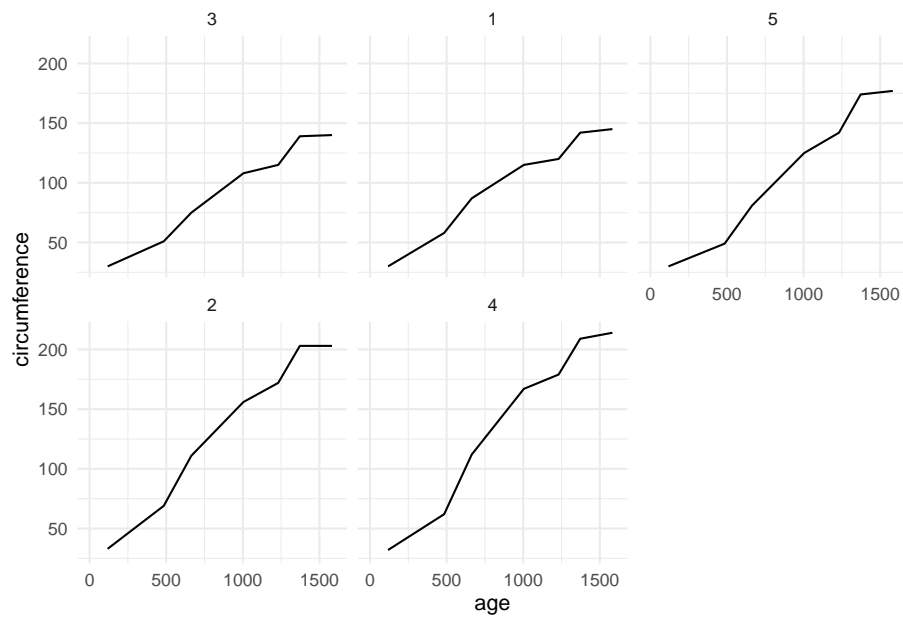
```
glimpse(Orange)
```

```
## Rows: 35
## Columns: 3
## $ Tree      <ord> 1, 1, 1, 1, 1, 1, 1, 2, 2, 2, 2, 2, 2, 2, 3, 3, 3, 3, 3,~
## $ age       <dbl> 118, 484, 664, 1004, 1231, 1372, 1582, 118, 484, 664, 10~
## $ circumference <dbl> 30, 58, 87, 115, 120, 142, 145, 33, 69, 111, 156, 172, 2~
```

```
ggplot(Orange, aes(x = age, y = circumference, group = Tree,
                    col = Tree)) +
  geom_line() +
  stat_summary(aes(group = 1), fun = mean, col = "red",
               geom = "line", size = 1, show.legend = FALSE,
               linetype = 2) +
  xlim(0, 1600) +
  theme_minimal()
```



```
ggplot(Orange, aes(x = age, y = circumference, group = Tree)) +  
  geom_line()+  
  xlim(0, 1600)+  
  facet_wrap(~Tree)+  
  theme_minimal()+  
  theme(legend.position = "none")
```



3.11 plotly

plotly cran

Interactive web-based data visualization with R, plotly, and shiny

Plotly R Open Source Graphing Library

```
ggplotly(v1)
ggplotly(v2)
ggplotly(v4)
ggplotly(v5)
```

3.12 esquisse

Alguns links de interesse

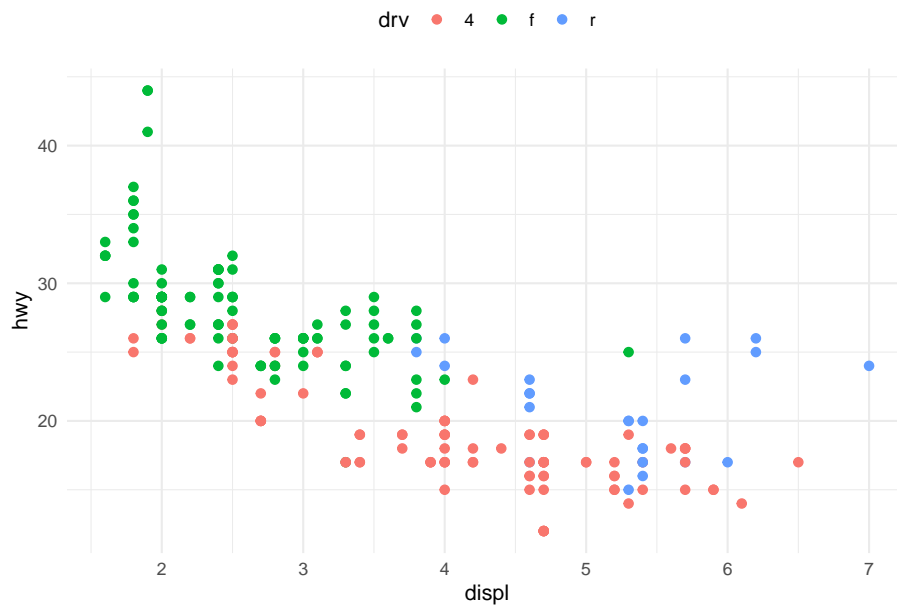
esquisse

esquisse + shiny

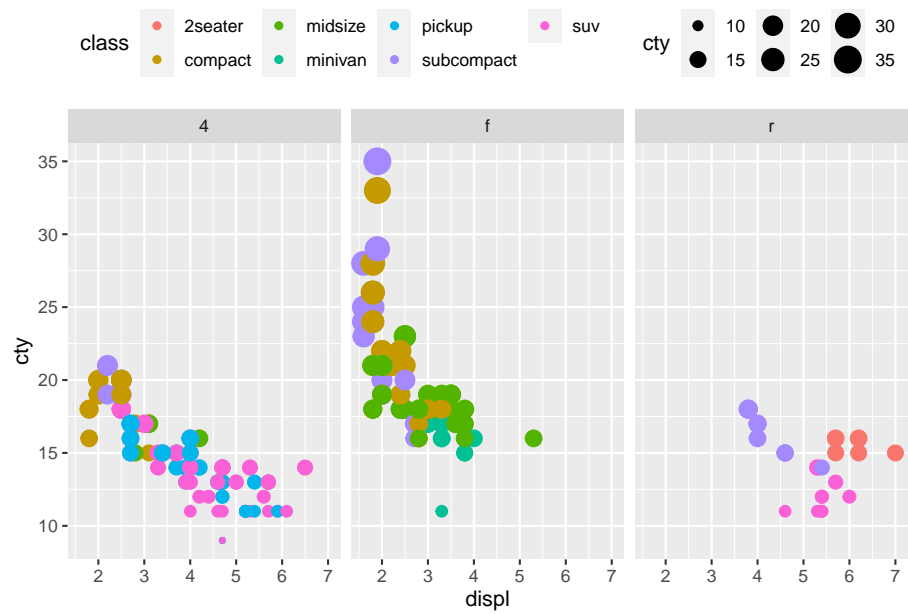
```
esquisser(dados)
```

3.13 Exemplo esquisse

```
ggplot(dados) +
  aes(x = displ, y = hwy, colour = drv) +
  geom_point(shape = "circle", size = 1.85) +
  scale_color_hue(direction = 1) +
  theme_minimal() +
  theme(legend.position = "top")
```



```
ggplot(dados) +
  aes(x = displ, y = cty, colour = class, size = cty) +
  geom_point(shape = "circle") +
  scale_color_hue(direction = 1) +
  theme(legend.position = "top") +
  facet_wrap(vars(drv))
```



Capítulo 4

Referências (on-line)

4.1 Livros

ggplot2: elegant graphics for data analysis, Hadley Wickham

R Programming for Data Science, Roger D. Peng

R for Data Science, Hadley Wickham e Garrett Grolemund.

R Graphics Cookbook, Winston Chang

4.2 Tidyverse: links do dplyr, ggplot2 e magrittr

dplyr do tidyverse

ggplot2 do tidyverse

magrittr do tidyverse?

4.3 cheat sheet

Data transformation with dplyr

Data visualization with ggplot2