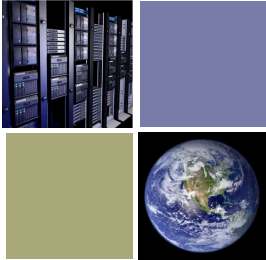


+ Data-Management for Data-intensive Computing



CMPSC 274: Advance Topics on Database System
Divyakant Agrawal
Department of Computer Science
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+ Prelude

- Data management is at the cross-roads:
 - New models for data-intensive computing
 - Significant turmoil in terms of technological advances
 - Rapid changes have presented the data management research community with unprecedented challenges.
- Inevitable to re-examine the context in which data management evolved in **the past**.
- In the same vein, we need to explore the role of data management in **the future**.
- Course Objective: Comprehensive understanding of data management and data analysis paradigms.

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+ Data-intensive Computing

- Storage and retrieval management of persistent data.
- Large-scale data analysis for data-centric decision making.

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+ Course Organization

- First Half of the Course (4 weeks):
 - Persistent Stores for Enterprise Applications

- Second half of the Course (2 Weeks):
 - Persistent Stores for Internet and Web-scale Applications

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+ Course Organization

- Second half of the course (2 Weeks):
 - Enterprise-class Solutions for Large-scale Data Analysis

- Second half of the course (2 Weeks):
 - Internet and Web-scale Solutions for Large-scale Data Analysis

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+ Course Grading

- First half of the course (assignment/assessment based):
 - Home-works
 - Mid-term Exams
 - Text book and Other Refereces

- Second half of the course:
 - Project based
 - Large programming/implementation project (2 person)

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Data Management Overview



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Historical Perspective

- Advent of computer technology:
 - Persistent storage of data and information
 - Value of data/information realized very early especially in the context of business entities
- Early efforts in the industry:
 - Effective data management solutions
 - Based on storing data:
 - Files: logical abstraction
 - Tapes: physical realization
- File based data management
 - Problems in accessing data
 - Problems in processing data
 - In general, problems in effective usage of data

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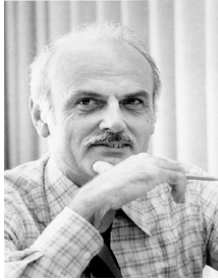
Historical Perspective

- Emergence of alternative storage models:
 - Departure from file-based storage
 - New data models to enable data access based on its attributes
 - New language models to enable effective manipulation of data
- Data models (circa 1965):
 - Network model: essentially to model business entities using the information paradigm
 - Hierarchical model: another variant
- Standardization efforts:
 - Economies-of-scale/minimize duplication
 - CODASYL

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+ E. F. Codd



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+ Codd'69: Relational Data Model

- Relational Data Model:
 - Tabular framework for data representation
 - Intuitive and easy to comprehend
 - Complete theoretical framework
- Relational algebra (operational framework):
 - An algebraic framework for operating on relational data
 - Well-defined algebraic operators
- Relational calculus (theoretical framework):
 - First-order logic
 - Declarative querying framework
 - Equivalent to relational algebra

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+ Relational Data Model

- RDBMS model became extremely successful.
- Logical Data Model:
 - Intuitive
 - Well-defined
 - Design time considerations need not focus on physical issues
- Physical storage independence:
 - Run-time system maintains the access methods
 - Dynamic mapping from logical to physical level
- Declarative Query Interface:
 - Users did not need to be expert programmers

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+ Data Management Evolution 13

- RDBMS became highly successful:
 - Widely adopted by both large and small business entities
- Enterprises became increasingly reliant on databases
- Primarily used for day-to-day operations:
 - Banking operations
 - Retail operations
 - Travel industry

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+ Data Management Evolution 14

- Typically:
 - Database modeled the state of the enterprise
 - Client operations were applied to update the state.

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+ Batched Transaction Processing 15

- Nomenclature:
 - Transaction Processing Systems
- Typical usage:
 - Spool client transactions during the day
 - During the night, spooled transactions applied to the database state of previous night
 - New database state becomes available for the next working day
- Advantages:
 - Almost up-to-date information on the finger-tips
 - Failure-recovery is in-built in the paradigm
 - No issues of concurrency

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+ Batched Transaction Processing 16

- **Problem:**
 - Database state did not reflect up-to-date information
- **Impact on daily operations:**
 - Some amount of guess-work in formulating the application state of client transactions:
 - seat availability on a flight
 - funds availability in a bank account
 - inventory information for re-order
- **Impact on batch update:**
 - Transaction **failures** if the “guess” is wrong

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+ The OLTP Paradigm 17

- **On-line Transaction Processing:**
 - Database state is up-to-date at all times
- **Significant challenges:**
 - Multiple users/clients need to be supported
 - Handle hardware and software failures
- **Emergence of what is now commonly referred to as:**
 - The Transaction Concept:
 - Concurrency
 - Failures

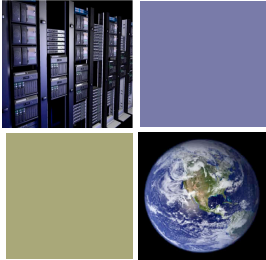
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+ Concurrency & Failures: A Quick Preview 18

- **List maintenance:**
 - lookup/find operations in $O(\log N)$ time.
 - Read-only operations:
 - Concurrency does not cause any difficulties.
- **List updates:**
 - Inserts/deletes also in $O(\log N)$ time if executed sequentially.
 - What if I specify that operations are arbitrarily interleaved?
 - Worse yet: what happens if the updaters can fail?
 - Can you do it safely? Do you have the necessary tools to solve this problem?

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+ Data Analysis Overview



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**Data Analysis (90s) →
Business Intelligence (00s) →
Big Data (Now!!!)**

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+ Hans Peter Luhn



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+ 50 Years of Business Intelligence 22

- Vision of Business Intelligence:
 - Hans Peter Luhn in a 1958 article.
 - Predates the notions of Databases and Data Management.

- A pioneer in Information Sciences:
 - New use of the term *thesaurus*
 - Automatic creation of literature abstracts
 - 16 digit Luhn's number widely used for credit cards and other banking instruments
 - ...

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+ Luhn's Vision 23

- Defined BI as:

"... provides means for selective dissemination to each of its action points in accordance with their current requirements or desires."

- Key technologies:
 - Auto-abstracting of documents,
 - Auto-encoding of documents, and
 - Auto creation and updating of profiles

- Breadth of the vision:

"... *business* is a collection of activities carried on ... be it science, technology, commerce, industry, law, government, defense, et cetera."

"... *intelligence* is also defined ... as the ability to apprehend the interrelationships of presented facts in such a way as to guide action towards a desired goal."

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+ The Early Years (1970s-1980s) 24

- Contrary to Luhn's overarching vision – early efforts on business information remained focused on **database management technology**.

- With the advent of the relational model:
 - DBMS technology became pervasive and matured.
 - Widely adapted by most enterprises.
 - Online Transaction Processing became a proven paradigm for business operations.

- Consequence:
 - Massive proliferation of OLTP systems especially within a single enterprise.
 - Data-driven decision making became a norm.
 - Disparate reporting from multiple operational data sources.

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+ Notion of “Data Analytics” (1990s) 25

- Presence of multiple operational systems created a *fractured* view of an enterprise.
- Devlin & Murphy introduced the term *business data warehouse* in 1988:
 - A unified view of the enterprise primarily for integrated reporting.
- Catalysts:
 - Demand for reporting – key factors being PCs and spread-sheets.
 - Market potential – Teradata, Red-brick Systems, etc.
- Negative factors:
 - Unproven, immature, and expensive technology proposition.
 - Distinction between DBMS and DW: no clarity, *?duplication?*
 - Fairly laborious and time-consuming data integration process
 - No clear stake-holders → *2nd Class Entity* often resulting in adversarial atmosphere.

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+ Data Warehousing: Current State 26

- Keys to success:
 - Enormous contribution of DW evangelist Ralph Kimball
 - STAR schema & Dimensional model for DW: intuitive and scalable
 - No compromise on the autonomy of operational data sources
- Persisting head-winds:
 - Since does not directly contribute to P&L:
 - ROI question still persists.
 - Not a plug & play technology:
 - Very high consulting costs.
 - Legacy of significant time and cost over-runs of most data warehousing projects.
 - Batch-oriented DW Architecture:
 - Deemed too costly just for integrated reporting.
 - Needed intuitive analytical capabilities.

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+ Hither “Business Intelligence” (2000-) 27

- Gray et al. [1996] introduced the CUBE operator for roll-up and drill-down analysis of multi-dimensional data (i.e., DW Model).
- DW enterprises (Hyperion, Cognos, Analysis Services, etc.) adapted the CUBE architecture and called it:
 - *business intelligence*.
- Problem:
 - Early BI (CUBE) technology had serious issues of scaling → only accentuated the ill-repute of DW/BI technologies
 - Underlying problem: exponential explosion of data storage

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+ Business Intelligence: Current State 28

- While the BI/Cube technology was still evolving – the spin doctors needed to undo the early damage.

- Hence, perhaps the term **Real-time Business Intelligence** – to convey the “criticality” of such technology to business leaders.

- Current debate: what exactly is meant by “real-time” in Business Intelligence?
 - In 2006, in this workshop, Donovan Schneider – gave numerous examples of “degree of timeliness” for a variety of analysis tasks.
 - My personal view is that the correct term should have been: **Online Business Intelligence**.

- Assuming that – redefine the DW/BI architecture to support RTBI.

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+ Concluding Remarks 29

- **Data Management:**
 - Will study the models, paradigms, theory, and algorithms needed for Enterprise Scale Data Management (& application development)
 - Will then examine the disruption that has occurred with the Internet and Web-based application:
 - underlying factors for this disruption and
 - Proposed solution

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+ Concluding Remarks 30

- **Data Analysis:**
 - Will study the well-accepted principles, architecture, and solutions for enterprise class Data Analysis platforms.
 - Will then explore the disruption caused by Internet and Web-scale Applications.

- **Time permitting:**
 - Multi-core processors
 - GPU platforms and databases
 - Data stream processing

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