



# A study of flight delays from NY

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# The data

~ 330 000 flights  
leaving from 3 NY  
airports in 2013

Total flights by origin  
origin

|     |        |
|-----|--------|
| EWR | 145179 |
| LGA | 100663 |
| JFK | 72154  |

together with hourly  
weather data for the  
3 airports



# The problems with the data

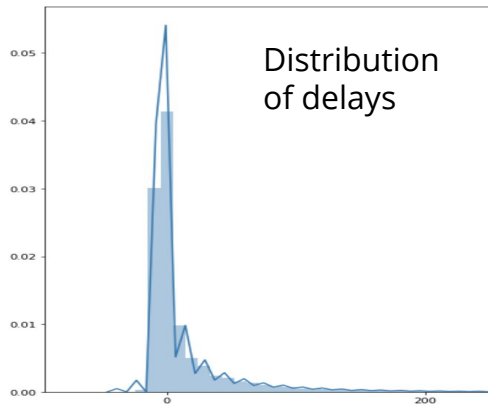
Weird outliers in the data:

|       | departure | scheduled_departure | flight_id | departure_delay |
|-------|-----------|---------------------|-----------|-----------------|
| 151   | 848       | 1835                | 3944      | -587            |
| 7029  | 641       | 900                 | 51        | -139            |
| 8190  | 1121      | 1635                | 3695      | -314            |
| 56746 | 603       | 1645                | 2042      | -642            |

- Did Flight 3695 depart 5h early or 19h late?
- Are {'SJU', 'ERW', 'PSE', 'BQN', 'STT'} actually airports?
- The normal stuff: missing departure/arrival data, weather conditions data

# Questions

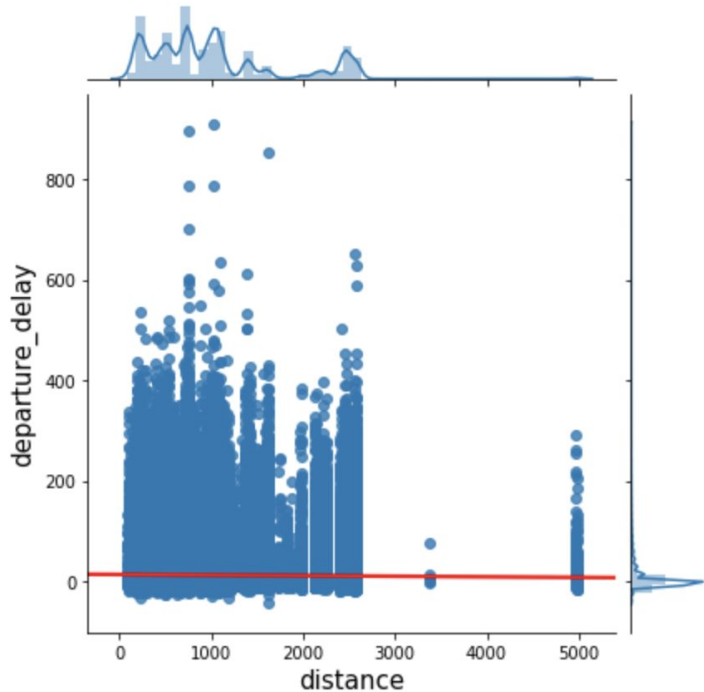
**Main Goal:** Figure out what influences flight delays and how



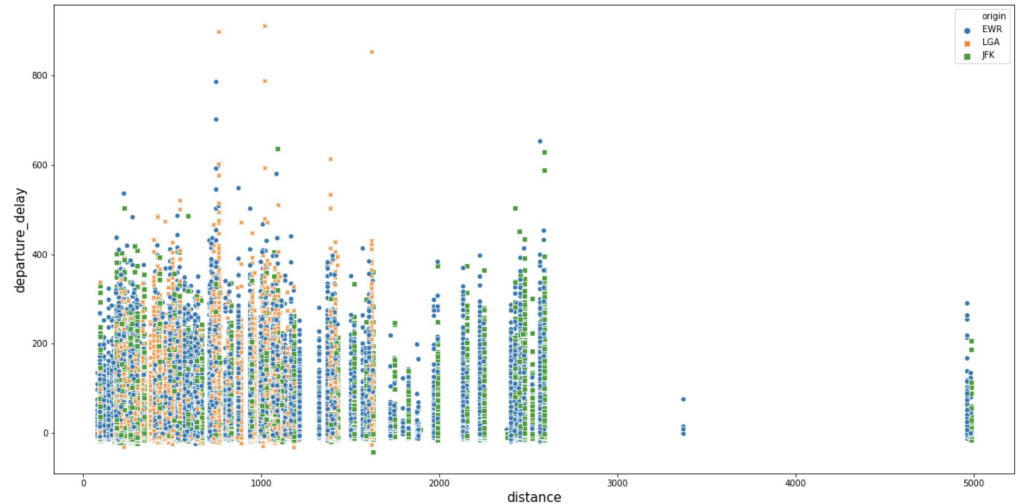
1. Do longer flights have longer delays than shorter flights?
2. Do evening flights have longer delays than morning flights?
3. Does big airport imply more crowding and hence longer delays?
4. Are some airlines more efficient than others in dealing with delays?
5. Is weather the main culprit for delays?
6. Any other questions/curiosities you have?

# Let the data speak

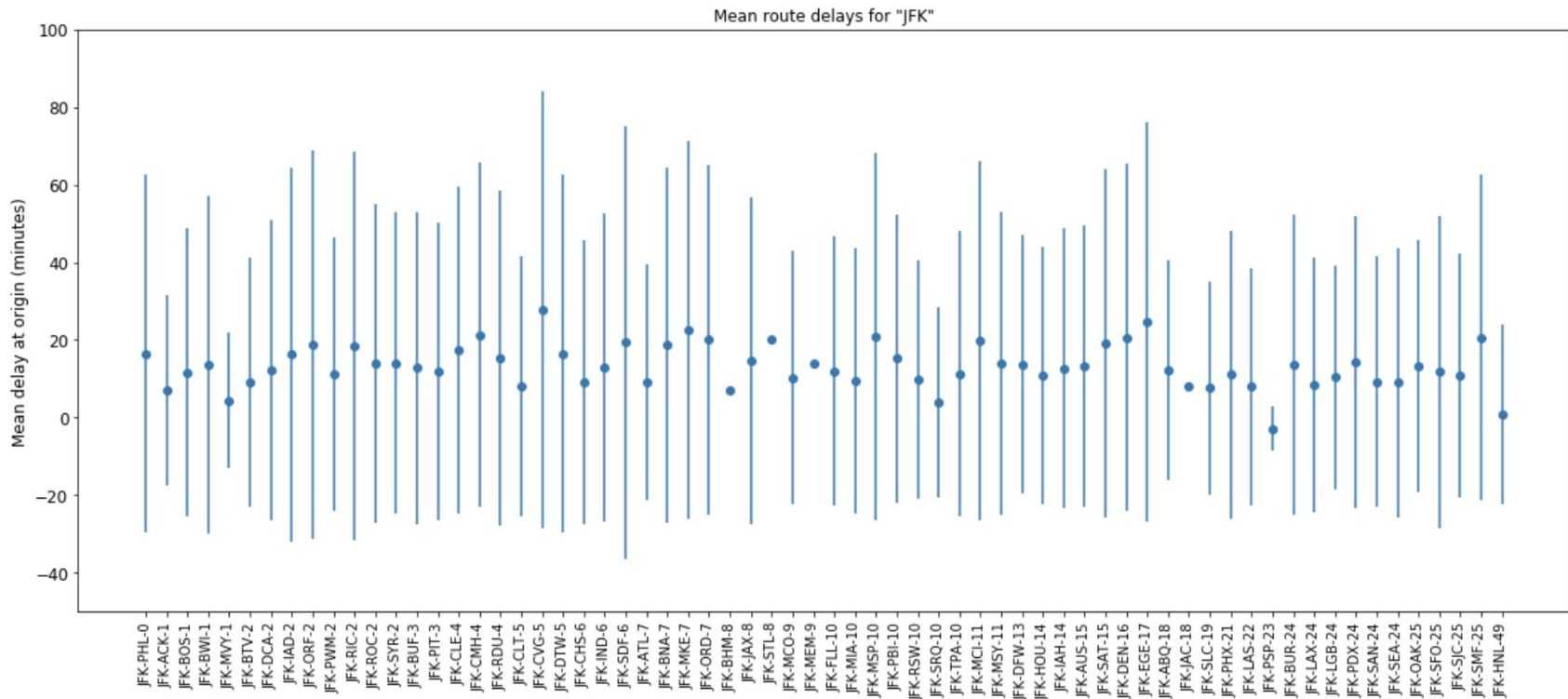
**Distance** of a flight does not have a significant impact on **delays**.



Percentages of delayed flights by origin  
origin  
EWR 0.434698  
JFK 0.381919  
LGA 0.331353  
dtype: float64

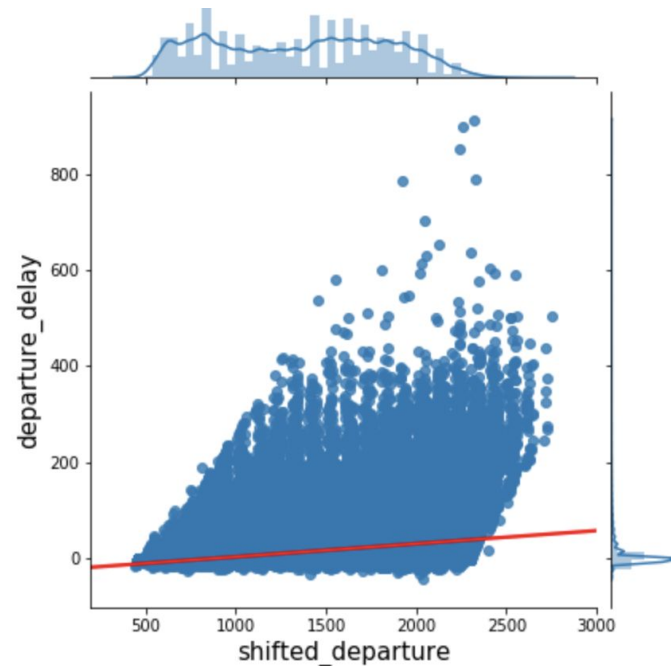
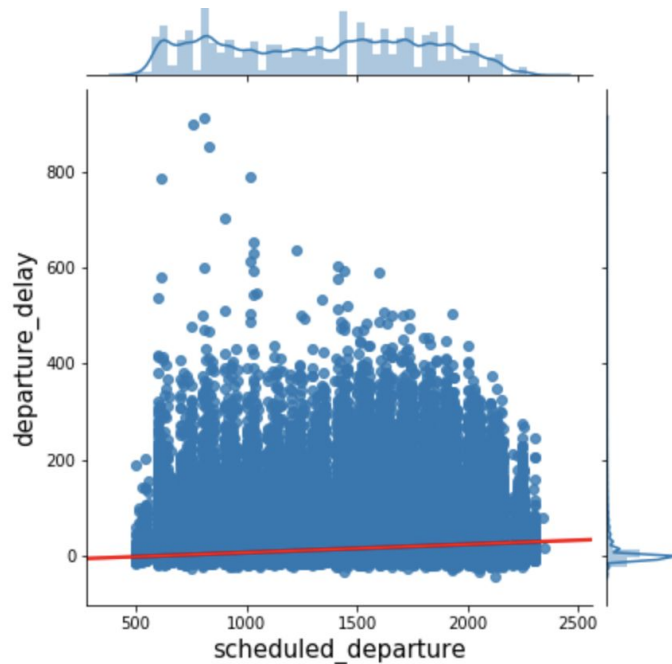


# Let the data speak



# Let the data speak

Generally, later **scheduled departure** times cause bigger **delays**.





# Let the data speak

**JFK is the best airport** in town in regards to delays.

Stats for departure delay by origin

|        | min | max   | count   | mean      | std       |
|--------|-----|-------|---------|-----------|-----------|
| origin |     |       |         |           |           |
| EWB    | 1.0 | 786.0 | 63109.0 | 38.683944 | 51.745666 |
| LGA    | 1.0 | 911.0 | 33355.0 | 41.413731 | 56.799874 |
| JFK    | 1.0 | 636.0 | 27557.0 | 38.121457 | 50.913966 |

Percentages of delayed flights by origin

|        |          |
|--------|----------|
| origin |          |
| EWB    | 0.434698 |
| JFK    | 0.381919 |
| LGA    | 0.331353 |

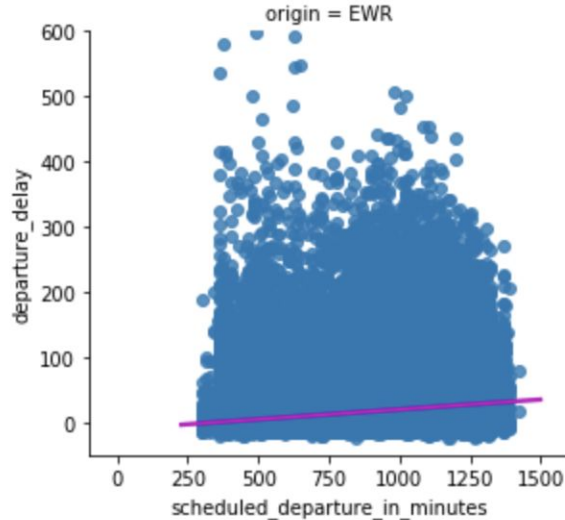
dtype: float64

Taking into account the mean delay time and the maximum delay time:

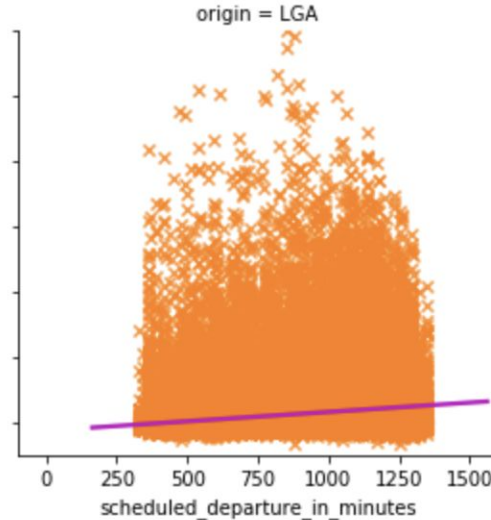
LGA is recommended for 38 destinations.  
JFK is recommended for 56 destinations.  
EWB is recommended for 6 destinations.

# Let the data speak

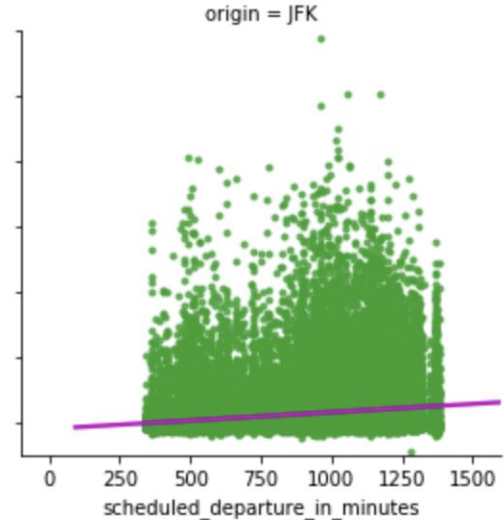
The bigger the **airport** the bigger the **delay** caused by **scheduled departure**.



Slope 0.30  
Total flights 145179



0.28  
100663



0.245  
72154

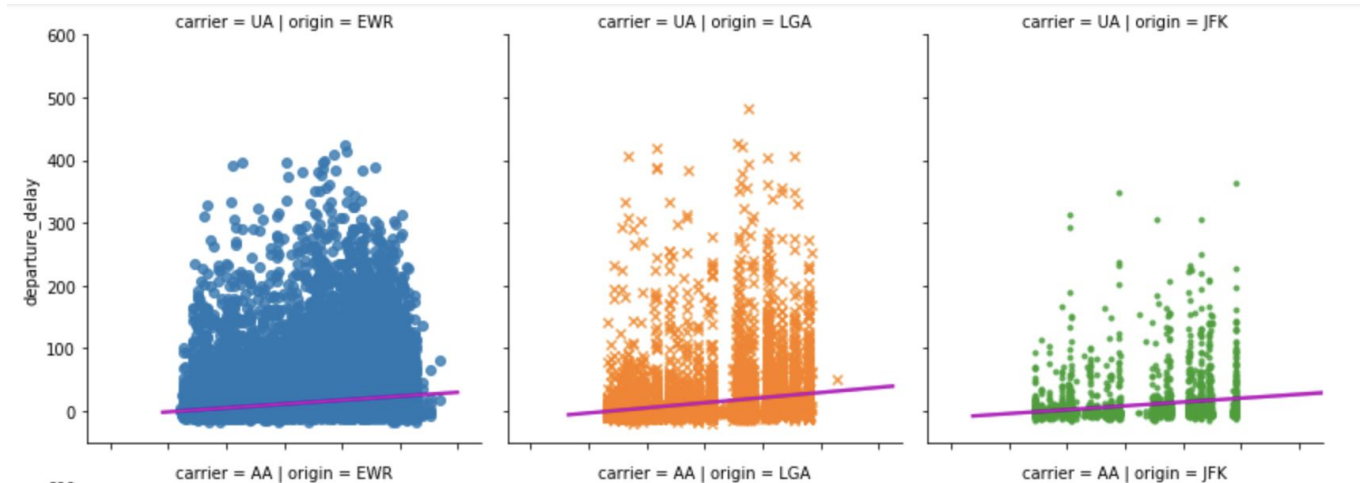
# Let the data speak

**Airline** influences **delay**, but the interplay with the **airport** is complicated.

Percentages of delayed flights by carrier  
carrier

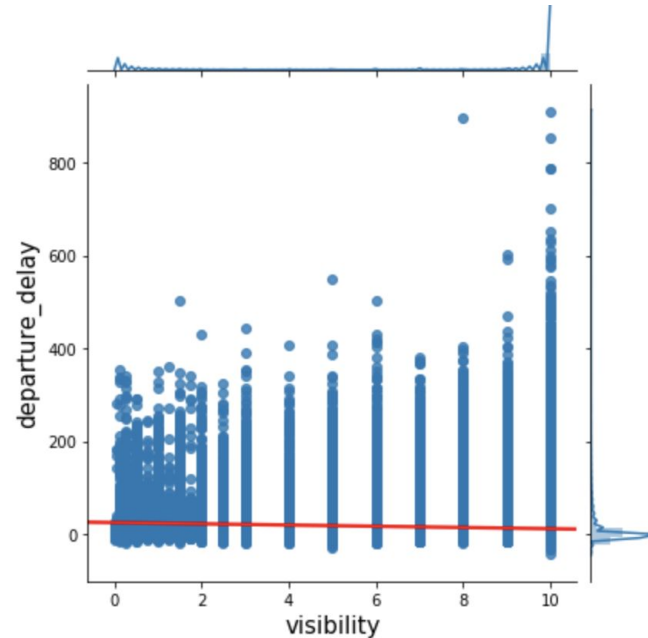
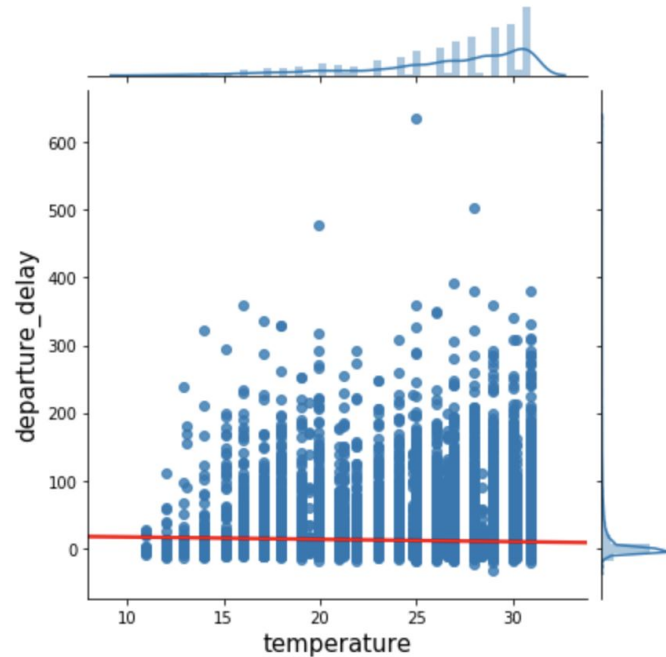
|    |          |
|----|----------|
| WN | 0.542602 |
| FL | 0.517591 |
| F9 | 0.500739 |
| UA | 0.467530 |
| EV | 0.449564 |
| VX | 0.432953 |
| YV | 0.430427 |
| 9E | 0.403788 |
| B6 | 0.393612 |
| DL | 0.319517 |
| MQ | 0.318253 |
| AS | 0.316312 |
| AA | 0.315821 |
| OO | 0.310345 |
| US | 0.240708 |
| HA | 0.195846 |

dtype: float64



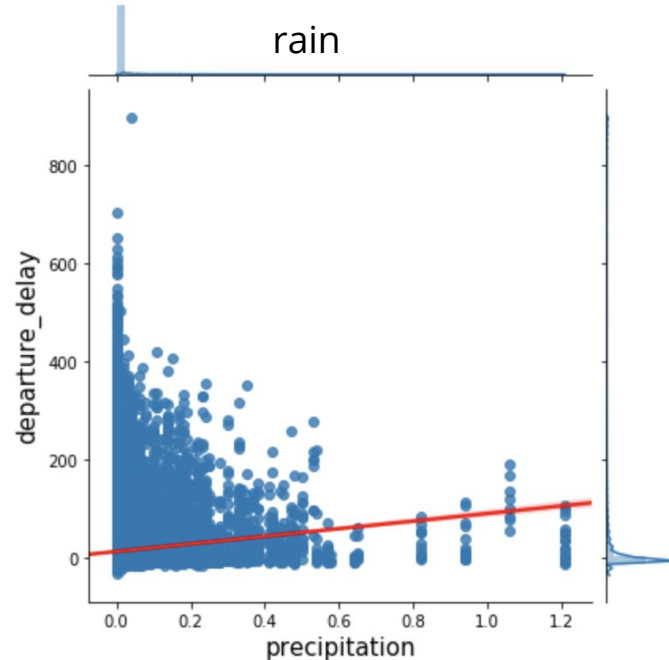
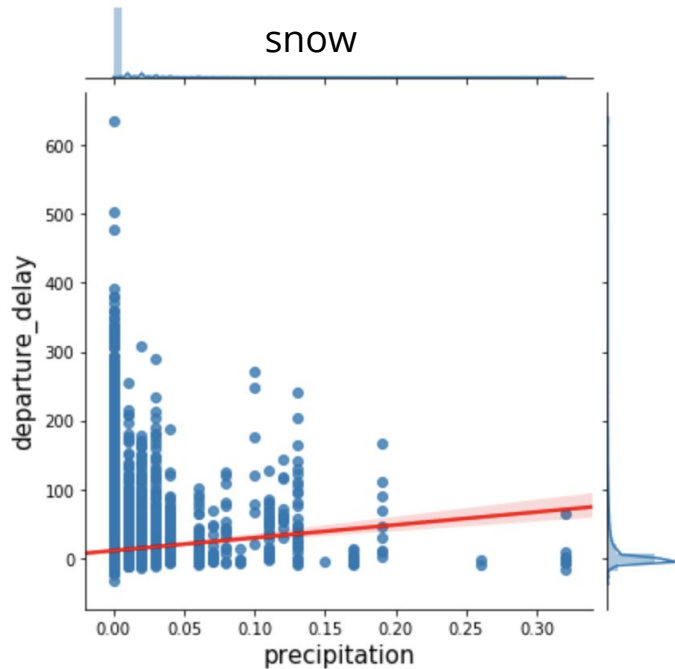
# Let the data speak

Cold **temperature** and **visibility** issues cause longer **delays** (but not by much).



# Let the data speak

As expected, the more **snow** the longer **delays** (the same for heavy **rain**).



# Conclusions

If you are flying from NY and don't want to experience the dreaded delays:

- **Wake up early and fly from JFK!**
- Don't wish for snow! Why would you want to leave NY if it's snowing anyways?
- Avoid Newark.
- Reconsider whether it is time to let go your favourite airline.
- The distance of a flights and the time of a year don't really matter!
- Consider for how long you need to be in the NY traffic to get to your favourite airport (personal experience, the traffic study is for another time).