CS226 Big-Data Management

Instructor: Ahmed Eldawy



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Welcome (back) to UCR!



Class information

- Classes: MWF 10:00 10:50 AM
- Zoom Link: on iLearn. Do not distribute.
- Instructor: Ahmed Eldawy
- TA: Akil Sevim
- Office hours: MW 11:00 11:50 AM
- Website: <u>http://www.cs.ucr.edu/~eldawy/20FCS226/</u>
 iLearn (Any UCRX students?)
- Piazza: https://piazza.com/ucr/fall2020/cs226
- Email: <u>eldawy@ucr.edu</u>
 - Subject: "[CS226]"

Course work



Active participation in class (5%)



Reading and review tasks (10%)



Assignments (20%)



Mid-terms (15%)



Project (50%)



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- Groups of 4-5 students
- Milestones
 - Group Selection
 - Project proposal (5%)
 - Project proposal presentation (10%)
 - Literature survey (10%)
 - Report outline (5%)
 - Final report (10%)
 - Final presentation (10%)

Project: Coordination between CS 226 and CS 225

- You can share project groups between CS 226 (Big Data Management) and CS 225 (Spatial Computing), given:
 - You work on one project with double in size, this gives opportunity to focus on one big project for the two courses
 - All group members must be taking the two courses, except one member at maximum.
 - The project must have a spatial component and a big data component
 - The team must submit two separate reports, one for each course.
 Each report must focus on the component relevant to the course.
- Example projects:
 - City ranking: incorporate spatial factors in ranking cities for quality of live
 - Satellite imagery analysis: use large satellite images datasets in any societal application
 - Contact tracing for epidemics control: use spatial data to trace contacts to patients of COVID-like epidemics



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R'GEOSPATIAL

WHAT'S GIS?

GIS stands for Geographic Information system. The software is used for both gathering and visualizing data. The most common example that is applicable to our lives is Google maps. Whenever you look up directions or try to figure out where you are, that's the byproduct of GIS.

GOAL OF THE CLUB:

R'geospatial is a relatively new club on campus that aims to show the utility and transferability of GIS skills to students' careers. The club will cover how to use the software and also how it applies to your major and future professional endeavors.



If interested, please add us on Highlanderlink and feel free to reach out to us if you have any questions!

Survey & Breakout



Course goals

- What are your goals?
- Understand what big data means
- Identify the internal components of big data platforms
- Recognize the differences between different big data platforms
- Explain how a distributed query runs on big data





Super Hero







Ant-Man/Wasp



Get smaller to understand how ants work and what they are capable of.



Use this knowledge to control thousands of ants and do amazing things!

Optional task: Watch Ant-Man and the Wasp this weekend $\ensuremath{\mathfrak{O}}$





Big-data Expert

- Understand how the big-data platforms really work
- Control those thousands of processors efficiently to carry out your task





- Overview of big data
- Big-data storage
- Big-data processing
- Big-data indexing
- Big-SQL processing
- Programming packages

Introduction

UCR



All of the information mformation you need!



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Big Data, Big Impact: New Possibilities for International Development

Related Issues





The amount of data in the world is exploding - large portion of this comes from the interactions over mobile devices being used by people in the developing world - people whose needs and habits have been poorly understood until now. Researchers and policymakers are beginning to realize the potential for channeling these torrents of data into actionable information that can be used to identify needs & provide services for the benefit of low-income populations. This discussion note is a Call-to-action for stakeholders for concerted action to ensure that this data helps the individuals and communities who create it.





Interest in Big Data in the US

March 2012: Obama administration unveils BIG DATA initiative: \$200 Million in R&D investment



Office of Science and Technology Policy Executive Office of the President New Executive Office Building Washington, DC 20502

FOR IMMEDIATE RELEASE March 29, 2012

Contact: Rick Weiss 202 456-6037 <u>weiss@ostp.eop.gov</u> Lisa-Joy Zgorski 703 292-8311 <u>lisajoy@nsf.gov</u>

OBAMA ADMINISTRATION UNVEILS "BIG DATA" INITIATIVE: ANNOUNCES \$200 MILLION IN NEW R&D INVESTMENTS

Aiming to make the most of the fast-growing volume of digital data, the Obama Administration today announced a "Big Data Research and Development Initiative." By improving our ability to extract knowledge and insights from large and complex collections of digital data, the initiative promises to help solve some the Nation's most pressing challenges.

June 2013:

Washington Post is calling Obama "The Big Data President"



Interest in Big Data in Europe

 March 2014: David Cameron and Angela Merkel talking about Big Data in a Computer Expo in Hannover, Germany



The Market of Big Data



Four Three V's of Big Data



Sources: McKinsey Global Institute, Twitter, Cisco, Gartner, EMC, SAS, IBM, MEPTEC, QAS

TRM

Big Data Vs Big Computation

- Full scans (e.g., log processing)
- Range scans
- Point lookups
- Iterations
- Joins (self, binary, or multiway)
- Proximity queries
- Closures and graph traversals



Big Data Applications

- Web search
- Marketing and advertising
- Data cleaning
- Knowledge base
- Information retrieval
- Internet of Things (IoT)
- Visualization
- Behavioral studies

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Bourns

Publicly Available Datasets

- Data.gov
- UCR Star [https://star.cs.ucr.edu]
 <u>facebook.com/ucrstar</u> &
- Twitter Streaming API
- Yahoo! Webscope
 [http://webscope.sandbox.yahoo.com/]
- GDELT [http://www.gdeltproject.org/]
- Instagram API

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http://mattturck.com/2012/06/29/a-chart-of-the-big-data-ecosystem/fengineering

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http://mattturck.com/2014/05/11/the-state-of-big-data-in-2014



http://mattturck.com/2016/02/01/big-data-landscales/

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BIG DATA & AI LANDSCAPE 2018



V1 - Last updated 6/19/2018

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Data & Al Landscape 2019

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Components of Big Data



Storage of Big Data

- Data is growing faster than Moore's Law
- Too much data to fit on a single machine
- Partitioning
- Replication
- Fault-tolerance



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Hadoop Distributed File System (HDFS)

- The most widely used distributed file system
- Fixed-sized partitioning
- 3-way replication
- Write-once read-many
- See also: GFS, Amazon S3, Azure Blob Store



Indexing

- Data-aware organization
- Global Index partitions the records into blocks
- Local Indexes organize the records in a partition
- Challenges:
 - Big volume
 - **HDFS** limitation
 - New programming paradigms
 - Ad-hoc indexes

Global index

Local indexes

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Replication

Redundancy



Multiple masters



Streaming

Processing window

- Sub-second latency for queries
- One scan over the data
- (Partial) preprocessing
- Continuous queries
- Eviction strategies
- In-memory indexes

Task Execution

- MapReduce
 - Map-Shuffle- Reduce
 - Resiliency through materialization
- heloop R_1 R_n R_2

 M_2

...

 M_1

- Resilient Distributed Datasets (RDD)
 - Directed-Acyclic-Graph (DAG)
 - In-memory processing
 - Resiliency through lineages Spork
- Hyracks
- Stragglers Asterix
- Load balance

M_m

Query Optimization

- Finding the most efficient query plan
- e.g., grouped aggregation



Cost model (CPU – Disk – Network)



 Debugging in distributed systems is painful



 We need to keep track of transformations on each record



Big Graphs

- Motivated by social networks
- Billions of nodes and trillions of edges
- Tens of thousands of insertions per second
- Complex queries with graph traversals







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Hadoop Distributed File System (HDFS)

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Query Parser

Query Planner

Query Executor

Yet Another Resource Negotiator (YARN)



Hadoop Distributed File System (HDFS)





Pig Latin + Pigeon

Spatial Visualization

MapReduce Processing + Spatial Query Processing



Yet Another Resource Negotiator (YARN)



Hadoop Distributed File System (HDFS) + Spatial Indexing



Reading Material

 "The Age of Analytics in a Data-driven World" [Executive Summary] by McKinsey & Company