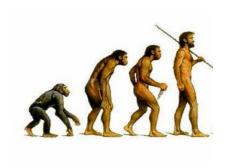
# **Data Analytics**



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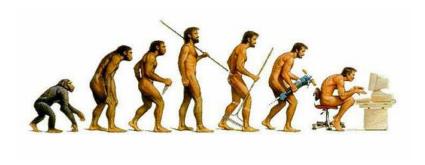


#### **Evolution**



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## **Evolution**

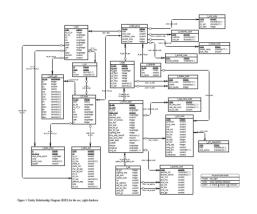


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#### **Data Evolution**

- structured
- precise
- static (almost)



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#### **Data Evolution**

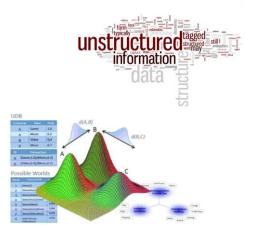
• non-structured



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#### **Data Evolution**

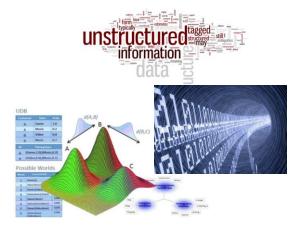
- non-structured
- uncertain



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#### **Data Evolution**

- non-structured
- uncertain
- streaming



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## Things to Come

- large scale data
  - very large collections (i.e., terabytes to exabytes)
  - scientific, business, user generated

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#### Things to Come

- large scale data
- · streaming data
  - sensors, feeds, continuous analytics
  - response times in seconds to nanoseconds

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#### Things to Come

- · large scale data
- streaming data
- heterogeneous data
  - structured, non-structured, text, multimedia
  - variety of sources, schemas, representations, models
  - computer-generated, human-generated

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#### Things to Come

- · large scale data
- · streaming data
- · heterogeneous data
- private data
  - correlating data from multiple sources poses risks
    - · credit card history, mobile phone usage, GPS tracking
  - privacy and accountability
    - access granted only to specific person, at specific time, for specific purpose, only for necessary data

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#### Things to Come

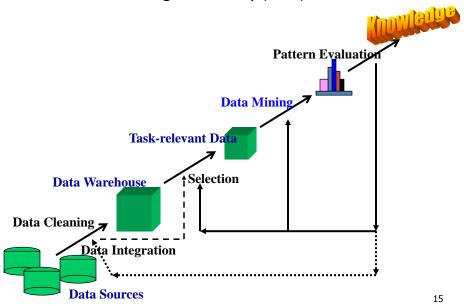
- · large scale data
- · streaming data
- heterogeneous data
- · private data
- uncertain data
  - imprecision, inconsistencies, incompleteness, ambiguities, latency, deception, approximations, privacy preserving transformations
  - process/data/model uncertainty

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## data vs knowledge

#### Knowledge Discovery (KDD) Process



#### Knowledge Discovery (KDD) Process

