

Inferencia Estadística

Solución: EDA2

DSLab

noviembre, 2024

```
# Ejercicio 1 (tidyr y dplyr)
library(tidyr)
library(dplyr)
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
# A partir del siguiente dataframe realizar las siguientes operaciones de limpieza de datos:
set.seed(1)
stocks <- data.frame(</pre>
 time = as.Date('2009-01-01') + 0:9,
 Walmart = rnorm(10, 20, 1),
 Target = rnorm(10, 20, 2),
 Walgreens = rnorm(10, 20, 4)
)
      time Walmart Target Walgreens
# 1 2009-01-01 19.37355 23.02356 23.67591
# 2 2009-01-02 20.18364 20.77969 23.12855
# 3 2009-01-03 19.16437 18.75752 20.29826
# 4 2009-01-04 21.59528 15.57060 12.04259
# 5 2009-01-05 20.32951 22.24986 22.47930
# 6 2009-01-06 19.17953 19.91013 19.77549
# 7 2009-01-07 20.48743 19.96762 19.37682
# 8 2009-01-08 20.73832 21.88767 14.11699
# 9 2009-01-09 20.57578 21.64244 18.08740
# 10 2009-01-10 19.69461 21.18780 21.67177
```



```
# Como se puede observar hay un problema de clave-valor en las compañías con sus observaciones.
# Transformar los datos para que tengan una clave stock y el valor sea el precio.
# Por lo tanto se requiere la funcion "gather".
# Opcion 1:
new_stocks <- gather(data = stocks, key = stock, value = price, Walmart, Target, Walgreens)
# Opcion 2:
new_stocks <- gather(data = stocks, key = stock, value = price, Walmart:Walgreens)
# Opcion 3:
new_stocks <- gather(data = stocks, key = stock, value = price, -time)</pre>
# El último argumento, -time, significa que todas las columnas excepto el tiempo
# contienen los pares clave-valor.
# Devolver el dataframe al estado original utilizando la funcion "spread".
original_stocks <- spread(data = new_stocks, key = stock, value = price)
# Utilizando el operador tuberia %>% se desea realizar las siquientes operaciones anidadas.
# 1) Transformar los datos para que tengan una clave stock y el valor sea
# el precio mediante la funcion "gather".
# 2) Agrupar los datos por la clave stock mediante la funcion "group_by".
# 3) Obtener el precio minimo y maximo utilizando la funcion "summarise".
stocks %>%
 gather(key = stock, value = price, Walmart: Walgreens)%>%
 group_by(stock) %>%
 summarise(min = min(price), max = max(price))
## # A tibble: 3 x 3
##
    stock
              min max
             <dbl> <dbl>
##
    <chr>
              15.6 23.0
## 1 Target
## 2 Walgreens 12.0 23.7
## 3 Walmart
               19.2 21.6
# Ejercicio 2 (dplyr)
library(dplyr)
library(nycflights13)
# COMPROBACION.
# Observamos los distintos dataframes que nos proporcionan.
# Utilizamos el nombre del paquete y doblemente dos puntos (::) para comprobarlo.
# Tambien se puede utilizar el nombre del dataframe si previamente estamos familiarizados.
```



```
# PRIMERA OBSERVACION.
# Comprobamos las variables de cada uno de los datasets que nos proporcionan
# mediante la instrucción "head".
print(head(flights))
## # A tibble: 6 x 19
##
      year month
                   day dep_time sched_dep_time dep_delay arr_time sched_arr_time
##
     <int> <int> <int>
                                                    <dbl>
                          <int>
                                          <int>
                                                             <int>
                                                                             <int>
## 1 2013
               1
                     1
                            517
                                            515
                                                        2
                                                               830
                                                                               819
## 2 2013
               1
                     1
                            533
                                            529
                                                        4
                                                                850
                                                                               830
## 3 2013
               1
                     1
                            542
                                            540
                                                        2
                                                               923
                                                                               850
## 4 2013
               1
                     1
                            544
                                            545
                                                       -1
                                                               1004
                                                                              1022
## 5 2013
               1
                     1
                            554
                                            600
                                                       -6
                                                               812
                                                                               837
## 6 2013
                                            558
                                                                740
               1
                     1
                            554
                                                       -4
                                                                               728
## # i 11 more variables: arr_delay <dbl>, carrier <chr>, flight <int>,
       tailnum <chr>, origin <chr>, dest <chr>, air_time <dbl>, distance <dbl>,
       hour <dbl>, minute <dbl>, time_hour <dttm>
print(head(airports))
## # A tibble: 6 x 8
##
     faa
           name
                                             lat
                                                   lon
                                                         alt
                                                                 tz dst
                                                                          tzone
##
     <chr> <chr>
                                           <dbl> <dbl> <dbl> <chr> <chr>
## 1 04G
                                            41.1 -80.6
           Lansdowne Airport
                                                        1044
                                                                -5 A
                                                                          America/Ne~
## 2 06A
                                                                -6 A
                                                                          America/Ch~
           Moton Field Municipal Airport
                                            32.5 -85.7
                                                         264
## 3 06C
           Schaumburg Regional
                                            42.0 -88.1
                                                         801
                                                                -6 A
                                                                          America/Ch~
## 4 06N
           Randall Airport
                                            41.4 -74.4
                                                         523
                                                                -5 A
                                                                          America/Ne~
## 5 09J
           Jekyll Island Airport
                                            31.1 -81.4
                                                          11
                                                                -5 A
                                                                          America/Ne~
## 6 OA9
           Elizabethton Municipal Airport 36.4 -82.2 1593
                                                                -5 A
                                                                          America/Ne~
print(head(weather))
## # A tibble: 6 x 15
##
                          day hour temp dewp humid wind_dir wind_speed wind_gust
     origin year month
     <chr> <int> <int> <int> <dbl> <dbl> <dbl> <dbl>
                                                          <dbl>
                                                                      <dbl>
                                                                                <dbl>
## 1 EWR
             2013
                      1
                            1
                                   1 39.0
                                            26.1 59.4
                                                            270
                                                                      10.4
                                                                                   NA
## 2 EWR
             2013
                      1
                            1
                                   2 39.0
                                            27.0
                                                  61.6
                                                            250
                                                                       8.06
                                                                                   NA
## 3 EWR
             2013
                            1
                                   3 39.0
                                            28.0 64.4
                                                            240
                                                                     11.5
                                                                                   NA
                      1
## 4 EWR
             2013
                      1
                            1
                                   4 39.9
                                            28.0 62.2
                                                            250
                                                                     12.7
                                                                                   NA
## 5 EWR
             2013
                      1
                            1
                                   5 39.0
                                            28.0 64.4
                                                            260
                                                                     12.7
                                                                                   NA
## 6 EWR
             2013
                      1
                            1
                                   6 37.9
                                            28.0 67.2
                                                            240
                                                                      11.5
                                                                                   NA
## # i 4 more variables: precip <dbl>, pressure <dbl>, visib <dbl>,
     time_hour <dttm>
print(head(airlines))
## # A tibble: 6 x 2
##
     carrier name
     <chr>
##
             <chr>>
## 1 9E
             Endeavor Air Inc.
```

American Airlines Inc.

2 AA



```
## 3 AS
             Alaska Airlines Inc.
## 4 B6
             JetBlue Airways
             Delta Air Lines Inc.
## 5 DL
## 6 EV
             ExpressJet Airlines Inc.
print(head(planes))
## # A tibble: 6 x 9
                                        manufacturer model engines seats speed engine
##
     tailnum year type
##
     <chr>>
             <int> <chr>
                                                     <chr>>
                                                              <int> <int> <int> <chr>
                                        <chr>
                                                     EMB-~
                                                                  2
                                                                       55
## 1 N10156
              2004 Fixed wing multi ~ EMBRAER
                                                                              NA Turbo~
## 2 N102UW
                                                                      182
              1998 Fixed wing multi ~ AIRBUS INDU~ A320~
                                                                  2
                                                                              NA Turbo~
## 3 N103US
              1999 Fixed wing multi ~ AIRBUS INDU~ A320~
                                                                      182
                                                                              NA Turbo~
                                                                  2
## 4 N104UW
              1999 Fixed wing multi ~ AIRBUS INDU~ A320~
                                                                      182
                                                                             NA Turbo~
                                                                  2
## 5 N10575
              2002 Fixed wing multi ~ EMBRAER
                                                     EMB-~
                                                                  2
                                                                       55
                                                                              NA Turbo~
## 6 N105UW
              1999 Fixed wing multi ~ AIRBUS INDU~ A320~
                                                                  2
                                                                      182
                                                                             NA Turbo~
# Comprobamos las variables de cada uno de los datasets que nos proporcionan
# mediante la instrucción "summary".
print(summary(flights))
##
                        month
                                                          dep_time
                                                                      sched_dep_time
         year
                                           day
##
    Min.
           :2013
                    Min.
                           : 1.000
                                     Min.
                                             : 1.00
                                                      Min.
                                                                      Min.
                                                                              : 106
    1st Qu.:2013
                    1st Qu.: 4.000
                                      1st Qu.: 8.00
                                                       1st Qu.: 907
                                                                      1st Qu.: 906
    Median:2013
                   Median : 7.000
                                     Median :16.00
                                                      Median:1401
##
                                                                      Median:1359
##
    Mean
           :2013
                   Mean
                           : 6.549
                                     Mean
                                            :15.71
                                                      Mean
                                                             :1349
                                                                      Mean
                                                                              :1344
    3rd Qu.:2013
                    3rd Qu.:10.000
                                      3rd Qu.:23.00
                                                      3rd Qu.:1744
##
                                                                      3rd Qu.:1729
    Max.
           :2013
                           :12.000
                                             :31.00
                                                              :2400
##
                    Max.
                                     Max.
                                                      Max.
                                                                      Max.
                                                                              :2359
##
                                                      NA's
                                                              :8255
##
      dep_delay
                          arr_time
                                       sched_arr_time
                                                         arr_delay
           : -43.00
                                                              : -86.000
##
    Min.
                       Min.
                             :
                                       Min.
                                                      Min.
    1st Qu.: -5.00
                       1st Qu.:1104
                                       1st Qu.:1124
##
                                                       1st Qu.: -17.000
    Median: -2.00
                       Median:1535
                                       Median:1556
                                                      Median : -5.000
##
##
    Mean
           : 12.64
                       Mean
                             :1502
                                       Mean
                                              :1536
                                                      Mean
                                                                  6.895
    3rd Qu.: 11.00
                                                      3rd Qu.: 14.000
##
                       3rd Qu.:1940
                                       3rd Qu.:1945
           :1301.00
                                              :2359
##
    Max.
                              :2400
                                                              :1272.000
                       Max.
                                       Max.
                                                      Max.
    NA's
           :8255
                       NA's
##
                              :8713
                                                      NA's
                                                              :9430
##
      carrier
                            flight
                                         tailnum
                                                               origin
##
    Length: 336776
                        Min.
                               : 1
                                       Length: 336776
                                                            Length: 336776
##
    Class :character
                        1st Qu.: 553
                                        Class : character
                                                            Class : character
                                       Mode :character
                                                            Mode :character
##
    Mode :character
                        Median:1496
##
                        Mean
                               :1972
##
                        3rd Qu.:3465
##
                               :8500
                        Max.
##
##
        dest
                           air_time
                                            distance
                                                              hour
                        Min.
                              : 20.0
                                                : 17
                                                                : 1.00
##
    Length: 336776
                                         Min.
                                                        Min.
                                         1st Qu.: 502
##
    Class : character
                        1st Qu.: 82.0
                                                         1st Qu.: 9.00
                        Median :129.0
                                         Median: 872
                                                        Median :13.00
##
    Mode : character
##
                               :150.7
                                                :1040
                        Mean
                                         Mean
                                                        Mean
                                                               :13.18
##
                        3rd Qu.:192.0
                                         3rd Qu.:1389
                                                        3rd Qu.:17.00
```



```
##
                        Max.
                                :695.0
                                         Max.
                                                 :4983
                                                         Max.
                                                                 :23.00
##
                        NA's
                                :9430
        minute
##
                       time hour
##
    Min.
           : 0.00
                             :2013-01-01 05:00:00
                     Min.
    1st Qu.: 8.00
                     1st Qu.:2013-04-04 13:00:00
##
    Median :29.00
                     Median :2013-07-03 10:00:00
##
    Mean
            :26.23
                     Mean
                             :2013-07-03 05:22:54
##
    3rd Qu.:44.00
                     3rd Qu.:2013-10-01 07:00:00
##
    Max.
            :59.00
                             :2013-12-31 23:00:00
##
print(summary(airports))
##
        faa
                             name
                                                  lat
                                                                   lon
##
    Length: 1458
                        Length: 1458
                                                    :19.72
                                                                      :-176.65
                                             Min.
                                                              Min.
    Class :character
                        Class : character
                                             1st Qu.:34.26
                                                              1st Qu.:-119.19
    Mode :character
                                             Median :40.09
##
                        Mode :character
                                                              Median: -94.66
##
                                                    :41.65
                                                                      :-103.39
                                             Mean
                                                              Mean
##
                                             3rd Qu.:45.07
                                                              3rd Qu.: -82.52
##
                                             Max.
                                                    :72.27
                                                                      : 174.11
                                                              Max.
##
         alt
                                               dst
                                                                  tzone
                              t.z.
           : -54.00
                               :-10.000
##
    Min.
                       Min.
                                           Length: 1458
                                                               Length: 1458
                                           Class : character
    1st Qu.:
             70.25
                       1st Qu.: -8.000
                                                               Class : character
##
    Median: 473.00
                       Median : -6.000
##
                                           Mode : character
                                                               Mode : character
            :1001.42
                               : -6.519
##
    Mean
                       Mean
##
    3rd Qu.:1062.50
                       3rd Qu.: -5.000
    Max.
            :9078.00
                               : 8.000
                       Max.
print(summary(weather))
                              year
##
       origin
                                             month
                                                                day
    Length: 26115
                                :2013
                                                : 1.000
                                                                  : 1.00
                        Min.
                                        Min.
                                                           Min.
    Class : character
                        1st Qu.:2013
                                        1st Qu.: 4.000
                                                           1st Qu.: 8.00
##
    Mode :character
                        Median:2013
                                        Median : 7.000
                                                           Median :16.00
##
                        Mean
                                :2013
                                        Mean
                                                : 6.504
                                                           Mean
                                                                  :15.68
##
                        3rd Qu.:2013
                                        3rd Qu.: 9.000
                                                           3rd Qu.:23.00
##
                        Max.
                                :2013
                                        Max.
                                                :12.000
                                                           Max.
                                                                  :31.00
##
##
         hour
                          temp
                                             dewp
                                                             humid
                             : 10.94
                                               :-9.94
##
    Min.
           : 0.00
                     Min.
                                       Min.
                                                         Min.
                                                                : 12.74
    1st Qu.: 6.00
                                                         1st Qu.: 47.05
##
                     1st Qu.: 39.92
                                       1st Qu.:26.06
    Median :11.00
                     Median : 55.40
                                       Median :42.08
                                                        Median: 61.79
##
##
    Mean
            :11.49
                     Mean
                            : 55.26
                                       Mean
                                               :41.44
                                                         Mean
                                                                : 62.53
##
    3rd Qu.:17.00
                     3rd Qu.: 69.98
                                       3rd Qu.:57.92
                                                         3rd Qu.: 78.79
##
    Max.
           :23.00
                     Max.
                             :100.04
                                       Max.
                                               :78.08
                                                         Max.
                                                                :100.00
                     NA's
                                       NA's
                                                         NA's
##
                             :1
                                               :1
                                                                :1
##
       wind_dir
                       wind_speed
                                            wind_gust
                                                               precip
          : 0.0
                                                                  :0.000000
##
    Min.
                     Min.
                           :
                                 0.000
                                         Min.
                                                 :16.11
                                                           Min.
##
    1st Qu.:120.0
                     1st Qu.:
                                 6.905
                                         1st Qu.:20.71
                                                           1st Qu.:0.000000
    Median :220.0
                     Median :
                              10.357
                                         Median :24.17
                                                           Median: 0.000000
##
    Mean
           :199.8
                     Mean
                           : 10.518
                                         Mean
                                                 :25.49
                                                           Mean
                                                                  :0.004469
```



```
3rd Qu.:290.0
                    3rd Qu.: 13.809
                                         3rd Qu.:28.77
                                                         3rd Qu.:0.000000
##
    Max.
           :360.0
                    Max.
                            :1048.361
                                        Max.
                                                :66.75
                                                                 :1.210000
                                                         Max.
                    NA's
##
    NA's
           :460
                            :4
                                        NA's
                                                :20778
##
       pressure
                          visib
                                         time_hour
##
   Min.
           : 983.8
                      Min.
                            : 0.000
                                               :2013-01-01 01:00:00
##
    1st Qu.:1012.9
                      1st Qu.:10.000
                                       1st Qu.:2013-04-01 21:30:00
                      Median :10.000
                                       Median :2013-07-01 14:00:00
##
   Median :1017.6
##
   Mean
           :1017.9
                      Mean
                            : 9.255
                                               :2013-07-01 18:26:37
##
    3rd Qu.:1023.0
                      3rd Qu.:10.000
                                        3rd Qu.:2013-09-30 13:00:00
## Max.
           :1042.1
                      Max.
                             :10.000
                                       Max.
                                               :2013-12-30 18:00:00
   NA's
           :2729
print(summary(airlines))
##
      carrier
                            name
##
   Length:16
                        Length:16
##
   Class :character
                        Class : character
  Mode :character
                        Mode :character
print(summary(planes))
##
      tailnum
                                                           manufacturer
                             year
                                            type
##
   Length:3322
                        Min.
                               :1956
                                       Length:3322
                                                           Length: 3322
    Class : character
                        1st Qu.:1997
                                       Class :character
                                                           Class : character
    Mode :character
                        Median:2001
                                       Mode :character
                                                           Mode :character
##
##
                        Mean
                               :2000
##
                        3rd Qu.:2005
##
                        Max.
                               :2013
##
                        NA's
                               :70
       model
##
                           engines
                                             seats
                                                             speed
##
    Length: 3322
                        Min.
                               :1.000
                                        Min.
                                                : 2.0
                                                         Min.
                                                                 : 90.0
    Class : character
                        1st Qu.:2.000
                                         1st Qu.:140.0
                                                         1st Qu.:107.5
##
    Mode :character
                        Median :2.000
                                        Median :149.0
                                                         Median :162.0
##
                        Mean
                               :1.995
                                        Mean
                                               :154.3
                                                         Mean
                                                                :236.8
##
                        3rd Qu.:2.000
                                         3rd Qu.:182.0
                                                         3rd Qu.:432.0
##
                        Max.
                               :4.000
                                                :450.0
                                                         Max.
                                                                 :432.0
##
                                                         NA's
                                                                 :3299
##
       engine
##
    Length: 3322
##
    Class : character
##
    Mode : character
##
##
##
##
# Simplificar los dataframes originales a 100 observaciones. Renombrarlos
# introduciendo la coletilla "_simple".
flights_simple <- head(flights, 100)
airports_simple <- head(airports,100)</pre>
```



```
weather_simple <- head(weather,100)</pre>
airlines_simple <- head(airlines,100)</pre>
planes_simple <- head(planes,100)</pre>
# Selecciona los tipos de aerolinea ("carrier") mediante la instruccion "select"
# y el operador "unique" concatenados con el operador tuberia %>%.
airlines_simple %>% unique %>% select(carrier)
## # A tibble: 16 x 1
##
      carrier
##
      <chr>
##
  1 9E
## 2 AA
## 3 AS
## 4 B6
## 5 DL
## 6 EV
## 7 F9
## 8 FL
## 9 HA
## 10 MQ
## 11 00
## 12 UA
## 13 US
## 14 VX
## 15 WN
## 16 YV
# Obtener la media y el maximo de asientos ("seats") que tienen los aviones.
# Utilizar el operador tuberia %>%.
planes_simple %>% summarise(mean = mean(seats), max_engines = max(seats))
## # A tibble: 1 x 2
##
      mean max engines
##
     <dbl>
                 <int>
                   330
## 1 105.
# Ordenar los aviones por numero de motores ("engines") y numero de asientos ("seats").
result1 <- arrange(planes_simple,engines,seats)</pre>
print(result1)
## # A tibble: 100 x 9
##
     tailnum year type
                                      manufacturer model engines seats speed engine
      <chr> <int> <chr>
                                                            <int> <int> <int> <chr>
##
                                      <chr>
                                                    <chr>
  1 N10156 2004 Fixed wing multi~ EMBRAER
##
                                                   EMB-~
                                                                2
                                                                     55
                                                                           NA Turbo~
## 2 N10575
                                                                2
                                                                     55
                                                                           NA Turbo~
               2002 Fixed wing multi~ EMBRAER
                                                   EMB-~
## 3 N11106
               2002 Fixed wing multi~ EMBRAER
                                                   EMB-~
                                                                2
                                                                     55
                                                                           NA Turbo~
## 4 N11107
               2002 Fixed wing multi~ EMBRAER
                                                    EMB-~
                                                                2
                                                                     55
                                                                           NA Turbo~
## 5 N11109
               2002 Fixed wing multi~ EMBRAER
                                                   EMB-~
                                                                2
                                                                     55
                                                                           NA Turbo~
## 6 N11113
               2002 Fixed wing multi~ EMBRAER
                                                   EMB-~
                                                                2
                                                                     55
                                                                           NA Turbo~
```



```
7 N11119
               2002 Fixed wing multi~ EMBRAER
                                                    EMB-~
                                                                      55
                                                                            NA Turbo~
                                                                 2
## 8 N11121
               2003 Fixed wing multi~ EMBRAER
                                                    EMB-~
                                                                 2
                                                                      55
                                                                            NA Turbo~
                                                    EMB-~
                                                                            NA Turbo~
## 9 N11127
               2003 Fixed wing multi~ EMBRAER
                                                                 2
                                                                      55
## 10 N11137
               2003 Fixed wing multi~ EMBRAER
                                                    EMB-~
                                                                      55
                                                                            NA Turbo~
## # i 90 more rows
# Averigua que numero de cola comparten los dataframes "flights_simple"
# y "planes_simple" que has creado anteriormente.
# Obten su aerolinea ("carrier")
shared <- inner_join(flights_simple,planes_simple,by="tailnum") # -> N14228
shared_carrier <- shared$carrier</pre>
print(shared_carrier)
## [1] "EV"
# Cruzar los datos de vuelos ("flights") con los aviones ("planes")
# por el numero de cola ("tailnum") que no coincidan.
# De esos obtener aquellos con 2 o mas motores.
# Finlmente obtener los distintos modelos de avión que satisfacen las premisas anteriores.
fp <- anti_join(planes_simple,flights_simple,by="tailnum")</pre>
engines_fp <- filter(fp,engines >= 2)
result2 <- unique(engines_fp$model) # No queremos los repetidos. Por lo tanto usamos "unique".
print(result2)
## [1] "EMB-145XR" "A320-214" "EMB-145LR" "737-824"
                                                        "767-332"
                                                                     "757-224"
# Crea una nueva variable que calcule el retraso total sumando los
# delays acumulados ("dep_delay") y ("arr_delay").
# Almacena el dataframe resultante en "flights_total".
flights_total <- mutate(flights_simple,total_delay=dep_delay+arr_delay)
# En base a la variable anteriormente obtenida, devuelve los aviones que
# han llegado con antelación a su destino.
filter(flights_total,total_delay < 0)</pre>
## # A tibble: 57 x 20
##
                    day dep_time sched_dep_time dep_delay arr_time sched_arr_time
       vear month
##
      <int> <int> <int>
                           <int>
                                           <int>
                                                     <dbl>
                                                               <int>
                                                                              <int>
   1 2013
                             544
                                             545
                                                        -1
                                                                1004
                                                                               1022
##
##
   2 2013
                1
                      1
                             554
                                             600
                                                        -6
                                                                 812
                                                                                837
  3 2013
                                                        -3
                                                                 709
                                                                                723
##
                1
                      1
                             557
                                             600
   4 2013
                             557
                                                        -3
                                                                 838
                                                                                846
##
                1
                      1
                                             600
  5 2013
                             558
                                             600
                                                        -2
                                                                 849
                                                                                851
##
                      1
##
   6 2013
                      1
                             558
                                             600
                                                        -2
                                                                 853
                                                                                856
##
   7 2013
                             558
                                             600
                                                        -2
                                                                 923
                                                                                937
##
   8 2013
                      1
                             559
                                             559
                                                         0
                                                                 702
                                                                                706
##
  9 2013
                      1
                             559
                                             600
                                                        -1
                                                                 854
                                                                                902
## 10 2013
                1
                      1
                              600
                                             600
                                                         0
                                                                 851
                                                                                858
## # i 47 more rows
## # i 12 more variables: arr_delay <dbl>, carrier <chr>, flight <int>,
       tailnum <chr>, origin <chr>, dest <chr>, air_time <dbl>, distance <dbl>,
       hour <dbl>, minute <dbl>, time_hour <dttm>, total_delay <dbl>
## #
```