**ANALYTICS PROJECT PRESENTATION - SUMMER 2015** 

# APPLICATION OF MACHINE LEARNING OF FOR IMPROVED CRISIS FORECASTING

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This paper aims to leverage data mining for improved crisis forecasting. Using sequential patterning and neural networks to analyze news archives and financial data, we aim to create a prediction model for domestic and international crises.

### **MOTIVATION**

### Who are the users of this analytic?

UNICEF Operation Center (OPSCEN)

### Who will benefit from this analytic?

OPSCEN Officer

### Why is this analytic important?

- Forecasting event sequences
- Preparing humanitarian aid (money, water, and sanitation)
- Targeting humanitarian aid location
- Avoiding human bias

#### **DATA SOURCES**

Name: UNICEF OPSCEN's News Brief 2004-2015

**Description:** Headline news from all over the world

Name: ICEWS Data 1995-2014

**Description:** Daily events coded ranked by scale of hostility vs. cooperation.

Monthly indicators for events of interest per country.

Name: Stock Indexes/Economic Data 1990-2015

**Description:** Daily closing prices back to 1990

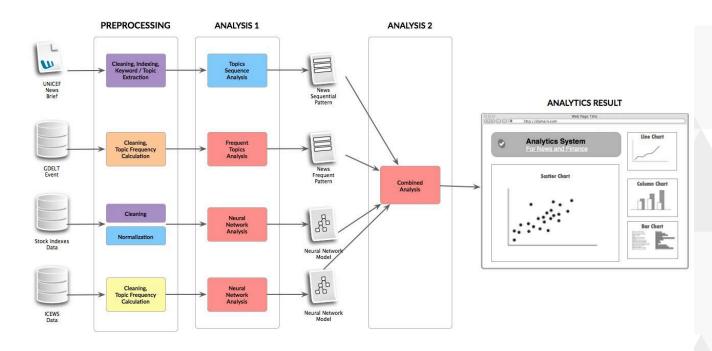
Name: GDELT Event Data 1979-2014

**Description:** Daily records including date, country, event code, latitude and

longitude, etc.

### **DESIGN DIAGRAM**

#### APPLICATION OF MACHINE LEARNING FOR IMPROVED CRISIS FORECASTING



#### HADOOP TECHNOLOGIES USED





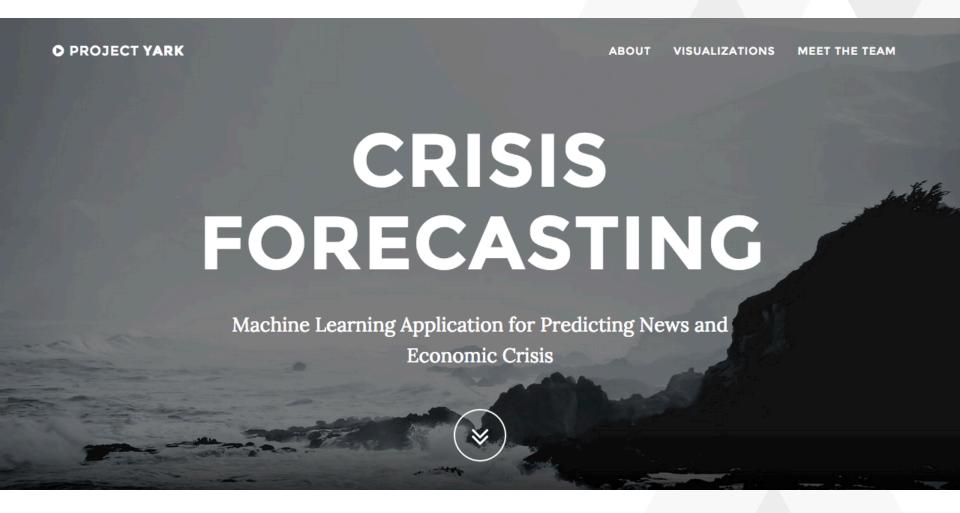




APACHE PIG

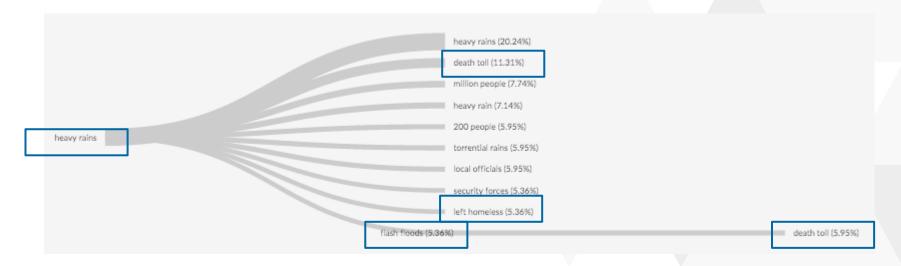
Platform(s) on which the analytic ran:

### **VISIT OUR WEBSITE**



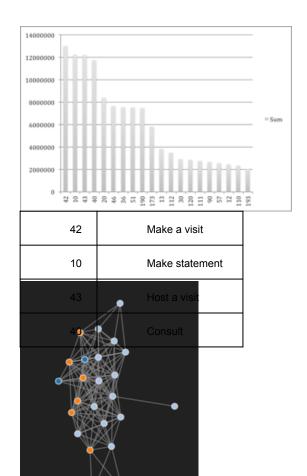
http://bit.ly/crisisforecasting

### 1. UNICEF News Sequence from 'Heavy Rain' Topic

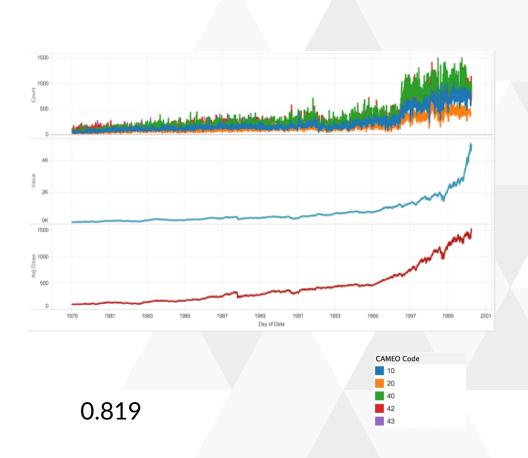


5.36% = 8/169 countries

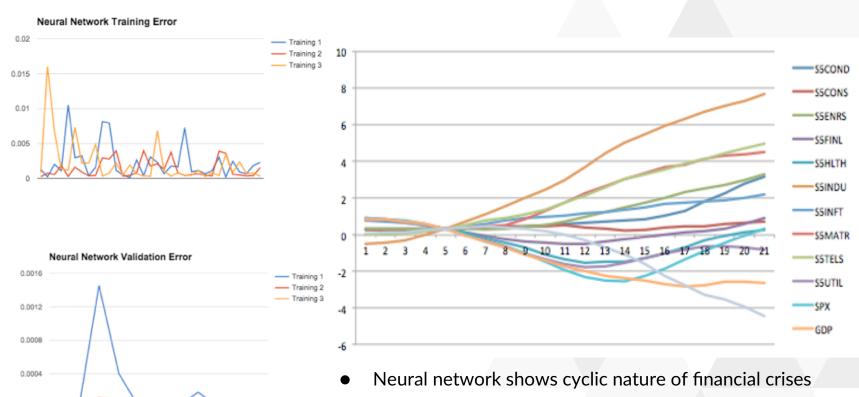
# 2. GDELT Frequent Item Analysis



### Frequent Event vs. Stock Data

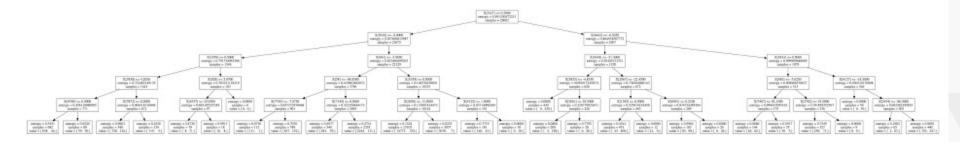


### 3. Neural Network Analysis of Stock Indexes/Economic Data



 Show importance of energy and consumer staples sectors for future growth

## 4. Decision Tree Analysis of ICEWS Data



Index	Variable Name
5427	INStALLeventsct
5018	GOVtUAFhosttotals
6443	NOTGOVtALLhosscaleav
1059	ALLtINSeventsct
941	ALLtALLhosscaleav
5438	INStALLhosttotals
5433	INStALLhighhostilityct
2867	DIStGOVeventstotals
1395	BUDtALLeventsct

### **OBSTACLES**

### 1. Keyword extraction algorithm effectiveness

Produces meaningless keywords ex: '200 people' or 'Recent years'

### 2. Handling a file with thousands of columns

Had to scale with MapReduce job

### 3. Low availability on HPC

Hive Databases intermittently accessible

#### 4. Neural Network

- Computational Power for Models with Thousands of Dimensions
- Infinite Number of Samples for Continuous Time Series

#### **SUMMARY**

- Frequent events related to communication and cooperation among countries
- Some events have a high correlation with following events
- Prominence of buddhist insurrection
- Some mined topic sequences have no semantic meaning
- Neural network shows cyclic nature of financial crises
- Show importance of energy and consumer staples sectors for future growth
- Further tuning and combination of the models could produce useful leads for investigation

### **ACKNOWLEDGEMENTS**

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