Homework3 1

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Chap 4. Data transformation

```
library (nycflights13)
library (tidyverse)
#데이터 확인
flights %>% head(5)
# A tibble: 5 x 19
  year month day dep_time sched_dep_time dep_delay arr_time sched_arr_time
  \langle \text{int} \rangle \langle \text{int} \rangle
1 2013 1 1 517
                                         515
                                                    2 830
                                                              850
                          533
                                          529
2 2013
           1
                 1
                                                       4
                                                                                 830
```

2

-1

923

1004

850

1022

1 1 544 1 1 554 1004 812 545 -1 600 -6 5 2013 # ... with 11 more variables: arr delay <dbl>, carrier <chr>, flight <int>,

tailnum <chr>, origin <chr>, dest <chr>, air_time <dbl>, distance <dbl>,

540

545

hour <dbl>, minute <dbl>, time_hour <dttm>

1 1

542

flights %>% glimpse

3 2013

4 2013

```
Observations: 336,776
Variables: 19
              <int> 2013, 2013, 2013, 2013, 2013, 2013, 2013, 2013...
$ year
             $ month
$ day
             $ dep_time <int> 517, 533, 542, 544, 554, 554, 555, 557, 558, 55...
$ sched_dep_time <int> 515, 529, 540, 545, 600, 558, 600, 600, 600, 600, 600...
$ dep delay
            <dbl> 2, 4, 2, -1, -6, -4, -5, -3, -3, -2, -2, -2, -2, -2, ...
$ arr_time
             <int> 830, 850, 923, 1004, 812, 740, 913, 709, 838, 753, 8...
$ sched_arr_time <int> 819, 830, 850, 1022, 837, 728, 854, 723, 846, 745, 8...
$ arr_delay <dbl> 11, 20, 33, -18, -25, 12, 19, -14, -8, 8, -2, -3, 7,...
             <chr> "UA", "UA", "AA", "B6", "DL", "UA", "B6", "EV", "B6"...
$ carrier
             <int> 1545, 1714, 1141, 725, 461, 1696, 507, 5708, 79, 301...
$ flight
             <chr> "N14228", "N24211", "N619AA", "N804JB", "N668DN", "N...
$ tailnum
$ origin
              <chr> "EWR", "LGA", "JFK", "JFK", "LGA", "EWR", "EWR", "LG...
              <chr> "IAH", "IAH", "MIA", "BQN", "ATL", "ORD", "FLL", "IA...
              <dbl> 227, 227, 160, 183, 116, 150, 158, 53, 140, 138, 149...
$ air time
             <dbl> 1400, 1416, 1089, 1576, 762, 719, 1065, 229, 944, 73...
$ distance
             <dbl> 5, 5, 5, 5, 6, 5, 6, 6, 6, 6, 6, 6, 6, 6, 6, 5, 6, 6...
$ hour
             <dbl> 15, 29, 40, 45, 0, 58, 0, 0, 0, 0, 0, 0, 0, 0, 59...
$ minute
$ time_hour
             <dttm> 2013-01-01 05:00:00, 2013-01-01 05:00:00, 2013-01-0...
```

flights %>% summary()

```
        year
        month
        day
        dep_time
        sched_dep_time

        Min.
        : 2013
        Min.
        : 1.000
        Min.
        : 1.00
        Min.
        : 1
        Min.
        : 106

                                          1st Qu.: 4.000
                           1st Qu.: 8.00
1st Qu.:2013
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 Max. :12.000 Max. :31.00 Max. :2400 Max. :2359
                                          NA's :8255
 dep_delay
                 arr_time sched_arr_time arr_delay
Min. : -43.00 Min. : 1 Min. : 1 Min. : -86.000
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 :1536
Mean : 12.64
               Mean :1502
                                          Mean : 6.895
3rd Qu.: 11.00
                3rd Qu.:1940
                             3rd Qu.:1945
                                           3rd Qu.: 14.000
Max. :1301.00
                Max. :2400
                             Max. :2359
                                          Max. :1272.000
                      :8713
NA's
      :8255
                NA's
                                           NA's :9430
                flight
                               tailnum
 carrier
                                                 origin
Length:336776
                Min. : 1 Length:336776
                                              Length:336776
Mode :character Median :1496 Mode :character Mode :character
                Mean :1972
                3rd Qu.:3465
                Max. :8500
                               distance
  dest
                  air_time
                                                hour
Length:336776
                Min. : 20.0 Min. : 17
                                           Min. : 1.00
Class :character
                1st Qu.: 82.0
                               1st Qu.: 502
                                            1st Qu.: 9.00
                Median :129.0
                               Median : 872
                                            Median :13.00
Mode :character
                 Mean :150.7
                               Mean :1040
                                            Mean :13.18
                              3rd Qu.:1389 3rd Qu.:17.00
                 3rd Qu.:192.0
                Max. :695.0 Max. :4983 Max. :23.00
                NA's :9430
  minute
              time_hour
Min. : 0.00 Min. :2013-01-01 05:00:00
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.:2013-10-01 07:00:00
3rd Ou.:44.00
Max. :59.00 Max. :2013-12-31 23:00:00
```

1. filter function

[example]

• month가 1이고 day가 1인 경우

```
flights %>% filter(month == 1, day == 1) %>% head(10)
```

```
# A tibble: 10 x 19
    year month day dep_time sched_dep_time dep_delay arr_time sched_arr_time
   <int> <int> <int> <int> <int> <dbl> <int>
                                            515 2 830

529 4 850

540 2 923

545 -1 1004

600 -6 812

558 -4 740

600 -5 913

600 -3 709

600 -3 838

600 -2 753
                                                          2 830
1 2013 1 1
                            517
                                                                                      819
2 2013 1
                    1
                            533
                                                                                      830
 3 2013 1 1
                           542
3 2013 1 1 542

4 2013 1 1 544

5 2013 1 1 554

6 2013 1 1 555

7 2013 1 1 555

8 2013 1 1 557

9 2013 1 1 557

10 2013 1 1 558
                                                                                      854
                                                                                        723
                                                                                       846
10 2013
# ... with 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>
```

• month가 11과 12인 경우

```
flights %>% filter(month %in% c(11,12)) %>% head(10)
```

• [참고]

```
sqrt(2) ^ 2 == 2
```

```
[1] FALSE
```

```
near(sqrt(2) ^ 2, 2)
```

```
[1] TRUE
```

여기에 대해 False라고 한다. 왜냐하면 왼쪽은 2에 가까워지는 수이지 2가 아니고 R에서도 무한대 형태의 저장을 못하기 때문이다. 하지만 아래의 결과처럼 비슷하냐고 물으면 그렇다고 출력한다.

1-1. Had an arrival delay of two or more hours

```
flights %>% filter(arr_delay >= 120 ) #arr_delay는 분으로 표시됐으니 주의하자.
```

```
# A tibble: 10,200 x 19
   year month day dep_time sched_dep_time dep_delay arr_time sched_arr_time
   <int> <int> <int> <int> <int> <int> <int> <int>
2 2013 1 1 848
3 2013 1 1 957
4 2013 1 1 1114
5 2013 1 1 1505
6 2013 1 1 1525
7 2013 1 1 1549
8 2013 1 1 1558
9 2013 1 1 1732
10 2013 1 1 1803
 1 2013 1 1 811
                                                   630
                                             630 101 1047
1835 853 1001
733 144 1056
900 134 1447
1310 115 1638
1340 105 1831
1445 64 1912
1359 119 1718
1630 62 2028
                                                                853 1001
                                                                                               1950
                                                                                                853
                                                                                               1222
                                                                                              1431
                                                                                               1626
                                                                                               1656
                                                                                                1825

    9
    2013
    1
    1
    1732
    1630
    62
    2028

    10
    2013
    1
    1
    1803
    1620
    103
    2008

                                                                                                1750
# ... with 10,190 more rows, and 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>
```

1-2. Flew to Houston (IAH or HOU)

```
flights %>% filter(dest == 'IAH'| dest =='HOU')
```

1-3. Were operated by United (UA), American (AA), or Delta (DL). Find the data airline to get details.

```
airlines #airlines를 통해 축약어의 풀네임을 볼 수 있다.
```

```
# A tibble: 16 x 2
  carrier name
  <chr> <chr>
1 9E
         Endeavor Air Inc.
2 AA
         American Airlines Inc.
3 AS
         Alaska Airlines Inc.
4 B6
         JetBlue Airways
         Delta Air Lines Inc.
5 DL
6 EV
         ExpressJet Airlines Inc.
7 F9
         Frontier Airlines Inc.
8 FL
         AirTran Airways Corporation
          Hawaiian Airlines Inc.
9 HA
10 MQ
          Envoy Air
11 00
          SkyWest Airlines Inc.
12 UA
          United Air Lines Inc.
13 US
          US Airways Inc.
14 VX
          Virgin America
15 WN
         Southwest Airlines Co.
16 YV
         Mesa Airlines Inc.
```

```
flights %>% filter(carrier %in% c('UA','AA','DL'))
```

```
# A tibble: 139,504 x 19
  year month day dep_time sched_dep_time dep_delay arr_time sched_arr_time
                       <int> <dbl> <int>
                                                  <int>
 <int> <int> <int> <int>
1 2013
           1
                  517
                              515
                                             830
       1
                                      2
                                                        819
                                            850
2 2013
        1
             1
                  533
                              529
                                       4
3 2013 1 1
                              540
                                       2 923
                  542
                                       -6 812
-4 740
-2 753
-2 924
-2 923
4 2013 1 1
                  554
                              600
5 2013 1 1
                  554
                              558
                                                         728
                  558
6 2013 1 1
                             600
                                                         745
                  558
7 2013
        1 1
                              600
                                                         917
                  558
8 2013
         1
             1
                              600
                                                         937
         1 1
                 559
559
                                          941
854
9 2013
                               600
                                        -1
                                                         910
                                   -1
                               600
         1
              1
# ... with 139,494 more rows, and 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>
```

1-4. Departed in summer (July, August, and September)

```
flights %>% filter(month %in% c(7,8,9))
```

```
# A tibble: 86,326 x 19
  year month day dep_time sched_dep_time dep_delay arr_time sched_arr_time
                            <int> <dbl> <int>
  <int> <int> <int> <int>
                     1
1 2013
              1
                                  2029
                                            212
                                                    236
                                                                 2359
                       2
                                                    344
2 2013
                                              3
           7
                1
                                   2359
                                                                  344
              1
                                  2245
                                            104
                                                    151
                      29
3 2013
         7
                                  2130
              1
                                                    322
                                                                   14
4 2013
          7
                       4.3
                                            193
         7 1
                                            174 300
5 2013
                      44
                                  2150
                                                                  100
                                            235 304
287 308
183 335
6 2013
          7 1
                      46
                                  2051
                                                                 2358
7 2013
          7 1
                       48
                                  2001
8 2013
          7 1
                       58
                                  2155
                                                                   43
9 2013 7 1 100
10 2013 7 1 100

      2146
      194
      327

      2245
      135
      337

                                                                   3.0
10 2013
                                                                   135
\# ... with 86,316 more rows, and 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>
```

```
# A tibble: 86,326 x 19
      year month day dep time sched dep time dep delay arr time sched arr time
    <int> <int> <int> <int> <int> <int> <int> <dbl> <int> <dbl> <int> </dbl>
                                                                            212 236
3 344
 1 2013 7 1
                                   1
2
                                                                                                                 2359
2 2013 7 1 29
3 2013 7 1 29
4 2013 7 1 43
5 2013 7 1 44
6 2013 7 1 46
7 2013 7 1 48
8 2013 7 1 58
9 2013 7 1 100
10 2013 7 1 100

    2359
    3
    344

    2245
    104
    151

    2130
    193
    322

    2150
    174
    300

    2051
    235
    304

    2001
    287
    308

    2155
    183
    335

    2146
    194
    327

    2245
    135
    337

 2 2013
                        1
                                                           2359
                                                                                                                  344
                                                                                                                      1
                                                                                                                  100
                                                                                                                2358
                                                                                                                2305
                                                                                                                  43
                                                                                                                     30
10 2013
                                                                                                                    135
# ... with 86,316 more rows, and 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>
```

위와 결과 같다. between을 사용해도 같은 결과를 볼 수 있다.

1-5. Arrived more than two hours late, but didn't leave late

```
flights %>% filter(arr_delay >= 120, dep_delay <= 0)</pre>
# A tibble: 29 x 19
   year month day dep time sched dep time dep delay arr time sched arr time
  <int> <int> <int> <int> <int> <int> <int> <dbl> <int> <int>
1550
                                          0 1736
                                                            1526
                                                            1654
                                                            1056
                                                             1845
                                                             850
                                                             950
# ... with 19 more rows, and 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>
```

1-6. Were delayed by at least an hour, but made up over 30 minutes in flight.

```
flights %>% filter(dep_delay>=60, (dep_delay - arr_delay)>30)
# A tibble: 1,844 x 19
   year month day dep_time sched_dep_time dep_delay arr_time sched_arr_time
  <int> <int> <int> <int> <int> <int> <int> <int>
                                            285
                                                    46
1 2013
                     2205
        1
             1
                                  1720
                                                                 2040
                                           116
               1
                     2326
                                                    131
2 2013
         1
                                  2130
                                                                  18
3 2013 1 3
                     1503
                                  1221
                                            162 1803
                                                                1555
4 2013 1 3 1839
                                  1700
                                            99 2056
                                                                1950
5 2013 1 3 1850
                                  1745
                                            65 2148

    1759
    102
    2246

    1845
    65
    2228

    1015
    60
    2135

6 2013 1 3 1941
                                                                2227
7 2013 1 3 1950
               3 2015
8 2013 1
                                            60 2135
                                                                 2111

    2000
    177
    45

    1700
    137
    2135

9 2013 1 3 2257
10 2013 1 4 1917
                                                                 2224
10 2013
                                                                  1950
# ... with 1,834 more rows, and 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>
```

dep_delay가 1시간 이상이지만 비행기에서 30분을 절약했다면 출발 지연에서 도착 지연의 값을 뺐을 때 30분이 단축돼야한다.

1-7. Departed between midnight and 6am (inclusive)

```
# A tibble: 9,373 x 22
   year month day dep_time sched_dep_time dep_delay arr_time sched_arr_time
  <int> <int> <int> <int> <int> <int> <int> <int> 
                                                         2
                                                                   830
1 2013 1 1
                           517
                                             515
                                                                                     819
                                            515 2 830

529 4 850

540 2 923

545 -1 1004

600 -6 812

558 -4 740

600 -5 913

600 -3 709

600 -3 838

600 -2 753
2 2013 1 1 533

3 2013 1 1 542

4 2013 1 1 554

5 2013 1 1 554

6 2013 1 1 555

7 2013 1 1 555

8 2013 1 1 557

9 2013 1 1 557

10 2013 1 1 558
2 2013
                           533
            1
                   1
                                                                                     830
                                                                                      850
                                                                                    1022
                                                                                     837
                                                                                      728
                                                                                      854
                                                                                       723
                                                                                       846
10 2013
                                                                                       745
# ... with 9,363 more rows, and 14 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>,
  new dep time <chr>, dep hour <int>, dep min <int>
```

```
filter(flights, dep_time <= 600 | dep_time == 2400)
```

	year	month	day	dep_time	sched_dep_time	dep_delay	arr_time	sched_arr_time
	<int></int>	<int></int>	<int></int>	<int></int>	<int></int>	<dbl></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	1	1	554	558	-4	740	728
7	2013	1	1	555	600	-5	913	854
8	2013	1	1	557	600	-3	709	723
9	2013	1	1	557	600	-3	838	846
10	2013	1	1	558	600	-2	753	745
	wit	h 9,36	53 more	e rows, an	d 11 more varia	ables: arr	delay <dl< td=""><td>bl>,</td></dl<>	bl>,
#	carri	.er <ch< td=""><td>nr>, fl</td><td>ight <int< td=""><td>>, tailnum <chi< td=""><td>r>, origin</td><td>- <chr>, de</chr></td><td>est <chr>,</chr></td></chi<></td></int<></td></ch<>	nr>, fl	ight <int< td=""><td>>, tailnum <chi< td=""><td>r>, origin</td><td>- <chr>, de</chr></td><td>est <chr>,</chr></td></chi<></td></int<>	>, tailnum <chi< td=""><td>r>, origin</td><td>- <chr>, de</chr></td><td>est <chr>,</chr></td></chi<>	r>, origin	- <chr>, de</chr>	est <chr>,</chr>

첫 번쨰 방법으로 풀었으나 두번 쨰 방법이 훨씬 간단하다.

- [참고] modulo operator : %% => returns the remainder of division.
- 2. Another useful dplyr filtering helper is between(). What does it do? Can you use it to simplify the code needed to answer the previous challenges?

```
flights %>% filter(between(month,7,9))
```

```
# A tibble: 86,326 x 19
   year month day dep time sched dep time dep delay arr time sched arr time
  <int> <int> <int> <int> <int> <int> <int> <dbl> <int> <dbl> <int> </dbl>
2359
                                                               344
                                                                1
                                                               100
                                                              2358
                                                              2305
                                                              43
                                                                30
10 2013
                                                               135
# ... with 86,316 more rows, and 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>
```

위 1-4.번 문제를 between을 이용해 풀면 위와 같다.

3. How many flights have a missing dep_time? What other variables are missing? What might these rows represent?

```
flights$dep_time %>% is.na %>% sum \# \bar{A} \triangle E = 0
[1] 8255
flights %>% filter(is.na(dep_time))
# A tibble: 8,255 x 19
    year month day dep_time sched_dep_time dep_delay arr_time sched_arr_time
  <int> <int> <int> <int> <int> <int> <int> 
                                                    NA NA
1 2013 1 1 NA
                                          1630
                                                                                1815
2 2013 1 1 NA
3 2013 1 1 NA
4 2013 1 1 NA
5 2013 1 2 NA
6 2013 1 2 NA
7 2013 1 2 NA
8 2013 1 2 NA
9 2013 1 2 NA
10 2013 1 2 NA
 2 2013 1
                  1
                           NA
                                          1935
                                                       NA
                                                                 NA
                                                                                2240
                                        1935 NA NA
1500 NA NA
600 NA NA
1540 NA NA
1620 NA NA
1355 NA NA
1420 NA NA
1321 NA NA
1545 NA NA
                                                                                 901
                                                                                1747
                                                                                1746
                                                                                1459
                                                                                 1644
                                                                                 1536
10 2013
                                           1545
                                                        NA
# ... with 8,245 more rows, and 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>
```

dep_time이 NA라는 것은 취소된 항공이라는 뜻이다. 취소된 8255개의 항공은 위와 같다.

2. arrange function

[example]

```
flights %>% arrange(dep_time) #dep_time을 오름차순으로 보여준다.
```

flights %>% arrange(desc(dep_time)) #내림차순

```
# A tibble: 336,776 x 19
            year month day dep_time sched_dep_time dep_delay arr_time sched_arr_time
        <int> <int <int > <int 
                                                                                                       1 2013 10 30 2400
  2 2013 11 27 2400
                                                                                                                                                                                                                                                          445
  3 2013 12 5 2400
  4 2013 12 9 2400
  5 2013 12
                                                         9 2400
                                                                                                                                                                                                                                                     2356
  6 2013 12 13 2400
                                                                                                                                                                                                                                                         440
  7 2013 12 19 2400
                                                                                                                                                                                                                                                              440
                                12
  8 2013
                                                     29 2400
                                                                                                                                                                                                                                                       2025
                               2
                                                    7 2400
7 2400
  9 2013
                                                                                                                                                                                                                                                              436
                                         2
# ... with 336,766 more rows, and 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>
```

[Your turn 02]

1. How could you use arrange() to sort all missing values (in dep_time) to the start?

```
flights %>% mutate(dep_time_na = is.na(flights$dep_time)) %>%
  arrange(desc(dep_time_na),dep_time)
```

```
# A tibble: 336,776 x 20
   year month day dep time sched dep time dep delay arr time sched arr time
                          <int> <dbl> <int>
  <int> <int> <int> <int>
                                         NA
        1 1
                   NA
                                                 NA
1 2013
                                 1630
                                                               1815
2 2013
         1
              1
                      NA
                                 1935
                                           NA
                                                   NA
                                                               2240
3 2013 1 1 NA
4 2013 1 1 NA
5 2013 1 2 NA
6 2013 1 2 NA
7 2013 1 2 NA
8 2013 1 2 NA
9 2013 1 2 NA
                                 1500
                                           NA
                                                   NA
                                                               1825
                                  600
                                           NA
                                                   NA
                                 1540
                                           NA
                                                   NA
                                                               1747
                                 1620
                                           NA
                                                   NA
                                                               1746
                                 1355
                                           NA
                                                   NA
                                                               1459
                                 1420
1321
1545
                                                   NA
                                           NA
                                                               1644
                                           NA
NA
              2
9 2013
         1
                      NA
                                                    NA
                                                               1536
10 2013
          1
               2
                      NA
                                 1545
                                           NA
                                                    NA
                                                               1910
# ... with 336,766 more rows, and 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 <dtm>,
#
  dep_time_na <lgl>
```

2. Sort flights to find the most delayed flights. Find the flights that left earliest.

```
flights %>% arrange(desc(dep_delay)) %>% select(carrier,origin,dest,dep_delay)
```

```
# A tibble: 336,776 x 4
 carrier origin dest dep_delay
  <chr> <chr> <chr>
                        <dbl>
        JFK HNL
1 HA
                       1301
             CMH
                        1137
2 MQ
        JFK
3 MO
        EWR
               ORD
                        1126
4 AA
         JFK
               SFO
                         1014
5 MO
         JFK
               CVG
                        1005
6 DL
         JFK
               TPA
                         960
7 DL
         LGA
              MSP
                         911
8 DT
         JFK
               PDX
                         899
9 DL
        T.GA
             ATL
                         898
10 AA
        EWR MIA
# ... with 336,766 more rows
```

가장 지연된 비행기는 JFK에서 HNL로 가는 HA이다.

3. Sort flights to find the fastest (highest speed) flights.

```
flights %>% arrange(air_time) %>% select(carrier,origin,dest,air_time)
```

```
# A tibble: 336,776 x 4
 carrier origin dest air_time
  <chr> <chr> <chr> <chr> <dbl>
         EWR
               BDL
2 EV
         EWR
               BDL
3 EV
         EWR
               BDL
                          21
                         21
4 EV
         EWR
               PHL
              BDL
5 EV
        EWR
                         2.1
6 EV
        EWR PHL
                         21
7 US
        LGA
              BOS
                         21
8 9E
        JFK
             PHL
9 EV
        EWR
             BDL
                         21
10 EV
        EWR
              BDL
                         21
# ... with 336,766 more rows
```

가장 빠른 비행기는 EWR에서 BDL로 가는 EV이다.

4. Which flights travelled the farthest? Which travelled the shortest?

```
flights %>% arrange(desc(distance)) %>% select(carrier,origin,dest, distance)
```

```
# A tibble: 336,776 x 4
 carrier origin dest distance
 <chr> <chr> <chr> <chr> <dbl>
1 HA
        JFK
              HNL
2 HA
       JFK
                     4983
              HNL
3 на
       JFK
              HNL
                     4983
4 HA
                     4983
       JFK
              HNL
5 HA
       JFK HNL
                     4983
6 HA
       JFK
              HNL
                     4983
7 HA
       JFK
              HNL
                     4983
8 HA
        JFK
              HNL
                      4983
9 HA
        JFK
              HNL
                      4983
10 HA
        JFK
             HNL
                     4983
# ... with 336,766 more rows
```

```
# A tibble: 336,776 x 4
 carrier origin dest distance
  <chr>
        <chr> <chr> <dbl>
        EWR
              LGA
2 EV
        EWR
              PHL
                        80
                        80
3 EV
        EWR
              PHL
4 EV
                        8.0
        EWR
              PHL
5 EV
                       80
        EWR
              PHL
6 EV
       EWR
              PHL
                       80
7 EV
             PHL
       EWR
8 EV
       EWR PHL
9 EV
       EWR PHL
                        80
      EWR
10 EV
             PHL
                       80
# ... with 336,766 more rows
```

가장 거리가 먼 비행은 JRK에서 HNL로 가는 HA이다. 그 거리는 위와 같다. 가장 짧은 비행은 EWR에서 LGA로 가는 US이다. 그 거리는 위와 같다.

3. select function

[example]

• 해당 변수만 포함

```
select(flights, year, month, day)
```

```
# A tibble: 336,776 x 3
  year month day
 <int> <int> <int>
1 2013
       1
2 2013
3 2013 1
4 2013 1
5 2013 1
6 2013 1
            1
            1
7 2013 1
8 2013
        1
             1
9 2013 1
            1
10 2013
# ... with 336,766 more rows
```

```
select(flights, year:day)
```

```
# A tibble: 336,776 x 3
  year month day
  <int> <int> <int>
1 2013
  2013
        1
3 2013
4 2013
5 2013
        1
6 2013
        1
7 2013 1
8 2013
9 2013 1
10 2013
        1
              1
# ... with 336,766 more rows
```

• 해당 변수 제외

select(flights, -(year:day)) #제외하고 보겠다.

```
# A tibble: 336,776 x 16
  dep_time sched_dep_time dep_delay arr_time sched_arr_time arr_delay carrier
             <int> <dbl> <int> <int> <dbl> <chr>
                 515 2 830
529 4 850
                                                      11 UA
     533
                                              830
                                                       20 UA
                 540
3
     542
                           2
                                  923
                                              850
                                                       33 AA
                           -1 1004
                                             1022
     544
                 545
                                                       -18 B6
4
                 600
5
      554
                           -6 812
                                             837
                                                       -25 DL
                 558
                                  740
                                                       12 UA
6
      554
                            -4
                                               728
                  600
                            -5
                                  913
                                               854
                                                        19 B6
      557
                  600
                           -3
                               838
                                  709
                                               723
                                                       -14 EV
                                              846
      557
                  600
                           -3
                                                        -8 B6
                                  753
     558
                           -2
                                               745
                                                        8 AA
10
                  600
# ... with 336,766 more rows, and 9 more variables: flight <int>,
# tailnum <chr>, origin <chr>, dest <chr>, air time <dbl>, distance <dbl>,
# hour <dbl>, minute <dbl>, time_hour <dttm>
```

- [참고 1]
- statr_with : 인자로 시작하는 변수 포함
 ends_with : 인자로 끝나는 변수 포함

```
select(flights, starts_with("arr"))
```

```
# A tibble: 336,776 x 2
 arr_time arr_delay
   <int> <dbl>
            11
     830
1
     850
     923
    1004
4
              -18
              -25
     812
     740
              12
              19
7
     913
     709
9
     838
     753
              8
# ... with 336,766 more rows
```

```
select(flights, ends with("time"))
```

```
# A tibble: 336,776 x 5
 dep_time sched_dep_time arr_time sched_arr_time air_time
            <int> <int>
                              <int> <dbl>
    517
               515 830
                                 819
                      850
     533
                529
                                 830
                                         227
     542
                540
                                        160
                       923
                                  850
3
                545 1004
                                         183
4
     544
                                 1022
                                 837
     554
                600
                       812
                                         116
6
     554
                558
                       740
                                   728
7
     555
                600
                       913
                                  854
                                         158
8
     557
                600
                       709
                                  723
                                          53
                600
                                 846
                                        140
                       838
     557
          600
                                  745
                       753
1.0
    558
                                         138
# ... with 336,766 more rows
```

```
select(flights, contains("dep"))
```

```
# A tibble: 336,776 x 3
 dep_time sched_dep_time dep_delay
   <int> <int> <dbl>
                515
1
     517
     533
                529
     542
     544
                545
5
     554
                600
                         -6
     554
6
                558
                         -4
                600
7
     555
                          -5
                600
     557
                          -3
8
9
     557
                 600
                          -3
10
# ... with 336,766 more rows
```

- [참고 2]
- 1. all of: 다 보여주지만 원소 중에 해당되지 않은 변수가 있으면 출력을 아무것도 안해준다. NA가 있으면 출력을 안해준다.
- 2. any_of: 해당하는 원소가 데이터에 없다하더라도 출력해준다. NA가 있어도 출력을 해준다.

[Your turn 03]

1. Brainstorm as many ways as possible to select dep_time, dep_delay, arr_time, and arr_delay from flights.

```
select(flights,starts_with('dep'),starts_with('arr'))
```

```
# A tibble: 336,776 x 4
  dep time dep delay arr time arr delay
    <int> <dbl> <int> <dbl>
             2 830
     517
                              11
1
                     850
     533
               4
                               20
                     923
3
     542
               2
                               33
     544
554
              -1 1004
5
              -6 812
                               -25
6
     554
              -4
                     740
                               12
      555
               -5
                               19
7
                      913
                      709
      557
               -3
                               -14
8
9

      557
      -3
      838

      558
      -2
      753

                      838
                               -8
10
                                8
# ... with 336,766 more rows
```

2. What happens if you include the name of a variable multiple times in a select() call?

```
select(flights,dep_time,dep_time)
# A tibble: 336,776 x 1
  dep_time
    <int>
      517
      533
3
      542
4
      544
5
       554
6
       554
8
       557
9
       557
10
      558
```

그냥 하나만 출력한다.

... with 336,766 more rows

3. What does the one_of() function do? Why might it be helpful in conjunction with this vector?

```
vars <- c("year", "month", "day", "dep_delay", "arr_delay")
select(flights,one_of(vars))</pre>
```

```
# A tibble: 336,776 x 5
 year month day dep_delay arr_delay
 <int> <int> <int> <dbl> <dbl>
1 2013 1 1 2
                        11
      1
           1
1
1
1
                         20
                   4
2 2013
       1
3 2013
                   2
               -6
-4
-5
  2013
        1
                         -18
      1
  2013
                         -25
          1
6 2013 1
                         12
       1 1
7 2013
                         19
       1
            1
8 2013
                  -3
                         -14
9 2013 1
            1
                  -3
                          -8
10 2013
        1
            1
                          8
# ... with 336,766 more rows
```

vars안에 있는 것들을 보여준다. vars에 해당하는 어느 하나라도 출력한다.

4. Does the result of running the following code surprise you? How do the select helpers deal with case by default? How can you change that default?

```
select(flights, contains("TIME"))
```

```
# A tibble: 336,776 x 6
  dep time sched dep time arr time sched arr time air time time hour
            <int> <int> <int> <dbl> <dttm>
                                       819 227 2013-01-01 05:00:00
830 227 2013-01-01 05:00:00
                   515
                  515 830
529 850
     517
1
     533
2
                           923
                                       850
                                                160 2013-01-01 05:00:00
3
     542
                   540
                                     1022
4
     544
                  545 1004
                                                183 2013-01-01 05:00:00
5
     554
                  600
                          812
                                       837
                                                116 2013-01-01 06:00:00
6
     554
                  558
                           740
                                        728
                                                150 2013-01-01 05:00:00
7
     555
                  600
                           913
                                       854
                                                158 2013-01-01 06:00:00
                                      723 53 2013-01-01 06:00:00
846 140 2013-01-01 06:00:00
745 138 2013-01-01 06:00:00
                  600
                           709
8
      557
9
      557
                   600
                           838
10
      558
                   600
                           753
# ... with 336,766 more rows
```

contains라는 함수는 default가 ignore.case=T라서 대문자이냐 소문자이냐에 영향을 받지 않는다. 영향을 받게 하려면 F로 바꾸면 된다.

4. mutate function

[example]

```
# A tibble: 336,776 x 7
    year month    day dep_delay arr_delay distance air_time
    <int> <int> <int> <int> <int> <dbl>    <d
```

^{• [}참고] If you only want to keep the new variables, use transmute()

1. Currently dep_time and sched_dep_time are convenient to look at, but hard to compute with because they're not really continuous numbers. Convert them to a more convenient representation of number of minutes since midnight.

```
# A tibble: 336,776 x 4
 dep_time new_dep_time sched_dep_time new_sched_dep_time
  0
                      2359
   2400
1
                                    1439
    2400
              0
0
0
                      2359
2359
2359
2
                                    1439
    2400
                                    1439
   2400
                                    1439
4
              0
                      2250
   2400
                                   1370
5
              0
                      2359
   2400
                                   1439
              0
7
   2400
                      2359
                                   1439
              0
   2400
                      1700
                                   1020
   2400
                      2359
                                   1439
              0
   2400
                      2359
                                   1439
# ... with 336,766 more rows
```

새로운 시간을 만들어 주기 위해 chan_time 함수를 만들었다. 결과는 위와 같다.

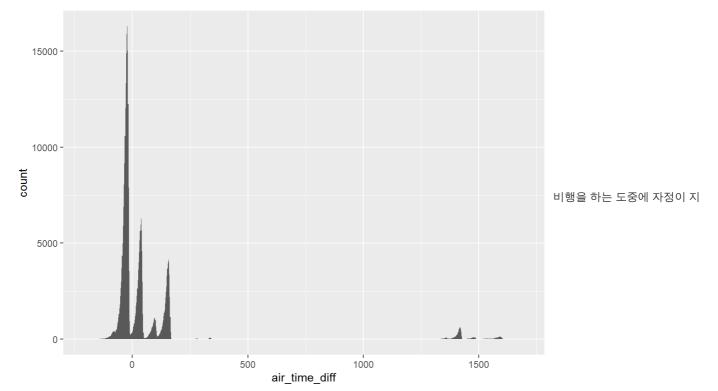
• [다른 방법] : 나머지와 몫을 이용해 시간과 분을 구하고 2400를 변환한 1440의 값은 나눈 나머지 값을 이용해 다시 표현하는 방법.

```
# A tibble: 336,776 x 2
  dep_time dep_time_mins
    <int> <dbl>
     517
                 317
     533
                 333
     542
                 342
4
     544
                 344
                 354
5
     554
                 354
6
      554
                 355
7
      555
8
      557
                  357
                 357
9
      557
10
      558
                  358
# ... with 336,766 more rows
```

2. Compare air_time with arr_time - dep_time. What do you expect to see? What do you see? What do you need to do to fix it?

```
[1] 327150
```

air_time_diff와 air_time의 값이 같아야 하는 다른 게 327150개나 있다.



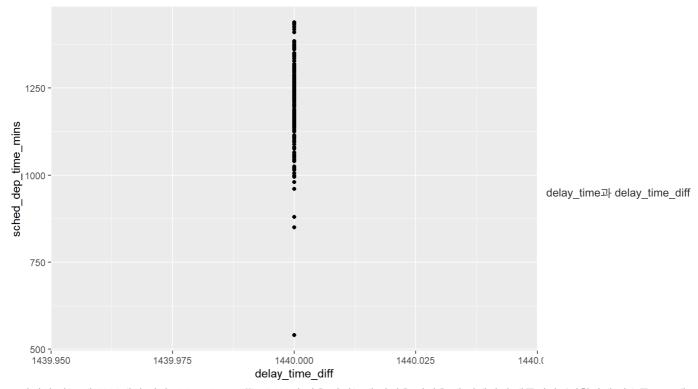
나게 되면 시간의 차이가 발생한다. (정확하게 이유를 모르겠다.)

3. Compare dep_time, sched_dep_time, and dep_delay. How would you expect those three numbers to be related?

```
flights_times %>% mutate(
  dep_time_mins = chan_time(dep_time),
  sched_dep_time_mins = chan_time(sched_dep_time),
  delay_time_diff = dep_delay - (dep_time_mins - sched_dep_time_mins)) %>%
  filter(delay_time_diff != 0) %>% nrow()
```

```
[1] 1236
```

```
flights_times %>% mutate(
  dep_time_mins = chan_time(dep_time),
  sched_dep_time_mins = chan_time(sched_dep_time),
  delay_time_diff = dep_delay - (dep_time_mins - sched_dep_time_mins)) %>%
  filter(delay_time_diff != 0 & !is.na(delay_time_diff)) %>%
  ggplot(aes(x=delay_time_diff,y = sched_dep_time_mins))+
  geom_point()
```



도 차이가 나는 게 1236개가 있다. $delay_time_diff$ 는 1440의 값을 가지는데 자정을 지났을 때 발생하기 때문이다. (정확하게 이유를 모르겠다.)

5. summaries function

[exmple]

• dep_delay의 평균값

```
summarise(flights, delay = mean(dep_delay, na.rm = TRUE))

# A tibble: 1 x 1
  delay
  <dbl>
1 12.6
```

• 365일 즉 day에 대한 평균 delay

```
by_day <- group_by(flights, year, month, day)
summarise(by_day, delay = mean(dep_delay, na.rm = TRUE))</pre>
```

```
# A tibble: 365 x 4
# Groups: year, month [12]
  year month day delay
  <int> <int> <int> <dbl>
1 2013
            1 11.5
       1
2 2013
         1
              2 13.9
3 2013 1 3 11.0
4 2013 1 4 8.95
5 2013 1 5 5.73
6 2013 1 6 7.15
7 2013 1
              7 5.42
             8 2.55
8 2013 1
9 2013 1 9 2.28
10 2013 1 10 2.84
              9 2.28
# ... with 355 more rows
```

by_day

```
# A tibble: 336,776 x 19
# Groups: year, month, day [365]
    year month day dep_time sched_dep_time dep_delay arr_time sched_arr_time
                                                   <int> <dbl> <int>
    <int> <int> <int> <int>

    <int>
    <dbl>

    515
    2
    830

    529
    4
    850

    540
    2
    923

    545
    -1
    1004

    600
    -6
    812

    558
    -4
    740

    600
    -5
    913

    600
    -3
    709

    600
    -3
    838

    600
    -2
    753

               1 1
1 1
                                    517
533
 1 2013

    2
    2013
    1
    1
    533

    3
    2013
    1
    1
    542

    4
    2013
    1
    1
    544

    5
    2013
    1
    1
    554

    6
    2013
    1
    1
    554

    7
    2013
    1
    1
    555

 2 2013
                                                                                                                          830
                                                                                                                      1022
                                                                                                                        837
                                                                                                                         728
 8 2013 1 1 557
                                                                                                                         723
 9 2013 1 1
                                      557
                                                                                                                         846
                                                                600
10 2013
                   1
                            1
                                       558
                                                                                   -2
                                                                                                753
                                                                                                                           745
\# ... with 336,766 more rows, and 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>
```

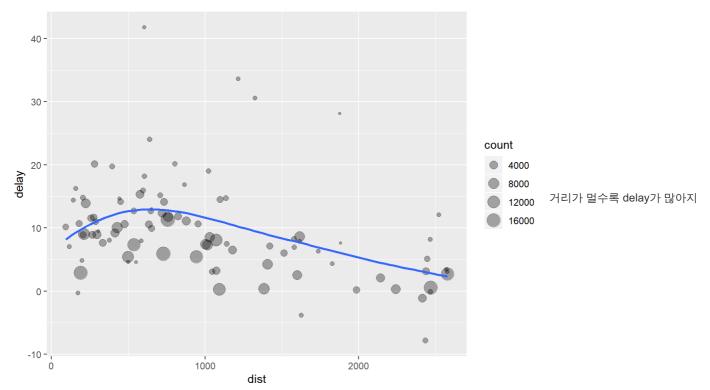
• dest를 그룹화한 정보

```
# A tibble: 105 x 4
  dest count dist delay
  <chr> <int> <dbl> <dbl>
         254 1826
                   4.38
1 ABQ
         265 199 4.85
2 ACK
         439 143 14.4
3 ALB
          8 3370 -2.5
4 ANC
5 ATL
       17215 757. 11.3
6 AUS
        2439 1514. 6.02
         275 584. 8.00
7 AVL
         443 116 7.05
8 BDL
         375 378
                   8.03
9 BGR
10 BHM
          297 866. 16.9
# ... with 95 more rows
```

dest에 따라 비행기의 수, 거리의 평균, arr_delay의 평균을 보여준다. NA값이 있을 수도 있으니 항상 'na.rm=TRUE'를 해줘야 한다. NA를 포함하게 되면 오류를 출력하는 경우가 많다.

• 멀리 날아가면 비행기도 딜레이가 심한가 알아보기 위한 그림

```
flights %>%
  group_by(dest) %>%
  summarise(
    count = n(),
    dist = mean(distance, na.rm = TRUE),
    delay = mean(arr_delay, na.rm = TRUE)
) %>%
  filter(count > 20, dest != "HNL") %>%
  ggplot(mapping = aes(x = dist, y = delay)) +
  geom_point(aes(size = count), alpha = 1/3) + #size는 count에 따라 주겠다.
  geom_smooth(se = FALSE)
```



는 가를 보았는데 딱히 그런 것은 아니다. 오히려 감소하는 추세이다.

[Your turn 05]

1. Come up with another approach that will give you the same output as not_cancelled %>% count(dest) and not_cancelled %>% count(tailnum, wt = distance) (without using count()).

dep_delay와 arr_delay가 NA값이 아닌 정보. 즉, 취소되지 않은 항공을 의미한다.

```
not_cancelled <- flights %>%
  filter(!is.na(dep_delay), !is.na(arr_delay))
not_cancelled %>% count(dest)
```

```
# A tibble: 104 x 2
  <chr> <int>
1 ABQ 254
         264
2 ACK
        418
3 ALB
4 ANC
5 ATL
6 AUS
        2411
7 AVL
        261
        412
8 BDT.
9 BGR
        358
10 BHM
        269
# ... with 94 more rows
```

```
not_cancelled %>% group_by(dest)%>% summarise(n = n())
```

```
# A tibble: 104 x 2
  dest.
  <chr> <int>
1 ABQ
2 ACK
3 ALB 418
4 ANC
         8
5 ATL 16837
6 AUS 2411
7 AVL
         261
8 BDL
         412
         358
10 BHM
         269
# ... with 94 more rows
```

```
not_cancelled %>% count(tailnum, wt = distance) \#wt: \overline{PSI}
```

```
not_cancelled %>% group_by(tailnum) %>%
summarise(n = sum(distance))
```

wt는 해당 변수에 대한 가중치를 준다. count를 사용하지 않을 때는 sum()을 이용하면 같은 결과가 나온다.

2. Look at the number of canceled flights per day. Is there a pattern? Is the proportion of canceled flights related to the average delay?

```
# A tibble: 365 x 8
# Groups: year, month [12]
  year month day num_flights canceled_flights avg_dep_delay avg_arr_delay
  <int> <int> <int>
                  <int>
                        <int> <dbl>
                                                    <db1>
1 2013
           1
                                842
                 1533700
                                         11.5
                                                   12 7
       1
2 2013
            2 1808422
                                943
                                         13.9
                                                   12.7
        1
3 2013 1 3
                 1748643
                                914
                                         11.0
                                                   5.73
4 2013 1 4 1766085
                                         8.95
                                915
5 2013 1 5 1252814
                                720
                                          5.73
                                                   -1.53
6 2013 1 6 1583123
                                832
                                          7.15
                                                   4.24
            7
7 2013 1
                1859993
                                933
                                         5.42
                                                   -4.95
                                         2.55
                                899
8 2013 1
            8 1805441
                                                   -3.23
               1819691
                                902
                                      2.28
2.84
9 2013 1 9
10 2013 1 10
                                                   -0.264
                 1863369
                                 932
                                                   -5.90
# ... with 355 more rows, and 1 more variable: prop canceled <dbl>
```

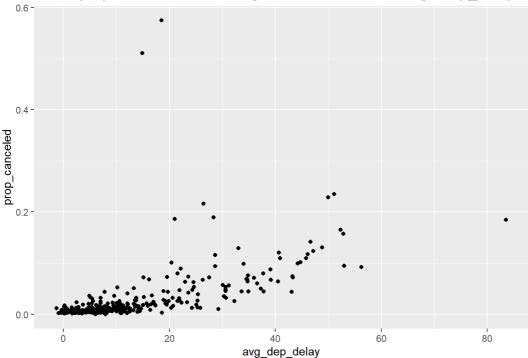
day에 따라 취소한 항공의 개수는 위와 같다. 지연된 시간(dep and arr)의 평균값이 취소된 항공의 비율과 관련을 알아보기 위해 아래의 그림을 그렸다.

```
#avg_dep_delay vs prop_canceled & avg_arr_delay vs prop_canceled
new_flights %>% ggplot(aes(x=avg_dep_delay, y = prop_canceled)) +
geom_point()+
ggtitle("The proportion of canceled flights related to the average dep_delay")+
theme(plot.title = element_text(size=15,hjust = 0.5)) -> p1

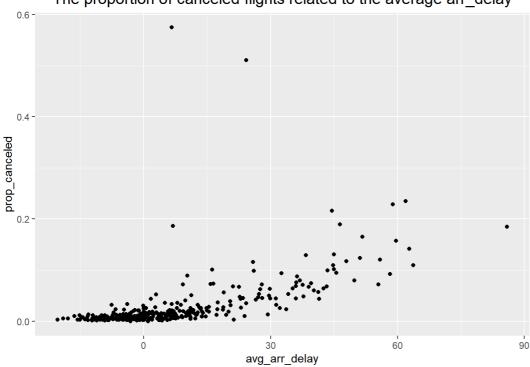
new_flights %>% ggplot(aes(x=avg_arr_delay, y = prop_canceled)) +
geom_point()+
ggtitle("The proportion of canceled flights related to the average arr_delay")+
theme(plot.title = element_text(size=15,hjust = 0.5)) -> p2

#library("gridExtra")
#grid.arrange(p1, p2, ncol = 1, nrow = 2)
p1;p2
```





The proportion of canceled flights related to the average arr_delay



지연된 시간의 평균값이 클수록 취소될 확률이 높아지는 것을 보여준다. 특히 지연 시간이 길수록 취소될 확률은 더욱 높아진다.

3. Which carrier has the worst delays? Challenge: can you disentangle the effects of bad airports vs. bad carriers? Why/why not?

```
#carrier
flights %>% group_by(carrier) %>%
  summarise(num_flights = n(),arr_delay_mean = mean(arr_delay,na.rm = TRUE),dep_delay_mean = mean(dep_delay,
na.rm = TRUE)) %>%
  arrange(desc(arr_delay_mean,dep_delay_mean))
```

```
# A tibble: 16 x 4
  carrier num flights arr delay mean dep delay mean
        20.2
1 F9
2 FL
            3260
                     20.1
                                 18.7
                     15.8
                                 20.0
3 EV
           54173
           601
4 YV
                     15.6
5 00
             32
                     11.9
          26397
12275
6 MQ
                     10.8
                                 10.6
7 WN
                      9.65
                                 17.7
           54635
                      9.46
                                 13.0
8 B6
           18460
                      7.38
9 9E
                                  16.7
           58665
                      3.56
10 UA
                                 12.1
           20536
11 US
                       2.13
                                  3.78
                                 12.9
12 VX
            5162
                       1.76
          48110
                      1.64
13 DL
                                  9.26
                      0.364
           32729
                                  8.59
14 AA
                                  4.90
15 HA
            342
                     -6.92
16 AS
             714
                     -9.93
                                  5.80
```

지연이 가장 심한 항공은 F9이다.

4. Counts the number of flights to a destination and sorts them from highest to lowest.

```
flights %>%
 count(dest, sort=TRUE)
\# A tibble: 105 x 2
  dest n
  <chr> <int>
1 ORD
       17283
2 ATL
       17215
       16174
3 LAX
       15508
4 BOS
      14082
5 MCO
6 CLT 14064
7 SFO 13331
8 FLL 12055
9 MIA 11728
10 DCA 9705
# ... with 95 more rows
flights %>% count(dest) %>% arrange(desc(n))
```

```
# A tibble: 105 x 2
  <chr> <int>
1 ORD 17283
2 ATL 17215
3 LAX 16174
4 BOS
       15508
5 MCO
       14082
6 CLT
       14064
       13331
7 SFO
      12055
8 FLL
9 MIA 11728
10 DCA 9705
# ... with 95 more rows
```