# Forecasting Patent Filing Volumes using Google Patents Data

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#### Introduction

- United States Patent and Trademark Office (USPTO)
- Patent Examiner
  - Scientifically literate
  - Specialized
  - Search for existing claims
- Patent Application Process
  - Multiple rounds of Patent Examination
  - Back-and-forth with Patent Attorneys
  - Renewable Patents
  - Long Process can take years to grant a patent
- Cooperative Patent Classification
  - Section, Class, Subclass, Group, Subgroups
  - Human Necessities, Agriculture, Accessories of agricultural machines, Hand tools, Attaching the blades or the like to handles

## Motivation

- Large component of USPTO revenue is patent application filing fees.
   [1]
- Creating a model that can
  - Forecast the number of patents filed
  - Forecast the number of patents filed per category
  - Be sensitive to fluctuations
  - Accurate

is valuable

- Current models use an econometric for prediction.
  - Forecasting Innovations: Methods for Predicting Numbers of Patent Filings by Hingley and Nicholas[2].
  - Uses economic indicators such as Gross Domestic Product, Research & Development expenditures of various companies
  - Inaccurate
  - Econometric models have difficulty in capturing short-term trends.

## Motivation

- Google Patents.
  - Used for searching existing patents
  - Used by patent examiners, patent attorneys

is valuable

- Seasonal Autoregressive Model
  - Predicting the Present with Google Trends, Hal Varian et al. [3]
  - Predicting car sales using Google Trends data

## **Proposal**

- Create a model using Google Patents Data
- Baseline: Seasonal Autoregressive Model

$$\overline{x} = ax_{t-1} + bx_{t-1} + ... + kx_{t-11} + lx_{t-12} + google\_patents\_data$$

where  $\overline{x}$  is forecasted patent filing volume for month t,  $x_t$  is real patent filing volume in month t,  $g_{n,t}$  is the normalized query share for Google Trend number n in month t, a, b, ..., k, l are trainable parameters.

- Based off of work by Google's Chief Economist Hal Varian [3]
- Data
  - Previous Year's Patent Filing Volume Data: USPTO's Patent Examination Research Dataset (Public PAIR)
  - Google Patents Public Datasets on Google Cloud

## Proposal

#### Phase 1

- Forecast Number of Patents Filed
- Google\_Patents\_Data: of searches Google Patents per month

#### Phase 2

- Forecast Number of Patents Filed for specific patent classifications
- Google\_Patents\_Data: of searches certain search queries have on Google Patents

## Table

Treatments	Response 1
10/1	Get data on $\#$ of searches Google Patents has per month
11/1	Filter out those searches by patent examiners via IP address
12/1	Complete Phase 2 - Train Model
1/1	Get data on $\#$ Google Patents queries per month
2/1	Complete Phase 3 - Train Model
3/1	Implement USPTO patent search interface data with model
4/1	Continue making improvements on model

## References



O. of the Chief Financial Officer, Aug 2018.



P. Hingley and M. Nicolas, *Forecasting innovations: methods for predicting numbers of patent filings*.

Springer, 2006.



H. Varian and H. Choi, "Predicting the present with google trends," Apr 2009.

## Questions?