Sample Analysis – Traffic at Belgrade Airport Milos Djeric

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This is a simple demonstration where I present some of my technical skills in obtaining, analyzing, and presenting data in R.

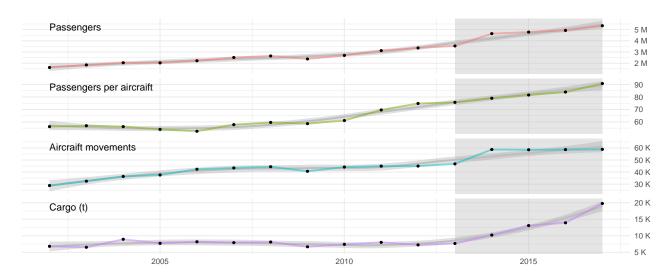
Belgrade "Nikola Tesla" airport

Belgrade Airport is the main airport in Serbia, located some 15 km from the downtown of Belgrade. It was opened in 1962, following the closure of the pre-war airport in the current neighborhood of "New Belgrade". Initially, the airport's growth culminated in late 80s, when it served as a main hub of Yugoslav Airline Transport, serving it's large national and international network, and number of foreign carriers. At the time, destinations included cities in North America, Europe, Asia, Africa, and Australia.

Following the wars in the breakup of Yugoslavia and international sanctions, traffic sharply declined in the 90s until October political changes of 2000. What follows is the brief analysis of current traffic and trends in the past 15 years.

Historical trend

Looking at data from 2003, we can identify a steady growth with several caveats.



First, in the past few years there is a rapid growth of cargo trans-

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Figure 1: Traffic from 2002 to 2017. Air Serbia commenced operation in 2013.

port. Second, we can observe a small "dent" in traffic, associated with 2009 and economic crisis. And finally, the transformation of the old JAT into Air Serbia did not have a profound effect on overall trend, but its start of operations is identifiable with spike in aircraft operations and a slight jump of passenger traffic.

Regional context

In the Balkans, Serbia has fourth busiest air passenger traffic, which is almost exclusively driven by Belgrade Airport. It follows tourismheavy EU airspace of Greece, Bulgaria, and Croatia. Greece alone has almost double the traffic of all other countries combined (59M compared to 39M).

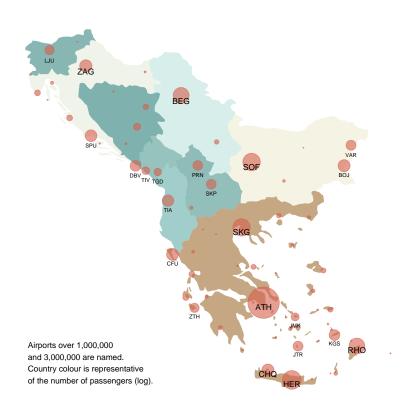
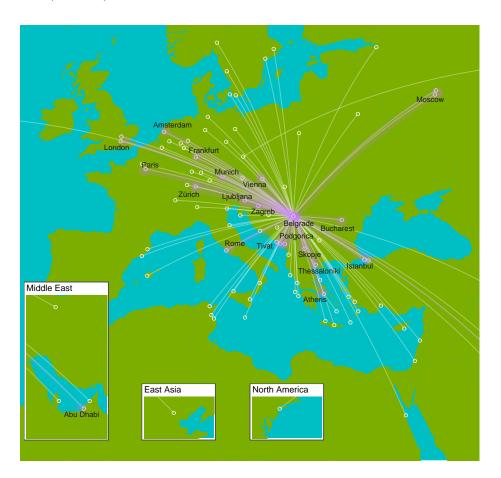


Figure 2: Passenger traffic in the Balkans, 2017. Individual airport and country level data.

In 2017, Belgrade "Nikola Tesla" Airport was the fifth busiest in the region, with 5.3 million passengers. While Athens had four times more passengers, Belgrade was in the region of other high-performing airports with six and seven million passengers—Thessaloniki, Sofia, and Heraklion—and had 40,000 more passengers than Rhodes.

Destinations and Arilines

Currently, around 90 airports on four continents are reachable from Belgrade, most of them through direct lines, except for Santorini and Beijing. Compared to 80s, the number of direct lines has increased while the variety of the long-distance destinations has decreased. For example, currently there is a direct line to New York (three times a week), and several daily flights to Amsterdam, Munich, or Paris. Thirty years ago, even flights to European destinations were sometimes operated via Zagreb, and more often than not, flights to New York, Toronto, Chicago, or Los Angeles. This is, for the most part, on par with global trends in aviation and the rise of the huge airport hubs—such as Dubai, Munich, or Amsterdam.



Current concentration of lines is centered around areas with large Serbian diaspora (Germany, Scandinavia, Italy), regional destinations, hubs and cities of economic and political importance, and holiday destinations in Mediterranean.

Figure 3: Airport destinations from Belgrade as of fall 2017. Includes regular, seasonal, charter, and cargo trafic. Busiest city-destinations are identified.

Type

Traffic at Belgrade Airport is fairly seasonal, with close to half of all destinations served being either charters or summer lines. Cargo traffic is considerably small, although, the last few years indicate that it is on rapid rise.

Destinations are dominated by Air Serbia, and its subsidiary Aviolet, with only Wizz Air—a low-cost airline—having somewhat developed destinations from Belgrade. All other passenger airlines serve fewer than three destinations. This, of course, does not include seasonal and charter traffic.

This lack of strong competition on individual lines is further evident in the fact that only one destination—Tel Aviv-Ben Gurion—is served by more than two companies, and 44 regular scheduled lines have only one airline operator. Granted, this analysis does not include alliances, subsidiaries, and code-shares which might provide some nuance to this interpretation.

Table 1: Competition on regular scheduled flights from Belgrade.

Number of airlines operating line	One	Two	Three
Number of airports served	44	15	1

Regular scheduled Seasona <u>charter</u>

Figure 4: Structure of destination airports according to the type of service.



Figure 5: Airlines with most destinations served from Belgrade. Subsadiries and alliances are not grouped.

Process notes

Five tables with data were scraped from Wikipedia pages: passenger destinations, cargo destinations, traffic, and busiest routes for Belgrade, and airport traffic for the Balkans.

Tables were transformed, combined, and separated for presentation of data. The most complex were passenger destinations, which is a two-column table with airlines and grouped destinations separated with commas and annotations. All these airports were separated and classified: regular scheduled, seasonal, and seasonal charters.

Geographic position of the airports was accessed through AIR-PORT-CODES API, where some systemic and manual modification of airport names were necessary since Wikipedia entries differ from the names in their database. City locations were obtained with ggmap.

Figures were created using ggplot2, flight pats using geosphere, treemapify for tree map and so on.

DATA SOURCES:

- * Wikipedia contributors, "Belgrade Nikola Tesla Airport," Wikipedia, The Free Encyclopedia.
- * Wikipedia contributors, "List of the busiest airports in the Balkans,' Wikipedia, The Free Encyclopedia.