

**Pyramid**

## **Evolution of Data Management Systems: from Uni-processor to Large-scale Distributed Systems**

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# Outline

## Evolution of Data Management Systems

► **Objective of Talk: <Why, Introduced Concepts, Relationship>**

■ **File Management Systems**

■ **Uni-processor Rel. DB Systems DBMS [Codd 70]**

■ **Parallel DBMS [Dew 92, Val 93]**

■ **Distributed DBMS [Ozs 11]**

■ **Data Integration Systems [Wie 92]**

Characteristics = <Distribution, Heterogeneity, Autonomy>

➔ <Stable Systems, Not Scalable>

■ **Data Grid Systems [Fos 04]**

Characteristics = <Large-scale, Unstable Systems (Dynamics of Nodes)>

■ **? Data Cloud Systems [Agr 10/11/12, Chaud 2012, Sto 10 ]**

# Main Problems of Data Management [Ozsu 11, Sto 98, ...]

- **Data Modelling & Semantic**
- **Query Processing & Optimization**
- **Concurrency Control (Transactions)**
- **Replication & Caching**
- **Cost Models**
- **Security and Reliability Issues**
- **Monitoring Services**
- **Resource Discovery**
- **Autonomic Data Management (self-tuning, self-repairing, ...), ...**
- ...

**→ Evolution of Query Processing & Optimization Methods**

# 0.1 File Management Systems FMS (1)

## ■ File Concept

➔ Program and Storage Device Independence

[Storage] <File> [Program/Application]

▶ File Management System

## ■ File Organization: 4 types

- < Sequential /Indexed > Organization
- < Hashing/Relative > Organization

## 0.2 File Management Systems (2)

### ■ Access Methods AM

- Sequential AM
- Key AM := <Indexed/Hashing> AM

### ■ Drawbacks of FMS

- Data description must be done in each program
- Relationships between files are materialized (New Files)
  - ▶ Software Eng. Requirements

### ➔ Database Concept

- ▶ **Data Independence** : <Physical & Logical> Indep.

# 1.1 Database DB and DBMS

## ■ Concept of Database DB: Main Characteristics

- **Structured Data: Data Model Definition**
  - ➔ Hierarchical/Network/Object/**Relational** Model
- **Stored Data on Disk: I/O Management**
  - ➔ Query Processing & **Optimization**
- **Shared Data: Concurrency Control (Transactions, ...)**

## ■ Data Model DM:

- What is the **Objective** of a DM?
- What is the **Wealth** of a DM?

➔ **Relational DBMS** [Codd 70]

# 1.2 Uni-proc. Relational DBMS

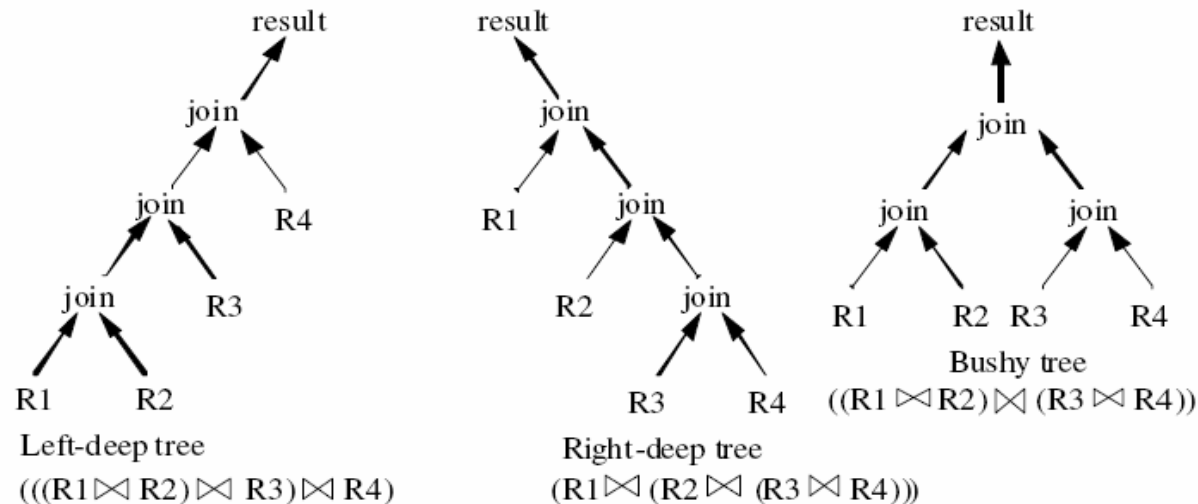
## ■ Relational Languages

- **Relational Algebra RA [Codd 72]: Basic Operations & Additional Operations**
- **Fundamental Characteristics of RA:**
  - **Internal Law:**  $\text{Op}_i (R_i, [R_j]) = \text{Relation} \rightarrow \text{Querying Language}$
  - **Commutative:**  $R_1 \times R_2 = R_2 \times R_1$  ;  $SJ = JS$
- **Algebraic Language/Rel. Algeb. Expression:**  $P(S(J(\text{Emp}, \text{Dept}, \text{⌚}), c1), \text{attr})$
- **Declaratives Languages:** SQL [Cham 76], QUEL [Sto 76], QBE [Zlo 77]
  - ◆ Specify “What do you want” ?
  - ◆ Without to specify “How to obtain the result” ?
    - ▶ The System will find the **Optimal Access Path**
    - ➔ **Optimizer**

# 1.3 Uni-proc. Rel. DBMS: Query Processing

## ■ SQL Query Processing Phases

- **Decomposition:** Syntax, Semantic, Authorization Control by using **Metadata**
  - ➔ Algebraic Tree\*
- **Optimization:** Generating an *Optimal Execution Plan* by using a *Cost Model*
- **Execution**
  - ➔ **Query Optimization Problem ?**
- **Nature of execution plans (Data Structures):** {LDT, RDT, BT}





## 1.4 Uni-proc. Rel. DBMS: Query Optimization [Sel 79, Wong 76]

### ■ Problem Position [Gan 92]:

$q \in \text{Query}$  ,  $p \in \{\text{Execution Plans}\}$ ,  $\text{Cost}_p(q)$ :

- Find  $p$  calculating  $q$  such as  $\text{Cost}_p(q)$  is minimum
- Objective : Find the best trade-off between  
Min (Response Time) et Min (Optimization Cost)

### ■ Optimizer Structure= $\langle Sp, C, St \rangle$ [Gan 92]

- **Sp: Search Space**
  - Data Structures: Linear Spaces, Bushy Space
  - Type/Nature of Queries
- **C: Cost Model**
  - $\langle \text{Metrics, System Environment Description} \rangle$
- **St: Search Strategies**
  - $\langle \text{Physical Optim., Parallelization, Global Optim., ...} \rangle$

## 1.5 Uni-proc. Rel. DBMS (1) : Query Optimization Methods

### ■ Optimization Process

- **Logical Optimization: Rewriting of Algebraic Tree**
- **Physical Optimization [Swa 88, Ioa 89, Lan 91, ...]: Scheduling of Joins**
  - S1: Choice of appropriate algorithms for each relational operator**
  - S2: Scheduling of Joins: 2 Main Approaches**
    - **Enumerative Search Approach: <Breadth-First, Depth-First>**
    - **Random Search Approach: <Iterative Improvement, Simulated Annealing>**
- **Comparative Studies: intra-approach & inter-approach [Swa 89, Lan 91, ...]**
  - ➔ **Advantages & Drawbacks : <Type of Queries, Size of Search Space>**
    - **Response Time (Optimal Execution Plan)**
    - **Optimization Cost**

## 1.6 Uni-proc. Rel. DBMS : Query Optimization Methods

### ■ Limitations of (Uni-processor) Query Optimization Methods wrt <Decision Support Systems>

- Complex Queries: *Number of Joins >6 ?*
- Size of Research Space [Tan 91]: *Very Large (e.g.  $2^{N-1}$ )*
- Optimization Cost: *can be very expansive*
- Optimal Execution Plan: *not guaranteed*
  - ➔ Requirement in **High Performance HP** (e.g. Response Time)
  - ➔ Introducing a **New Dimension:**  
Parallelism (Mutli-processor Architecture)

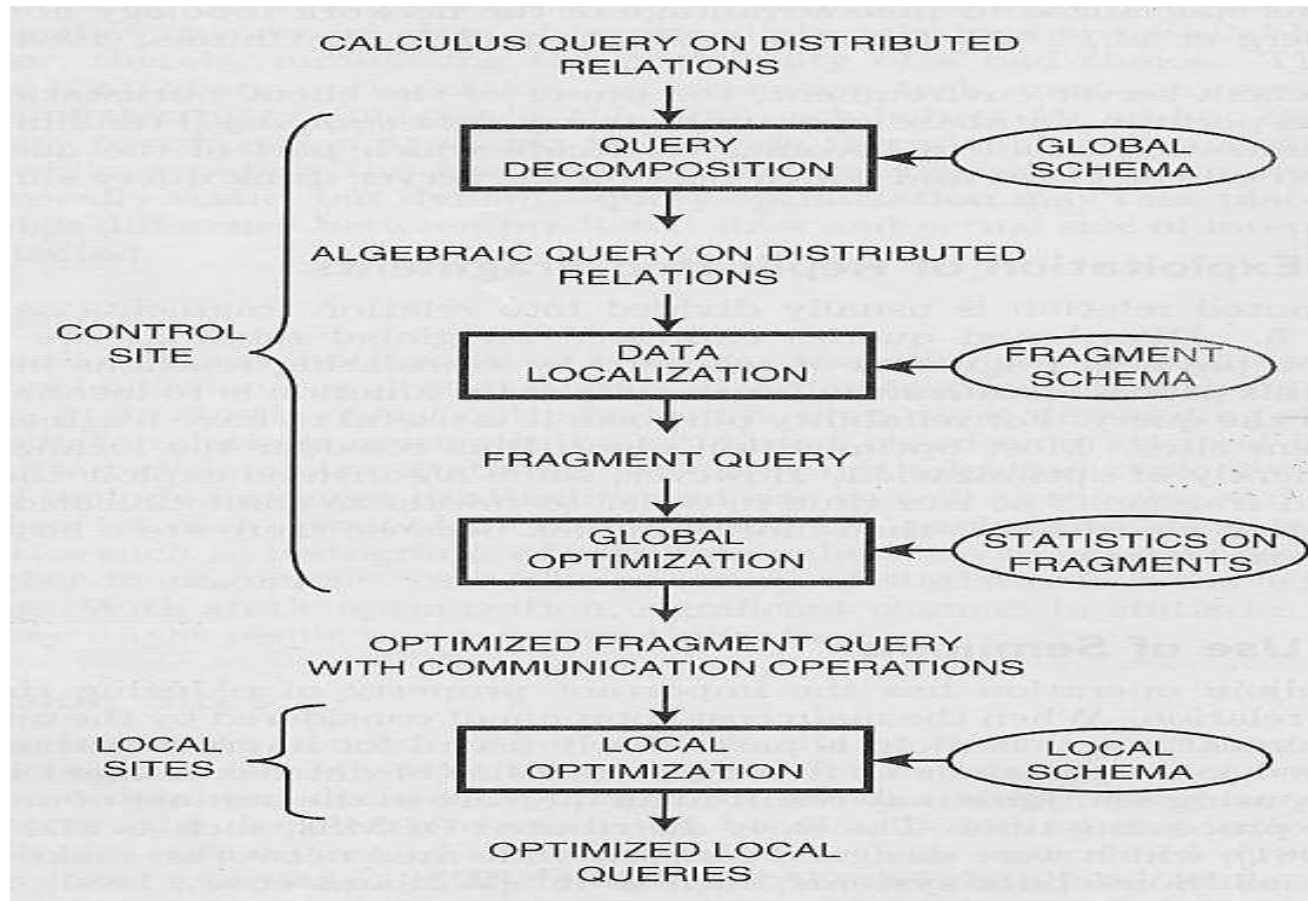


## 2. Parallel Relational DB Systems

### 3. Distributed DB & Distributed Query Processing DQP (1)

Objective : **Location/Fragmentation/Replication Transparency**

**Principle of DQP [Ozsu & P. Vald. 11]**



## 3.1 Dist. Query Processing (1): Principles [Kos 00, Ozu 11, Sto 96]

### ■ Data Localization:

- Fragmentation of Relations: Horizontal, Vertical, Hybrid
  - Location sites
  - Replication sites
- ▶ How can we choose a relevant fragmentation strategy?

### ■ Data Dictionary (Meta-data on DDB):

<Centralized, Replicated, Distributed>

### ■ Fragment Allocation : $\text{Alloc} : F \rightarrow S / \forall f \in F, \exists s \in S, \text{Alloc}(f) = s$

- ▶ What are the main parameters which impact on "Alloc" function?

## 3.2 Dist. Query Processing & Optimization: Principles [Kos 00, Ozu 11, Sto 96]

### ■ Distributed Join Algorithms [Chiu 81, Val 81/84]:

- **Direct Join:** R(Site1) Join S (Site2); **Transfer the smaller relation**
- **Semi-Join based Join:** = <Project; Semi-Join; Join>

➔ **Reducing Communication Costs**

### ■ Global Optimization

- *Determining the optimal execution site* for each local sub-query considering data replication
- *Scheduling of inter-site operators* minimizing a cost function

$$F = (\text{CPU} + \text{I/O}) + \underline{\text{Comm}}$$

➔ **Reducing the Data Volumes Exchanged on the Network**

### ■ Local Optimization

- **Physical Optimization (Uni-processor Env.)**
- **Parallelization (Parallel Env.)**

## 3.3 Distributed Query Optimization : Methods

- **Static Methods** [Ber 81, <Loh 85, Mac 86>, Sto 96]: SDD-1, R\*, **Mariposa**
  - ▶ **Optimization of Inter-site comm. costs: <Direct Join, Semi-join based Join>**
    - **Direct Join: → Minimizing the Data Volume Transferred Between 2 Sites**
    - **Semi-Join based Join : → Reducing Communication Costs**
      - + **Flexibility to Optimizers**
      - **Increasing : <Size of Search Space & Local Processing Cost>**
  - ▼ **Strong Assumption (Cost Models) : Uniformity of Processors and Network**
- ▶ **Mariposa DDBMS [Sto 96]: Economic Model based on "Bid" Principle**
  1. **Each Q decomposed into  $SQ_1, SQ_2, \dots, SQ_n$**
  2. **For each  $SQ_i$  ( $i= 1..n$ )  $\rightarrow \{C_{i1}, C_{i2}, \dots, C_{ij}\}$  from j sites**
  3. **The broker notifies the **winner site****
    - **based on the **local Cost Models****
    - **Heterogeneity : Processors & Workload**
- **Dynamic Methods** [Evren 97, Ozcan 97] → [Kab 98]

## 3.4 From Heterogeneous Dist. DB to Data Integration Systems (through Federated DB)

### ■ Heterogeneity

- Models ==> Pivot Model (e.g. Relational Model)
- Semantic Conflicts (Integration of DB Schemes)
- Servers (e.g. local DBMS, Processors, ...)

### ■ Autonomy of Data Sources

#### ▶ New requirements regarding to Data Sources

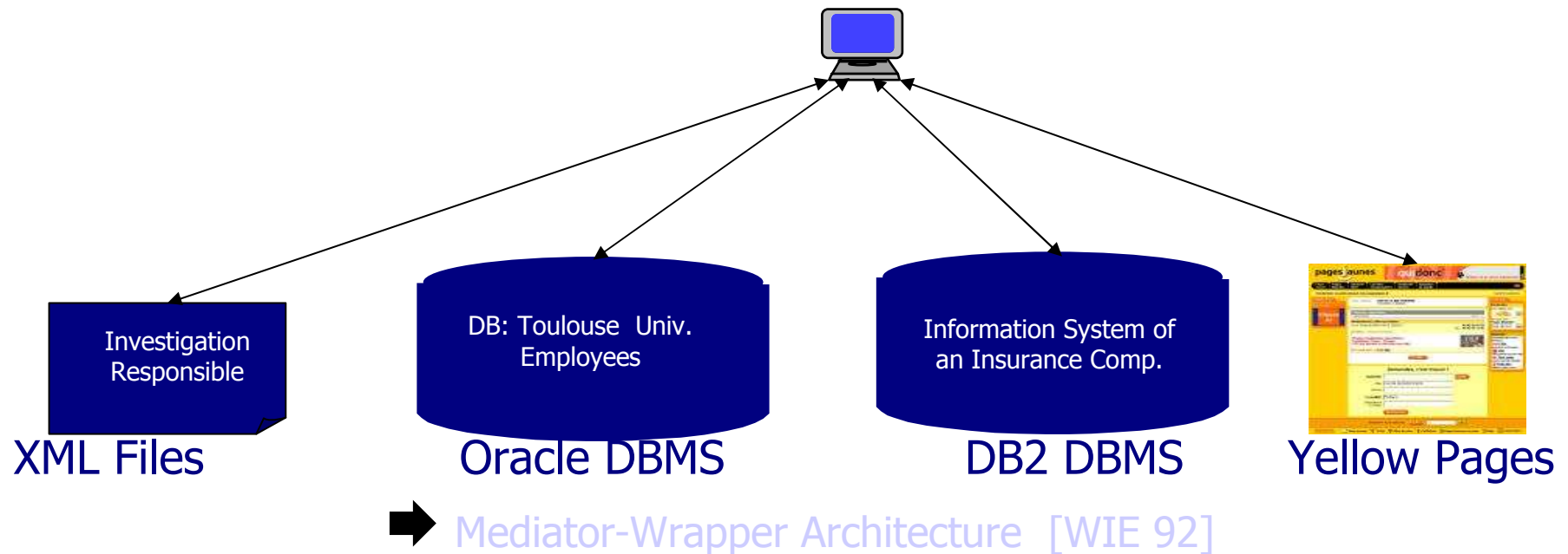
- Data Sources can be structured in **different models** (Autonomy!)  
<Files, XML Files, Relational DB, Object BD, ...>

➔ **Virtual Data Integration Systems: Mediator-Wrappers** [Wied 92]

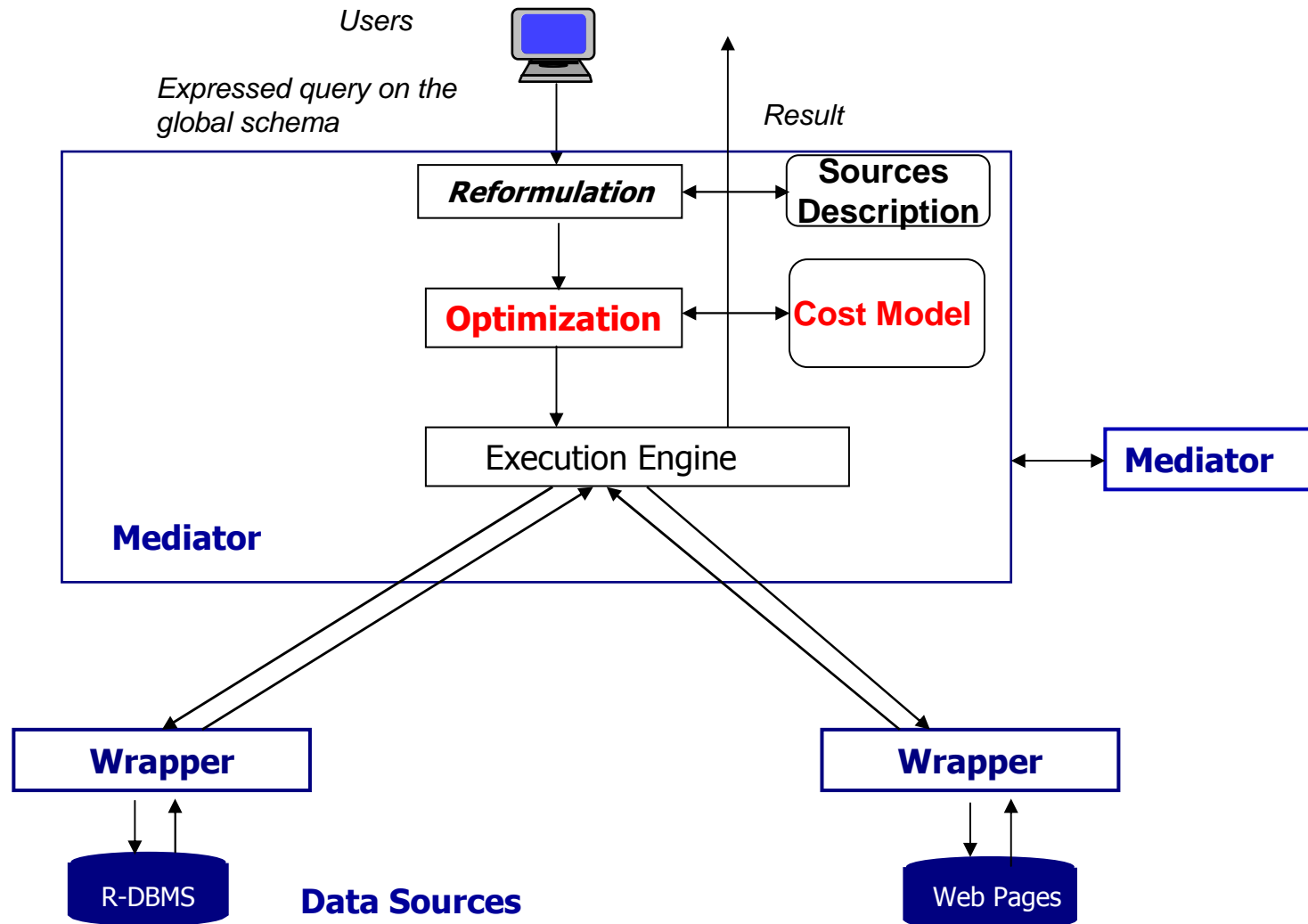


## 4.1 Data Integration System DIS (1)

- **Requirement:** Data Integration arising from Several Sources
- **Characteristics:** <Distribution, Heterogeneity, **Autonomy**>
- **Objectives:** Efficient, Transparent & **Uniform Access to Data Sources**



## 4.1 Data Integration System DIS (2): Query Processing Steps



## 4.1 DIS (2): Query Processing & Special Operator

### ■ Main DIS:

- Tukwila [Ive 99,], Tsimmis [Raj 95], Garlic [IBM, Haas 97], Disco [Tom 98], Le Select & Agora [Man 01], Piazza\* [Hal 04], ...
- Information Integrator (IBM), OLE-DB-Net (MS)

### ■ Restricted Data Sources & DJ Operator

→ **New operator has been introduced** [Gol 00, Man 02]

**Dependent Join Operator:** 

$$DAccess(R(X^b, Y^f)) \chi = \sigma X \in \chi(R(X, Y))$$

$$T \leftarrow \text{Scan}(R1(U^f, V^f)) \xrightarrow[V=X]{\text{DJ}} DAccess(R2(X^b, Y^f)).$$

- **Asymmetric Nature:** → **Search Space is Reduced**
- **Problem to Capture Valid Execution Plans** [Man 02, Yerneni 99]

### ■ Query Optimization Methods in DIS [Ams 98, Iv 99, Av 00, Arc 04, Oza 05, ...]

## 4.2 Query Optimization Methods

### ■ Type of Query Optimization Methods [Cole 94]: <Static, **Dynamic**>

#### ▶ Principle of **Dynamic Query Optimization** [Hel 00]:

**S1:** Sub-optimality **Detection** of execution plans

**S2:** **Modification** of Sub-optimal Exec. Plans

**S3:** Repeat **S1 & S2**

## 4.3 Dynamic Query Optimization: a State of the Art

### ► Characteristics of Dynamic Query Optimization

- **Environment:** **uni-processor, Parallel** [Bru 97, Hon 92], **Distributed** [Bou 00, Ive 04], **Large Scale** [Jon 97, Arc 04, Oza 05, Gou 05/09, Da Sil 06, Liu 08,...]
  - **Type of Event:** **Estimation Errors** [Bru 97, Kab 98], **Delays in Data Arrivals Rates** [Ams 98, Bou 00]
  - **Modification Types:** **Re-optimization** [Bab 05, Bou 00], **Re-scheduling** [Ozc 97]
  - **Modification Level:** **Intra-operator** [Des 03], **inter-operator** [Ams 98]
  - **Nature of Decision-making: (by the Optimizer)**
    - ➔ **Centralized Control** [Kab 98, Ams 00, Bou 00, Mar 04, Da Sil 06, ...]:  
**Unique Process (Optimizer) is charged to supervise, detect, and modify an execution plan**
    - ➔ **Decentralized Control** [Ive 99, Urh 00/01, Jon 97, Arc04, Oza 05, Erg 07, ...]:  
**Detection & modification are made by Several Process**
- ➔ <Large Scale Env., Nature of Decision Made by the Optimizer>

## 4.4 Dynamic Query Optimisation Methods in DIS (3) :

[Am 98, Iv 99, Av 00, Urh 00/01/, Arc 04, Oza 05, ....]

### ■ Large Scale Environment

- High number of data sources, users, & computing resources: <Distributed, Heterogeneous, Autonomous>
- Low bandwidth and strong latency ( → bottleneck)
- Huge volume of data (GB → PB)

### ■ Nature of Decision-making: (by the Optimizer)

- **Centralized Control** : Unique Process (Optimizer) is charged to supervise, detect, modify an execution plan
- **Decentralized Control** : detection & modification by several process

## 4.5 Dynamic Query Optimization Methods in DIS (1)

### ■ Why dynamic strategies have been decentralized?

- Reducing Delays in Data Arrival Rates [Ams 98, Ive 99]

Two events are possible:

- Initial delay before the arrival of the first tuple
- Bursty arrival: the data arrive in bursts

- Reducing Network Traffic: **Distant** Interactions → **Local** Interactions

- + Large Scale Environment

➔ Bottleneck (**Huge** Volume of Data, **Low** Bandwidth and **Strong** Latency of Network, **High** Number of Users/Nodes)

➔ Minimizing the number of control messages

## 4.5 Dynamic Query Optimization Methods in DIS (2)

### ■ Why Dynamic Strategies (// & Dist. ) do not Scale?

- **Centralization of the Decision** (made by the optimizer): ➔ **Bottleneck**
- **Inaccuracy & Obsolescence of Estimations:**  
<Statistics, Predicate selectivity, Cost of Operators>
- **Unavailability of Resources:** = <{CPU, Mem., Network, Data Sources}>  
{Overloading Site, Complex Sub-query, PB with Net.: Comm. Or Bandwidth}

➔ <Decentralized, ➔Scalable>

### ▶ What are the Advantages of Mobiles Agents in Dynamic Query Optimization?

[Jo 97, Arc 04, Oza 05, Mor 10, ...]



## 4.6 Summary of Dynamic Query Optimization Methods in DIS

Nature of Decision-making → Motivation & Context ⇒	Centralized Control	<u>Decentralized Control</u>
<b>Reducing Delays in Data Arrival Rates</b>	Inter-op.: [Ams 98, Bou 00] Intra-op. : [Av00/Eddies; Ive04]	Intra-op.: [Iv99; Tukwila/DHJ] [Urh 00/01, XJoin]
<b>Large Scale</b>	X?	<u>Mobile Agents:</u> Inter-op. : [Jones 97] Intra-op.: [Arc 04, Oza05, ...]

**Nature of Decision-making: Centralized/decentralized Control**  
**Motivations : Reducing Delays in Data Arrival Rates; Large Scale,**  
**Modification Level: Intra-operator, Inter-operator**

## 4.7 From Data Integration Systems **DIS** to **Data Grid Systems**

- **Characteristics of DIS: <Distribution, Heterogeneity, Autonomy>**

- **DIS have been Extended to Large Scale LS Environment**

- **Assumption: Stability of Systems (from Uni-proc DBMS to LSDIS)**

- ▶ **Strong Assumption in a Large Scale Env.**

- ➔ **Constraint: Unstability of Systems US ("Dynamicity" of Nodes)**

- ▶ **A node can join, leave or fail at any time**

- ➔ **Characteristics of New Systems : < Dist. , Hete., Autono., **LS, US**>**

- ➔ **Grid Systems**

## 5. Grid Systems: Definition, Charact. & Evolution

### ■ Grid Systems GS [Fos 04]:

1. "Coordinated Distributed Computing Infrastructure"
2. "Resource sharing & coordinated problem solving in dynamic, multi-institutional virtual organizations"

#### ▶ Distributed Systems with **2 Characteristics**:

- **Large Scale** (including: <Autonomy, Heterogeneity>)
- **Unstability of Systems** ("Dynamics" of Nodes)

➡ Exploiting of Available Resources:

< CPU, Memory, Network & I/O Bandwidth, Data Sources, Services >

### ■ Evolution: From Grid Systems ➡ Data/DB Grid Systems [Taniar et al. 2008]

➔ New Problems of Data Management in GS [Pac 07]

## 5.1 Data Management DM in GS (1): Main Problems

### ■ Main Problems of Data Management in GS [Pac 07]

- Resource Discovery & Selection
- Query Processing & Optimization
- Monitoring Services
- Replications & Caching
- Cost Models
- Autonomic Data Management (self-tuning, self-repairing, ...)
- Security Issues, ...

→ Focus on Query Processing & Optimization

## 5.2 Data Management in GS (2): Distributed Query Optimization

### ■ Limitations of Dyn. Opt. Methods Developed in //, Dist. , DIS Systems:

- Large Scale: → Decentralized Control
  - +[Self-adaptable] : based on Paradigm of Mobile Agents
- “Dynamicity” of Nodes (Unstable System):
  - Insure a Permanent Access to Resources

### ■ Challenges:

- Extend or design new: approaches and methods
- Characteristics of proposed methods:
  - <Dynamic, Efficient, Scalable, Self-adaptable>
- Development of large scale experimental platforms
  - Validation
  - Learning lessons

## 5.3 Dynamic Query Optimization in Data Grid Systems (1)

[Gou 04a/04b/06, Cyb05, Bose 07, Da Sil 06/Porto 06, Liu 08, Soe 05, ...]

■ **Context:** = <Large Scale, Unstable> + <Heterogeneity, Autonomy>

**Heterogeneity of resources** (CPU, Mem., Bandwidth Net. & I/O, Data sources)

■ **2 Approaches based on :**

**1. Extended "Classic" Approach: using Global Cost Model)**

**2. Incentive-based Approach (Eco. & Reputation): using Local Cost Models**

■ **Objective of Methods**

- Efficient Resource Allocation/Scheduling Methods
- Integration of Parallelism Dimension
- Heterogeneity consideration

■ **Constraint of Proposed Methods:**

- Forms of parallelism: {Partitioned, Independent, Pipelined Parallelism}
- Communication Cost and Load balancing

➔ **Challenge:** In this context, how can we describe a **Cost Model** ?

## 5.3 Dynamic Query Optimization in Data Grid Systems (2)

- **Challenge** : How can we describe accurately the system environment in a such context?
  - ▶ The quality of the predictability of virtual/physical resources has a strong impact on the decision made by the optimizers
- **Context**: = <Large Scale, Unstable> + <Heterogeneity, Autonomy>
- **System Env.** = <Profile of Sources, Charact. of CR, Cost Formula>
  - ➔ Difficult to obtain statistics and relevant info. on resources
  - ➔ Definition and Validation of Cost Formula
    - Large Scale: Obsolescence of Values
    - Heterogeneity of Data Sources and Nodes → Inaccuracy of Estimations
    - Autonomy of Data Sources → do not export all statistics

## 6. Cloud Computing/Systems & Data Management (1)

[Ston 10, Agr 10/11, Chaud 12, Zhou 12, Kald 12, ...]

- **Main Characteristics of Cloud [D. Agrawal et al. 2011]**
- **Data Management in the Cloud: Main Problems [Chaud 2012]**
- **“Hot Debate” on: MapReduce **versus** Parallel DBMS: friends or foes**  
[M. Stonebraker et al., 2010, D. Agrawal et al. 2010, S. Chaudhuri 2012 ]
- **“Reconciling Debate” [Zhou 2012, Kaldewey et al. 2012/EDBT]**  
**“SCOPE : Parallel Databases **Meet** MapReduce”**  
[Zhou et al. June 2012, VLDB Journal]



## 6.1 Main Characteristics of the Cloud [Agrawal et al. 2011]

- **Scalability**

- **Elasticity [Ozu 11]**

  - « The ability to scale resources out, up, and down dynamically to accommodate changing conditions »

- **Fault-Tolerance**

- **Self-Manageability: Self-Tuning, Self-Repairing**

- **Ability to run on Commodity Hardware**

## 6.2 Data Management in the Cloud: Main Problems [Chaud 2012]

- **Data Privacy: <Access Control, Auditing, Statistical Privacy)**
  - **Approximate Results**
  - **Query Optimization (mainly from MR heritage)**
    - **Optimization of User-Functions ?**
    - **Difficult to Construct Statistics on Volatile Data**
    - **Extensive Materialization (I/O)**
    - **Data Redistribution**
  - **Performance Isolation for Multi-tenancy**
- .....

## 6.3 Hot Debate: **MR versus // DBMS**

### ■ **“MapReduce and Parallel DBMSs: friends or foes?”**

[Stonebraker et al. 2010 Com of the ACM, Jan. 2010, Vol 3. No. 1]

◆ The performance results (between Hadoop (MR) and 2 // DBMSs ) show that the **DBMSs are substantially faster than the MR system once the data is loaded.**

➔ Conclusion: **“MR complements DBMSs since DB are not designed for ETL Extraction-Transform –Load tasks, a MR specialty ”**

### ■ **“Big Data and Cloud Computing: New Wine or just New Bottles?”**

[Agrawal 2010 et al. , Univ of California/SB] VLDB'2010 Tutorial

### ■ **“An Interview with S. Chaudhuri”;** [Sept. 2012, XRD, Vol. 19, No. 1]

**“If I were to look at recent research publications, a disproportionately large fraction of them are focused on solving for MapReduce platforms the same problems we addressed for parallel database systems. We can and should do much more.”**

## 6.4 Reconciling Debate (1) [Zhou 2012, VLDB Journal, Kald 2012] "SCOPE: Parallel (//) Databases meet MapReduce"

### ■ Objectives : combines benefits from execution engines

- **Parallel DB Systems**

&

→ for Large Scale Data Analysis

- **MapReduce**

→ <Easy Programmability, Massive Scalability, HP (adv. Optimization)>

### ■ Advantages of // DB Systems

- Relational Schema
- Declarative Query Lang.
- Sophisticated Query Optimizers {Partitioned, Independent, Pipelined //}

### ■ Weakness of // DB Systems (in Massive Large Scale):

- Run only on expensive Servers
- Fault – Tolerance (in the case of massive // DB)
- Web Data Sets are not structured
- Communication Costs : Redistribution of Data

## 6.4 Reconciling Debate (2) [Zhou 2012, VLDB Journal, Kalde 2012]

“SCOPE: Parallel Databases **meet** MapReduce”, MS

“Clydesdale: Structured Data Processing on MapReduce”, IBM & Google

### ■ Advantages of MR

- Scaling Very Well (to massive data sets)
- Fault - Tolerance
- Mechanism to achieve Load-Balancing
- Support the Parallelism

### ■ Weakness of MR: Side Applications

Users :

- Are forced to translate their business logic to MR model
- Have to provide implementation for the M & R functions
- Have to give the best scheduling of M & R operations
- + Data Dependence
- + Extensive Materialization (I/O)

### ■ SCOPE Proposals (Structured Computations Optimized for Parallel Execution)?

## **6.4 Reconciling Debate (3) [Zhou 2012, VLDB Journal; ]** **“SCOPE: Parallel (//) Databases meet MapReduce”**

### **SCOPE Proposals :**

- ◆ **SCOPE uses MapReduce as Target Language**
- ◆ **Data Representation: Structured Streams and Unstructured Streams**
- ◆ **Query Language (DDL, ML) : Declarative Scripting Language (close to SQL)**
  - **Specific operators (close to Wrapper in DIS)**
    - ➔ **Data Independence (main Objective of DB!)**
  - **SQL-like extensions (Relational Operators + Aggregate Functions)**
- ◆ **Cost-based Optimizer (with few statistics!; Opp. Rule-based Optimizer)**
  
- ◆ **Fault-Tolerance (MR)**
- ◆ **Load-Balancing (MR)**
- ◆ **- Extensive Materialization (MR)**

## 7. Summary & Conclusion

### Evolution of Data Management Systems

- **File Management Systems:** *Storage Device Independence*
- **Uni-processor Rel. DB Systems DBMS [Codd 70]:** *Data Independence*
- **Parallel DBMS [Dew 92, Val 93]:** *High Performance & Data Availability*
- **Distributed DBMS [Ozs 11]:** *Location/Frag./Replication Transparency*
- **Data Integration Systems [Wie 92]:** *Uniform Access to Data Sources*  
Characteristics = **<Distribution, Heterogeneity, Autonomy>**  
➔ **<Stable Systems, Not Scalable>**
- **Data Grid Systems [Fos 04, Pac 07]:** *Exploiting of Available Resources =*  
**<Computing Resources CR, Data Sources, Services>**  
Characteristics = **<Large-scale, Unstable Systems (Dynamics of Nodes)>**
- **? Data Cloud Systems:** *Elasticity, HP Isolation*  
[Sto 10, Agr 10/11/12, Chaud 12, Kald 12, Zhou 12,... ]:

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