#### Real-Time Large-Scale Data Analytics and Information Retrieval in Practice

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## Introduction

- 1.1 Enter Real Time
- 1.2 Problems, Pitfalls and Challenges

# The nature of large-scale data

- 2.1 Data Archives
- 2.2 Data Streams

# The challenges of real-time information processing

#### 3.1 Problem description

### The nature of real-time data

- 4.1 Stochastic processes
- 4.2 Discrete-time
- 4.3 Continuous-time

# Fundamental Algorithms in Data Analytics and IR

- 5.1 Statistical analysis framework
- 5.1.1 Regression analysis
- 5.1.2 Forecasting
- 5.1.3 Parameter estimation
- 5.1.4 Non-parametric methods

# **Advanced Algorithms**

- 6.1 Online learning algorithms
- 6.2 Kernel Methods

# Software toolkits for large-scale data analysis

- 7.1 Hadoop
- 7.2 Mahout
- 7.3 voidbase

# Large-scale IR Cookbook

- 8.1 Building AVMs on vertical data
- 8.2 Model selection in the real world

# Moving from batch to real-time

9.1 Paradigm shift

# Concurrency: a new frontier

- 10.1 Problem Description
- 10.2 Data Structures
- 10.3 Algorithms

# Real-world real-time applications

- 11.1 Web Analytics
- 11.2 Media analysis
- 11.3 Econometrics

#### 11.4 Quantitive Finance

In this chapter we describe computational aspects related to Quantitative Finance applications :

- security pricing
- $\boldsymbol{\cdot}$  stochastic process as a central concept in quant finance, as well as the central object in real-time analytics
  - drawing analogies
  - equivalents of financial concepts in fields such as web analytics
  - continuous vs discrete variables
  - real-time discrete-time
  - real-time continuous-time

#### notes:

- Markov process variances of the changes in sucessive time periods are additive
- analogies
- Twitter topic process
- Trend detection and keyword bidding
- Economy of online auctions
- Towards efficient online marketplaces
- Prediction markets
- Financial software deals with real-time, but not large-scale data

#### 11.5 Online collaboration

# Algorithms and Data Structure in support of large-scale real-time framework

- 12.1 Convolutional procedures
- 12.1.1 Example: Viterbi algorithm
- 12.2 Convolutional representation of fundamental algebraic operations
- 12.2.1 Average, Mean, Median, Variance
- 12.2.2 Matrix operations
- 12.3 Randomized Algorithms
- 12.3.1 Fast vs. Convolutional
- 12.4 Queue-based structures

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# voidbase : queue-based computing framework

- 13.1 Overview
- 13.2 Paradigms

#### voidbase cookbook

- 14.1 Simple Markov process tracking
- 14.2 Monte Carlo simulation
- 14.3 Zero-development dynamic resource monitoring framework
- 14.4 Automatic trend detection toolkit
- 14.5 Building automated news-based algorithmic trading app

# Future challenges in Real-Time Large-Scale analytical processing

- 15.1 Representation problem
- 15.2 Fundamental limits

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