What would you do next? Modelling Activity Transitions using the Foursquare API

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1. Introduction

Have you ever wondered, where do people go after watching a game at the stadium? Or if you just ate lunch what would you do next? If you were at the game and your team won you would probably end up at a bar or pub celebrating your team's victory. And after lunch, you would probably want to get some dessert. Are these just guesses, or are they backed by some statistical data?

The main goal of this project is to answer such questions, leveraging the data obtained from location sharing services like Foursquare. Each individual task that a person does could be considered as an activity. For example, watching a game at the stadium, having drinks at a bar, eating lunch, having dessert are all activities. The transition from watching a game at the stadium to having drinks at a bar or eating lunch to having dessert is considered to be an activity transition. In this project, we will try to model the activity transitions and answer the primary question: "If a person is doing some known activity currently, what is the person most likely to do next?"

Modelling activity transitions could be considered as a sub-task of modelling patterns of human mobility which are significant for traffic forecasting, urban planning, as well as epidemiological models of disease spread [Cheng et al. (2011), Noulas et al. (2011)].

2. Related Work

As compared to what research is already present in this field, this is a very small scale project. If the topic has piqued your interest, I would suggest you to go through the papers listed below. However, definitely have a look at Livehoods if the papers seem boring. They have a very good interactive web interface that help understanding several aspects of a dynamic city.

Related work in this field usually utilize the checkin footprint of users to model human mobility. However, getting checkin information using the Foursquare API is a premium call which caused several limitations. Also unless the checkin is made public, the API terms and conditions states that you cannot store the data more than a couple of hours. For this reason, I had to mostly use only the regular calls.

2.1 Data Sources

As a use case, in this project we will try to model activity transitions in the city of San Francisco. We would first need geospatial data to get the boundaries of San Francisco. It can easily be obtained from DataSF. We get the geojson files for zip codes and San Francisco neighbourhoods.

We will then use Google Maps Geocoding API to get locations within the zip codes and neighbourhoods. Using these locations as seed points we will explore the venues of San Francisco using the Foursquare API. For each venue, we use the next venues endpoint from the API to get a list of next venues.

We consider the primary category of the venue as the activity. The list of all the categories available in Foursquare are also obtained.

References

Zhiyuan Cheng, James Caverlee, Kyumin Lee, and Daniel Sui. Exploring millions of footprints in location sharing services, 2011. URL https://www.aaai.org/ocs/index.php/ICWSM/ICWSM11/paper/view/2783.

Anastasios Noulas, Salvatore Scellato, Cecilia Mascolo, and Massimiliano Pontil. An empirical study of geographic user activity patterns in foursquare, 2011. URL https://www.aaai.org/ocs/index.php/ICWSM/ICWSM/11/paper/view/2831.