



DELAYED



The Sharks: Julia Bernarde, Mary Callaghan, Jack Clodfelter, and Ricky Jiang



**RESEARCH QUESTION:
HOW DO DIFFERENT TYPES OF
FLIGHT DELAYS VARY IN THEIR
IMPACT ON THE AVERAGE
NUMBER OF DELAYED FLIGHTS
ACROSS U.S. REGIONS OVER
THE COURSE OF A YEAR (2003–
2016)?**

Air travel is a widely used yet unreliable transportation method in modern society. We wanted to understand what factors contribute to flight schedules and airports' lack of reliability.

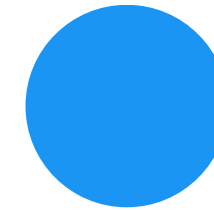




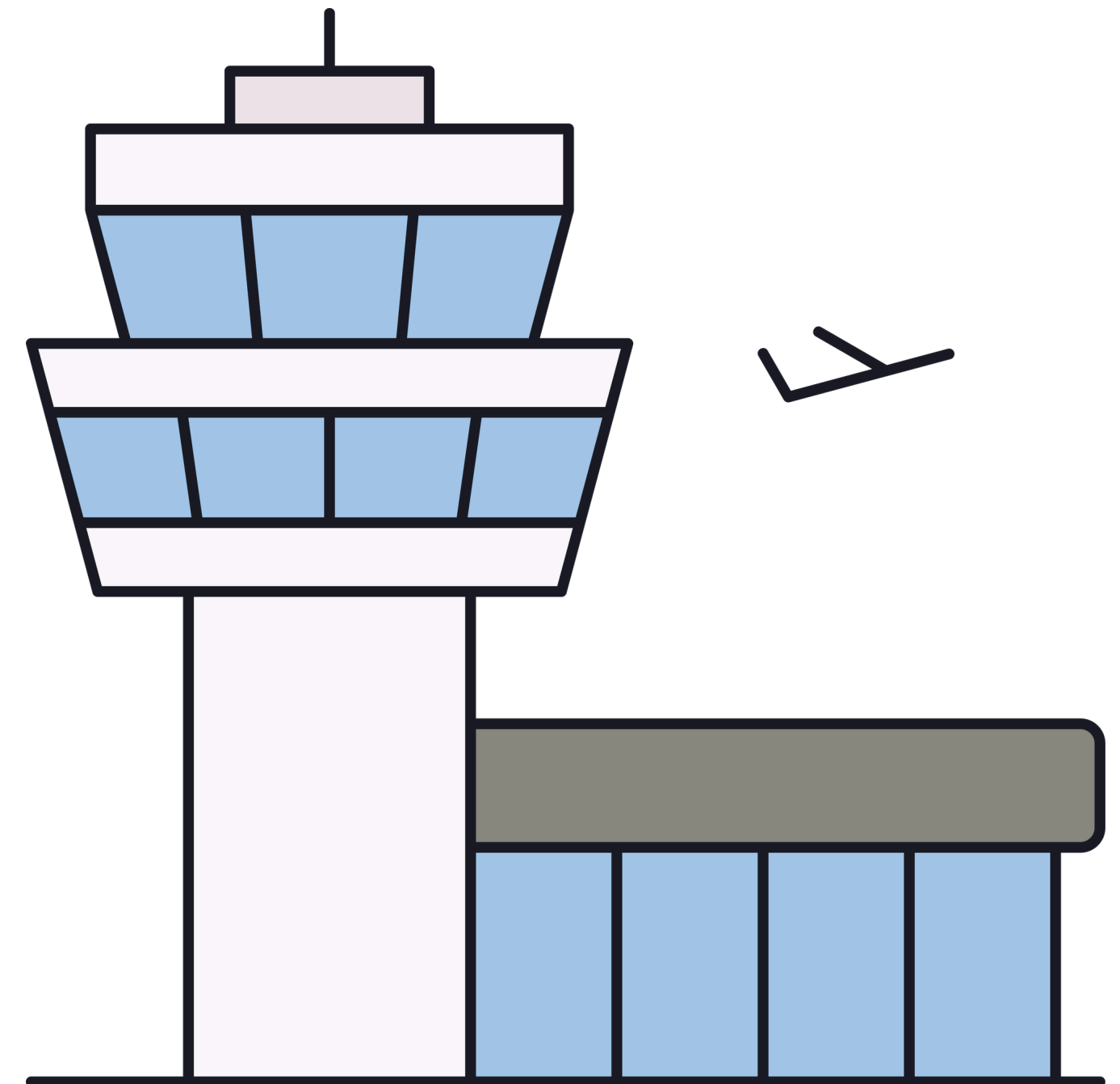
OUR DATA SET: AIRLINES

Understanding the Data

- Each row → data from a major U.S. airport
- Time frame → June 2003 to January 2016
- Data on # of occurrences recorded for different causes of delay:
 - **late aircraft:** caused by a previous flight with the same aircraft arriving late
 - **security:** caused by evacuation of a terminal, re-boarding because of security breach, inoperative screening and/or long line
 - **weather:** caused by significant meteorological conditions



→ Collected monthly by the Bureau of Transportation
→ Submitted by U.S. air carriers



DATA GLIMPSE

Rows: 4,408

Columns: 24

\$ Airport.Code

\$ Airport.Name

\$ Time.Label

\$ Time.Month

\$ `Time.Month Name`

\$ Time.Year

\$ `Statistics.# of Delays.Carrier`

\$ `Statistics.# of Delays.Late Aircraft`

\$ `Statistics.# of Delays.National Aviation System`

\$ `Statistics.# of Delays.Security`

\$ `Statistics.# of Delays.Weather`

\$ Statistics.Carriers.Names

\$ Statistics.Carriers.Total

\$ Statistics.Flights.Cancelled

\$ Statistics.Flights.Delayed

\$ Statistics.Flights.Diverted

\$ `Statistics.Flights.On Time`

\$ Statistics.Flights.Total

\$ `Statistics.Minutes Delayed.Carrier`

\$ `Statistics.Minutes Delayed.Late Aircraft`

\$ `Statistics.Minutes Delayed.National Aviation System`

\$ `Statistics.Minutes Delayed.Security`

\$ `Statistics.Minutes Delayed.Total`

\$ `Statistics.Minutes Delayed.Weather`

<chr> "ATL", "BOS", "BW...

<chr> "Atlanta, GA: Har...

<chr> "2003/06", "2003/...

<dbl> 6, 6, 6, 6, 6, 6,...

<chr> "June", "June", "...

<dbl> 2003, 2003, 2003,...

<dbl> 1009, 374, 296, 3...

<dbl> 1275, 495, 477, 4...

<dbl> 3217, 685, 389, 7...

<dbl> 17, 3, 8, 2, 4, 1...

<dbl> 328, 66, 78, 54, ...

<chr> "American Airline...

<dbl> 11, 14, 11, 11, 1...

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<dbl> 27, 3, 15, 14, 18...

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<dbl> 118831, 24400, 17...

<dbl> 518, 99, 278, 127...

<dbl> 268764, 77167, 64...

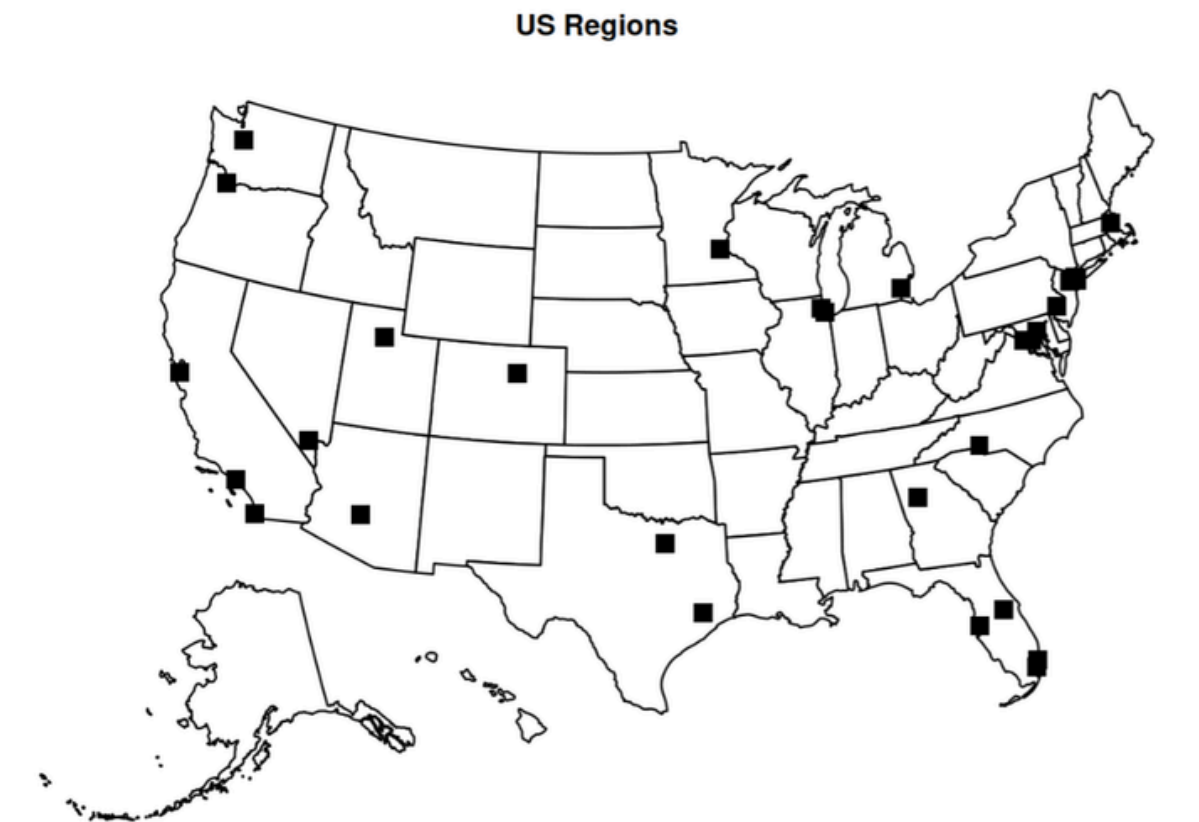
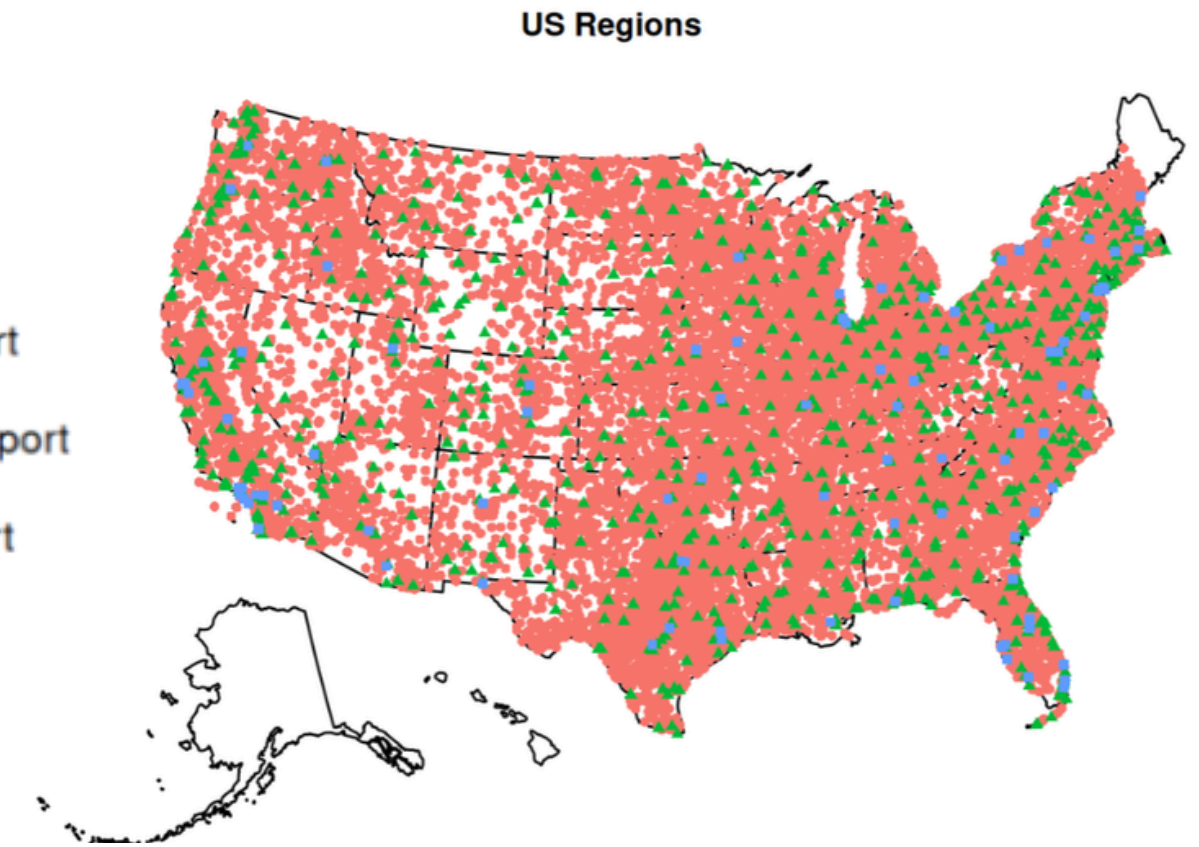
<dbl> 19474, 4160, 6201...

type

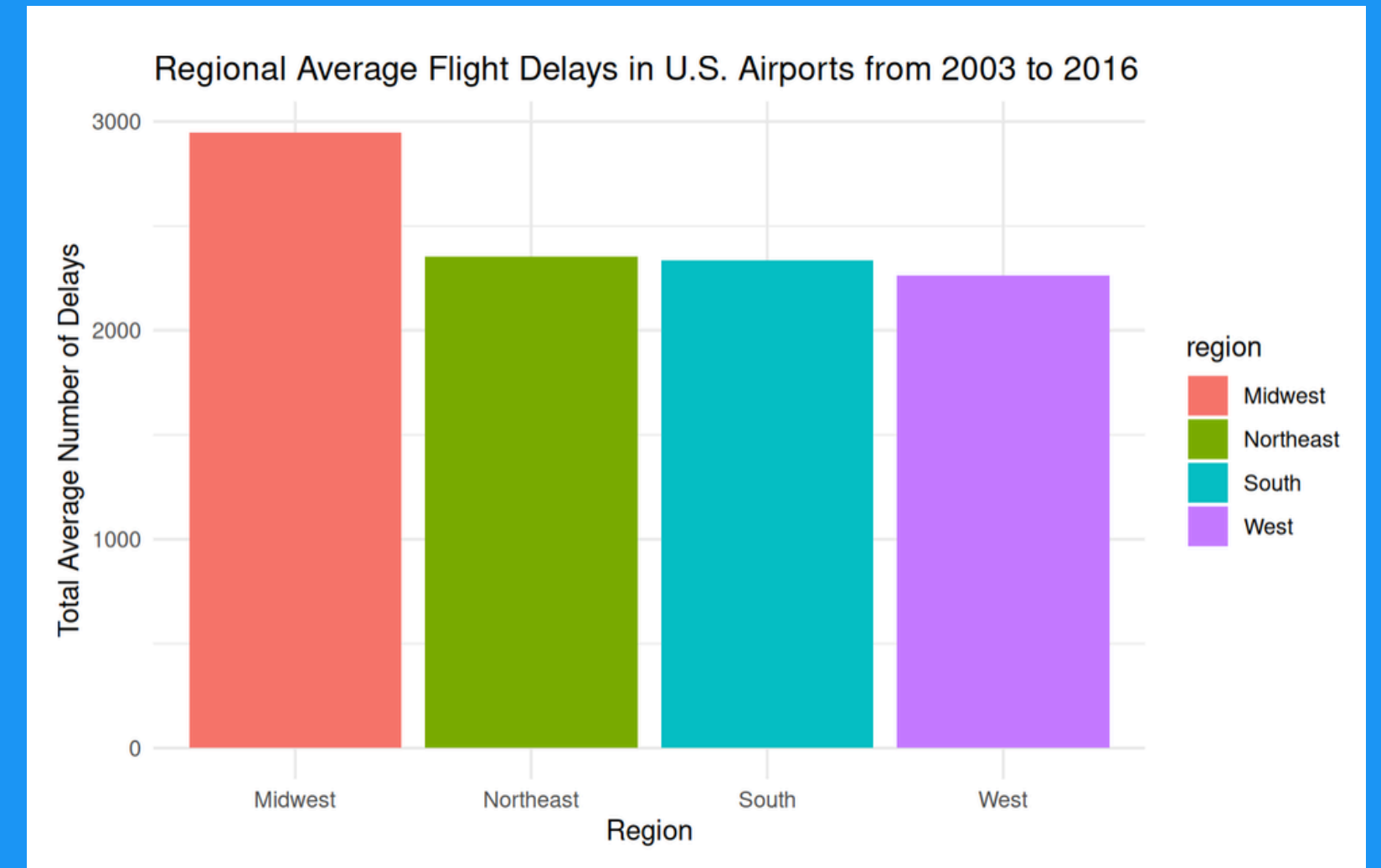
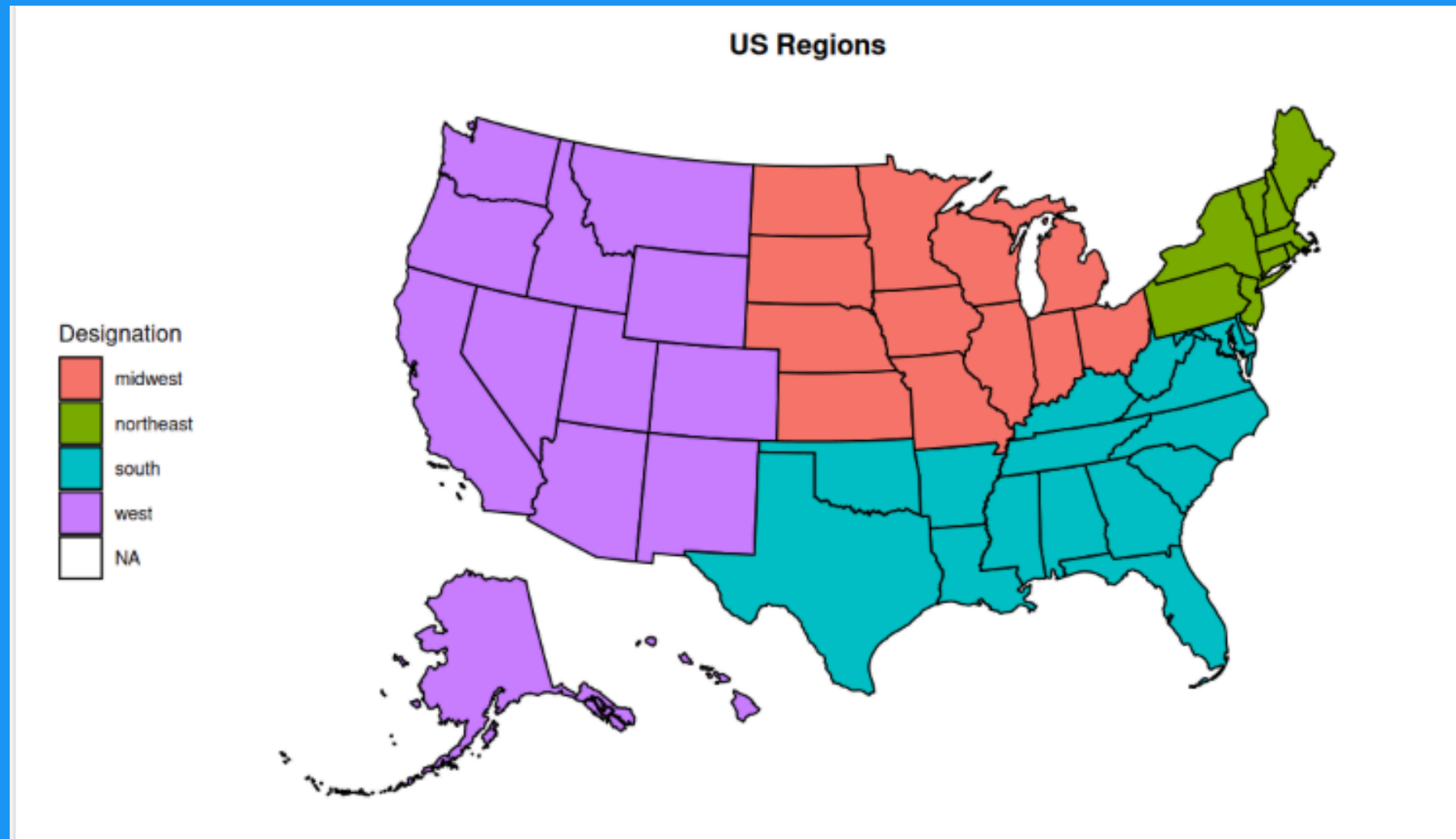
■ small_airport

▲ medium_airport

■ large_airport



Divided the data by Region, based on US Census Data

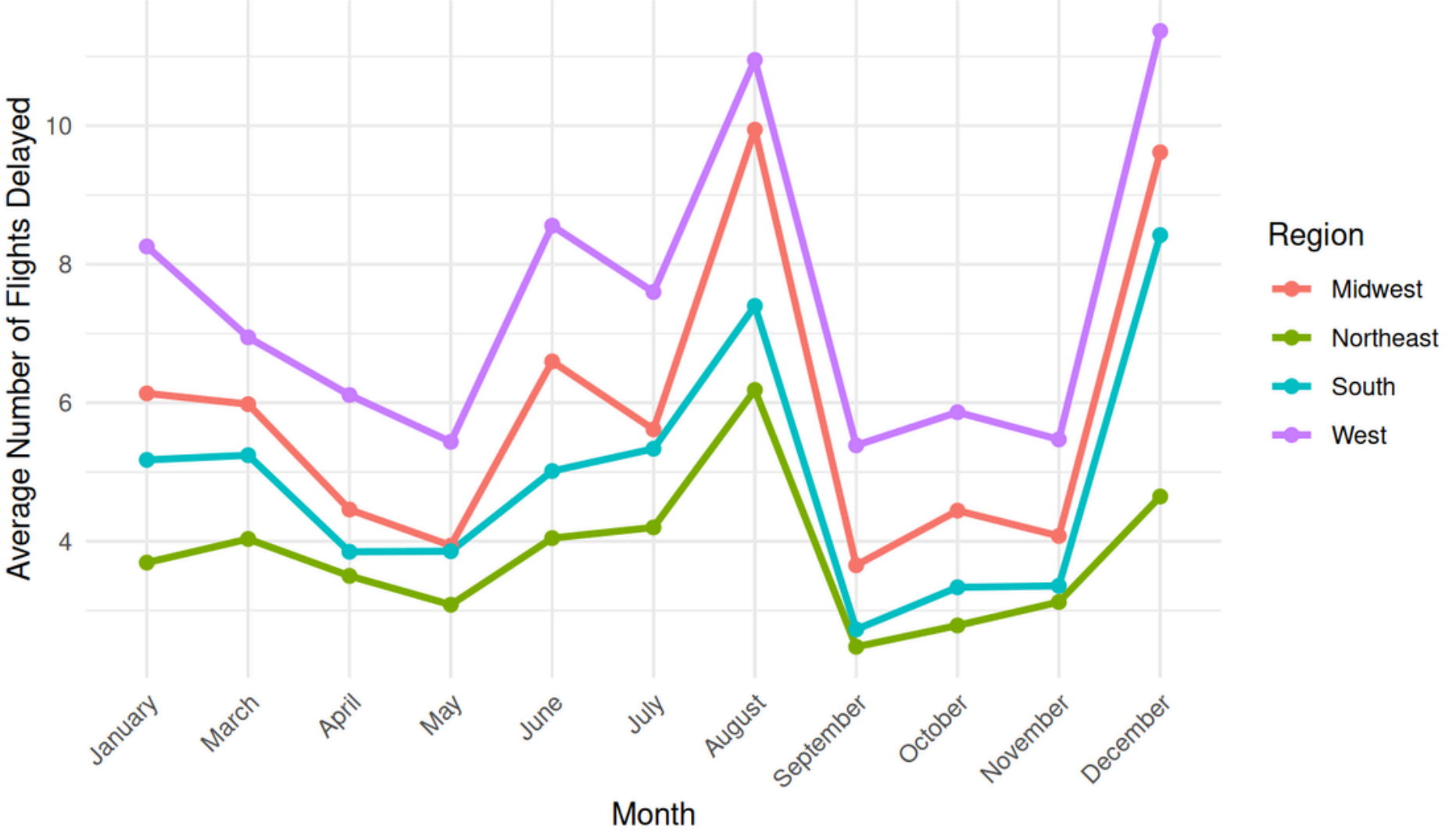


JANUARY – DECEMBER

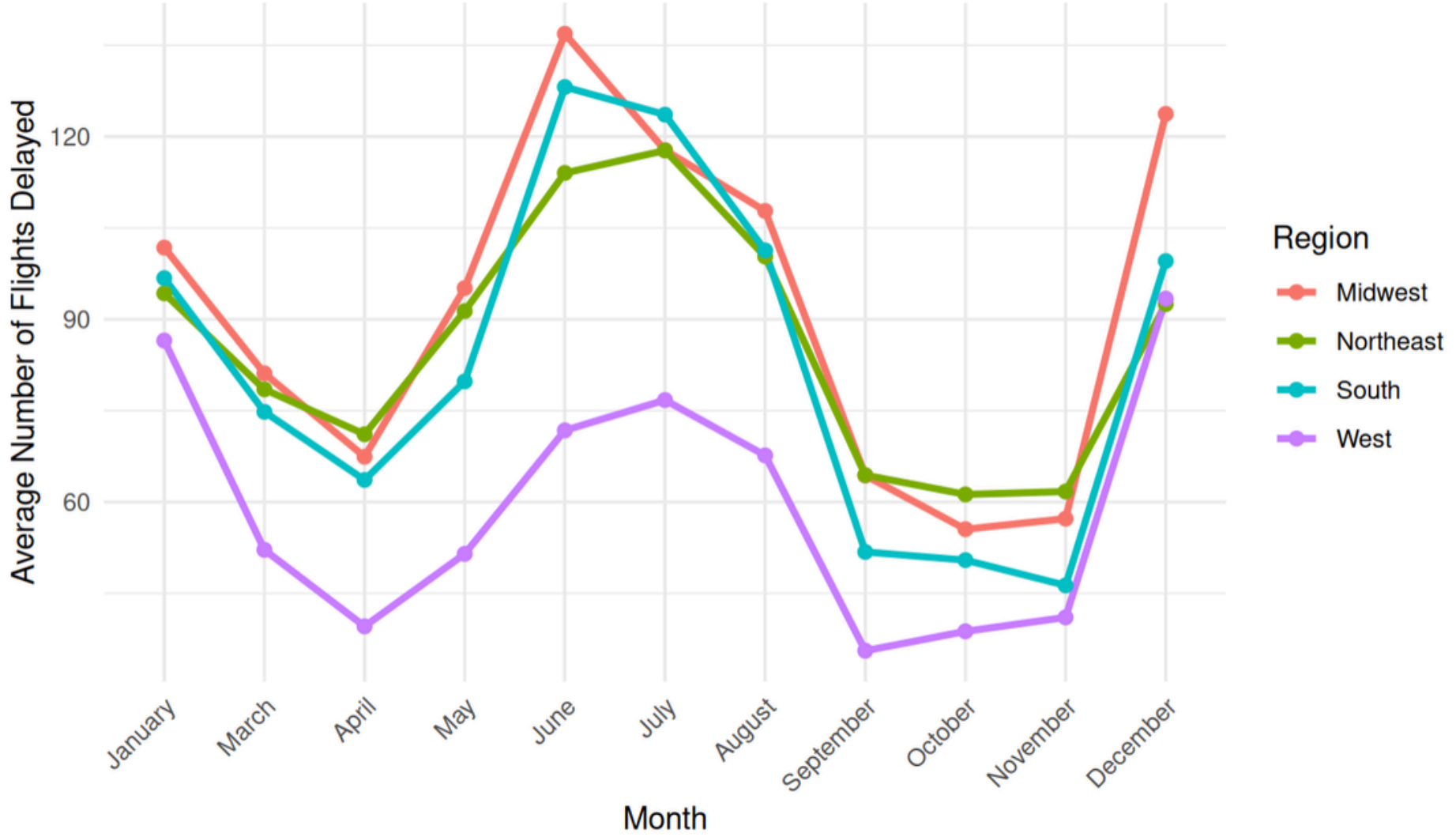
Security-Related

- Peak at the end of the summer & in December.
 - Correspond with summer/holiday travel, & back to school
 - Northeast has fewest security-related days (avg) → West has the most
- Delays ranged from an average of only 4-9 flights delayed monthly

Average Security-Related Flight Delays by Month & Region (2003–2016)



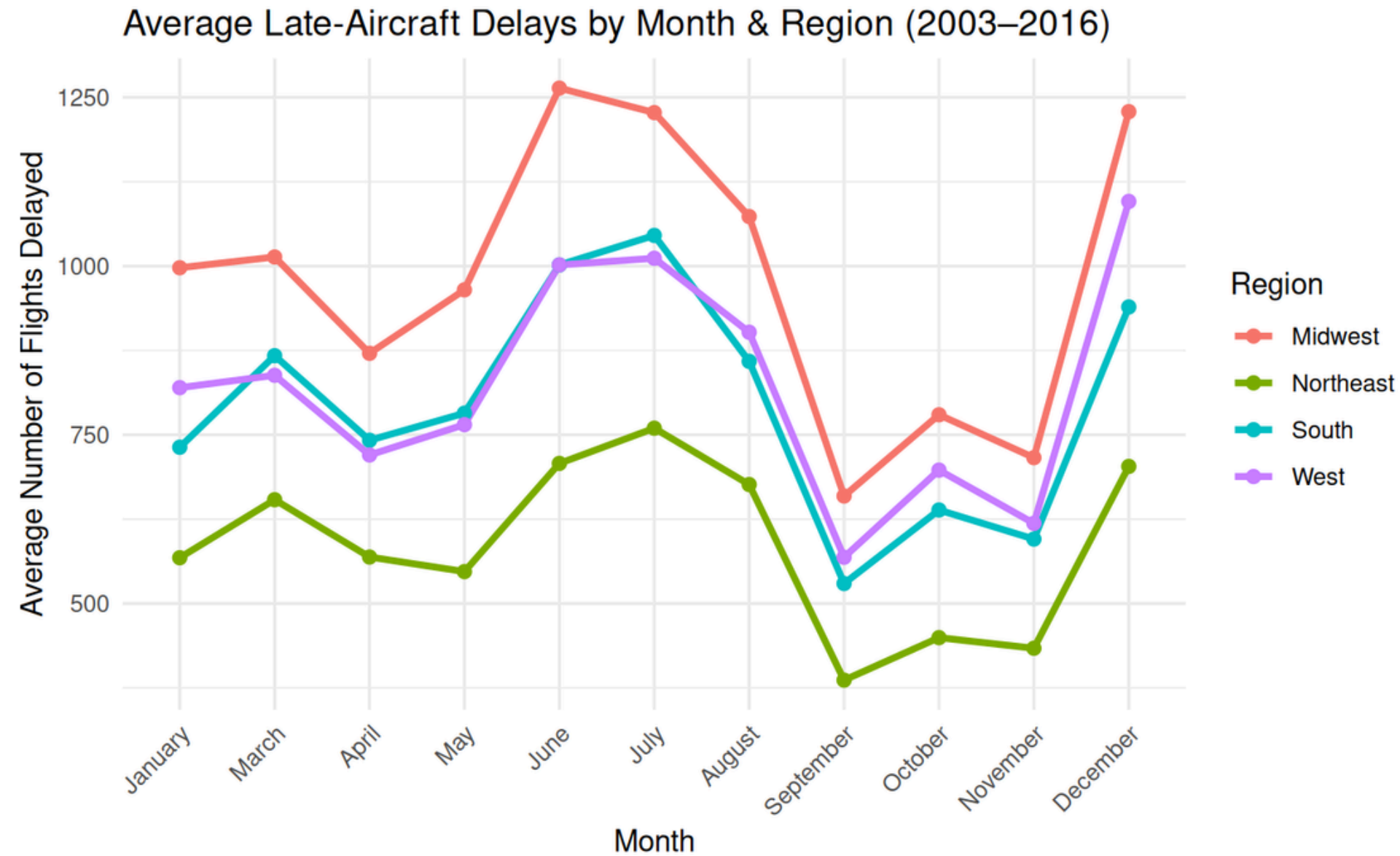
Average Weather-Related Flight Delays by Month & Region (2003–2016)



Weather-Related

- Peak in the middle of the summer & in December.
 - Summer weather & winter storms in December correlate with longer travel times
 - West Region → fewer delays (avg) compared to others
- Delays ranged from an average of 15-150 flights delayed monthly

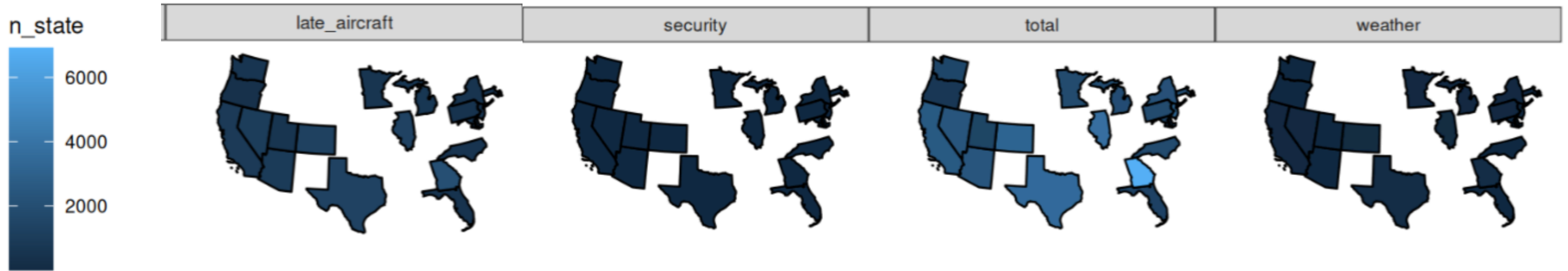
Late-Aircraft-Related



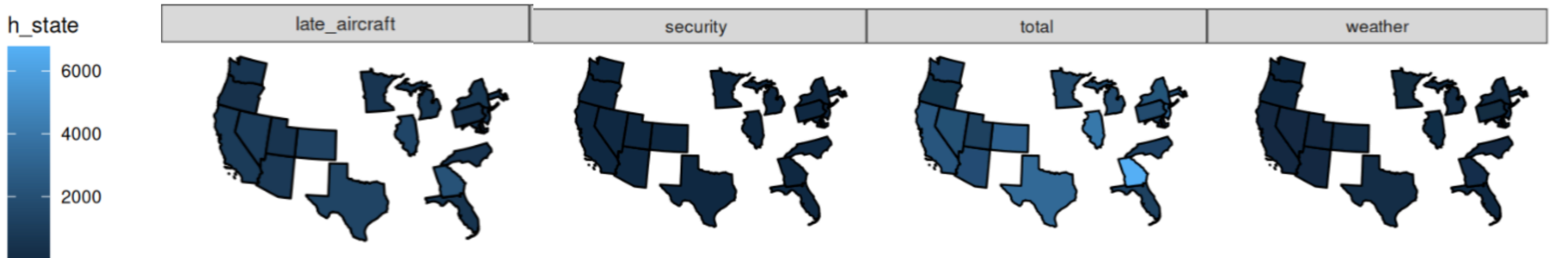
- Peak in the middle of the summer & December.
 - Summer weather & winter storms → longer travel times
 - Late-Aircraft-Related flight delays correlate with weather-related delays in overall shape
 - Northeast shows the least average delays → Midwest shows the most
- Late-Aircraft-related delays ranged from an average of 600 - 1000 flights delayed monthly



State distribution of delay number



State distribution of delay time (hours)

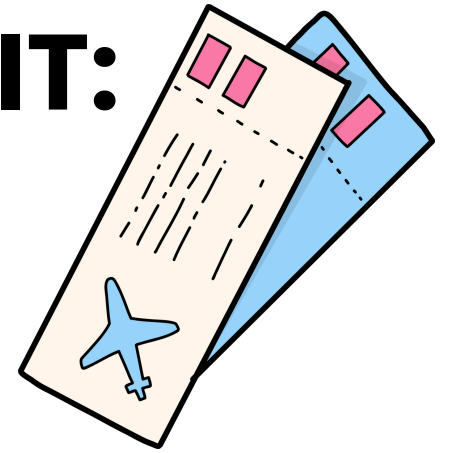


Q: Do we see the same distribution with time of delay as numbers of delays?




IN CONCLUSION

WHAT WE SHOULD DO ABOUT IT:



- Weather & late-aircraft delays = largest impact on the total number of delayed flights, peaking in the summer and winter
- Security-related delays = minimal
 - Seasonal increases in peak travel periods
 - most in the West
- Midwest has the most overall delays due to weather and late aircraft
 - The West has the fewest weather delays
 - The Northeast has the fewest late aircraft delays

 Delays are unavoidable!
→ Flexible travelers: avoid peak travel times and seasons & stay out of the midwest

Limitations

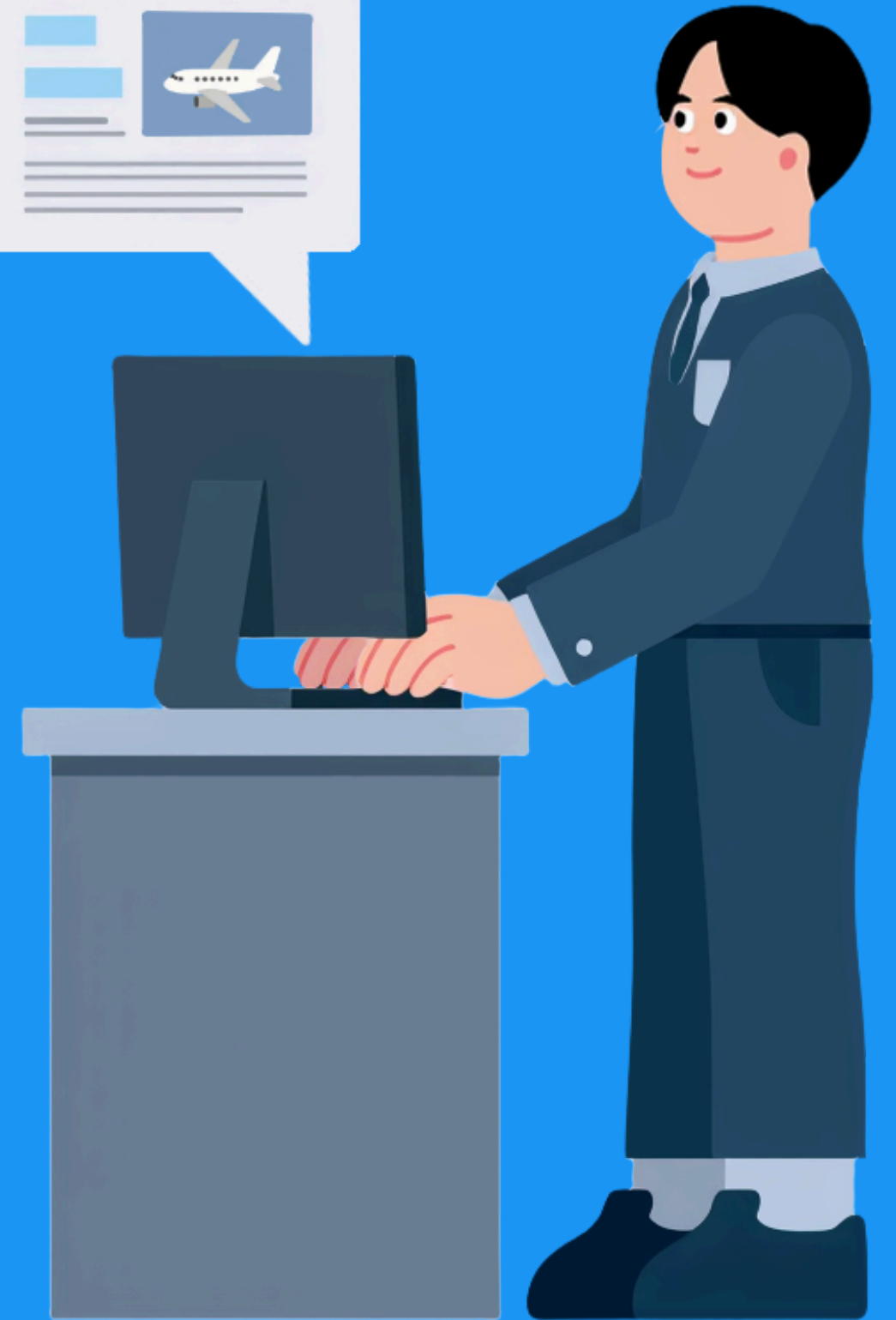
- Data is aggregated monthly
- The data set only includes what it classifies as “major” US airports
- Regions blur over state specific differences
- All of the Data is self-reported by individual carriers





THANK

YOU



Julia Bernarde

Jack Clodfelter

Ricky Jiang

Mary Callaghan