

### Querying Heterogeneous Information Sources Using Source Descriptions

Alon Y. Levy – AT&T Laboratories Anand Rajaraman – Stanford University Joann J. Ordille – Bell Labs

Presentation By: Mirza Beg



#### Outline

- Problem Description
- Proposed System
- System Architecture
- Description of System Modules
- Algorithms
- o Experiments & Results
- Discussion



### • • • | Problem Statement

- o Increasing number of structured data sources
- Interrelated data
- The user interacts with each information source separately and combine data!

#### Alternatively:

How do we extract the relevant data for a given query?

### • • Solution

#### A System that:

- Provides a uniform query interface to distributed structured sources
- Uses source descriptions to describe data sources
- Generates executable query plans
- Returns the merged result set to the user

INFORMATION MANIFOLD

# Information Manifold Architecture Value of the Control of the Con

### Information Manifold World View

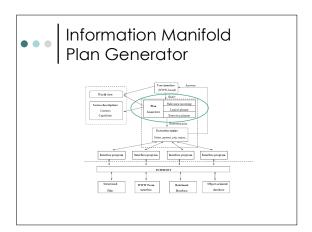
 A virtual global schema on which the user can pose queries

# Information Manifold Source Descriptions West for West f

## Source 1: Used cars for sale. Accepts as input a category or model of car, and optionally a price range and a year range. For each car that satisfies the conditions, gives model, year, price, and seller contact information. Source 2: Loury cars for sale. All cars in this database are priced above \$30,000 Accepts as input a category of car and an optional price range. For each car that satisfies the conditions, gives model, year, price, and seller contact information. Source 3: Vintage cars for sale (cars remanfactured before 1950). Accepts as input a model and an optional year range. Gives model, year, price, and seller contact information for qualifying cars. Source 4: Motorcycles for sale. Accepts as input a model and an optional price range. Gives model, year, price, and seller contact information. Source 5: Car reviews database. Contains reviews for cars manufactured after 1990. Accepts as input a model and a year. Output is a car review for that model and year.

• • •	Content Records of Auto Sources				
	Source 1: Used cars for sale. $Contents: V_1(c) \subseteq CarForSule(c), UsedCar(c)$				
	Source 2: Luxury cars for sale. All cars in this database are priced above \$20,000 Coatents: $V_2(c) \subseteq CarForSule(c), Price(c, p), p \ge 20000$				
	Source 3: Vintage cars for sale (cars manufactured before 1950). Contents: $V_0(c) \subseteq CarForSule(c)$ , $Year(c,y)$ , $y \le 1950$				
	Source 4: Motorcycles for sale. Contents: $V_4(c) \subseteq Motorcycle(c)$				
	Source 5: Car reviews database. Contains reviews for cars manufactured after 1990. Contents: $V_3(m, y, r) \subseteq Car(c)$ , $Model(c, m)$ , $Year(c, y)$ , $ProductReview(m, y, r)$				

# Capability Records of Auto Sources Desired Inputs Possible Outputs Source 1: Used care for sale Capabilities: (Model(c), Catagoory(c), Year(a), Price(c), SellerContact(c)) Tour(a), Price(c), 1:1, 18. Source 3: Usuary care for sale. All care in this database are priced above \$20,000 Capabilities: ((Model(c), Catagoory(c)), (Model(c), Catagoory(c), Year(c), Price(c), SellerContact(c)), (Price(c)), 1:3) Source 3: Vintage care for sale (care manufactured before 1950). Capabilities: ((Model(c)), (Model(c), Catagoory(c), Year(c), Price(c), SellerContact(c)), (Price(c)), 1:2) Source 4: Motorcycles for sale. Capabilities: ((Model(c)), (Model(c), Viar(c), Price(c), SellerContact(c)), (Price(c)), 1:2) Source 5: Car reviews database. Contains reviews for care manufactured after 1990. Capabilities: ((m, y), (m, y, r), (), 2.2)



## Query Reformulation Steps $Q(\overline{X}) \leftarrow R_1(\overline{Z}_1), \dots, R_n(\overline{Z}_n), C_Q$ • Prune irrelevant sources • Split query into sub goals • Generate conjunctive query plans • Find an executable ordering of sub goals

## Algorithm CreateBuckets(V,Q) Inputs: V is a set of content descriptions, and Q is a conjunctive query of the form Q:Q(X) ← R(X), ..., Rm(X\_a), C\_Q. Set Bucket, to B for 1 ≤ i ≤ m. For i= 1, ..., u do: For each V ∈ V For j= 1, ..., u, do: V(Y) ⊆ S(Y), ..., S(Y), C ∨ For j = 1, ..., u do: V(Y) ⊆ S(Y), ..., S(Y), C ∨ For j = 1, ..., u do: If y is the f'th variable in Y j and y ∈ Y then ψ(y) = xj, where xj is the j'th variable in X<sub>i</sub>, else ψ(y) is a new variable that does not appear in Q or V. Let Q' be the 0-ary query: Q' ← R(X), ..., Rm(X\_a), C<sub>Q</sub>, S<sub>1</sub>(ψ(Y)), ..., S<sub>n</sub>(ψ(Y\_a)), ψ(Cv) If Satisfiable(Q) then add ψ(V) to Bucket. End.

### • • • Step 1. Bucket Algorithm

Given a query Q:

- Find a relevant source
- o Create a bucket for this sub-goal
- Check source for Satisfiability
- Add information source to bucket for this sub-goal

### Example: Contents and Capabilities

Source 1: Used cars for sale. Contents:  $V_i(c) \le Car Poins de(c), IredCar(c)$  Contents:  $V_i(c) \le Car Poins de(c), IredCar(c)$  Contents:  $V_i(c) \le Car Poins de(c), IredCar(c)$  Combibilities:  $(V_i(c), Price(c)), 1.4$  Source 2: Loung car for sale. All cars in this database are priced above \$20,000 Contents:  $V_i(c) \le Car Poins de(c), Price(c, p), p \ge 20000$  Contents:  $V_i(c) \le Car Poins de(c), Price(c, p), p \ge 20000$  (Apabellities:  $(V_i(c), Price(c)), Ideal(c), Category(c), Var(c), Price(c), SellerContent(c), Price(c), Var(c), Price(c), Car Poins de(c), Var(c), p \ge 1500$  Capabilities:  $(V_i(bold(c)), (V_i(bold(c), Category(c), Var(c), Price(c), SellerContent(c)), (Price(c)), Source 2: Motorcycle for sale. Contents: <math>V_i(c), V_i(c), V_i(c$ 

### Bucket Algorithm: Example

 $\begin{array}{lcl} q(m_1,p_1,r_1) & \leftarrow & CarForSale(c_1), Category(c_1, \mathsf{sportscar}), \ Year(c_1,y_1), \ y \geq \mathsf{1992}, \\ & Price(c_1,p_1), Model(c_1,m_1), ProductReview(m_1,y_1,r_1) \end{array}$ 

 $V_1'(m,t,y,p,s) \subseteq CarForSale(c), \ UsedCar(c), \ Model(c,m), \ Category(c,t), \ Year(c,y), \\ Price(c,p), \ SellerContact(c,s)$ 

find the mapping  $c \to c_1$ 

 $\begin{aligned} &CarForSale(e_1),\ Category(e_1, spottscar),\ Year(e_1,y_1),\ y_1 \geq 1992,\\ &Price(e_1,p_1),\ Model(e_1,m_1),\ ProductReview(m_1,y_1,r_1),\ UsedCar(e_1),\ SellerContact(e_1,s) \end{aligned}$ 

Source 1 is added to bucket<sub>1</sub> Source 2 is added to bucket<sub>2</sub>

Source 3 does not get added because  $(y \le 1950, y \ge 1992)$  is not satisfiable.

### Step 2. Finding an Executable Ordering

 Considering all possible combinations of information sources, enumerate semantically correct plans

## Step 2. Algorithm for finding an Executable Ordering

- Maintain a list of available parameters
- At every point add to the ordering any sub-goal whose input requirements are satisfied
- Push as many selections as possible to the sources

## Step 3. Checking Containment

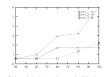
 Minimize each plan by removing redundant sub-goals

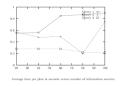
### Experimental Results

Query	Number of	Max. bucket	Plans	Plans	Time per	Total time
	sources	size	enumerated	generated	plan (sec.)	(sec.)
1	20	1	7	1	0.55	0.55
	40	1	7	1	0.56	0.56
	60	2	26	2	0.85	1.70
	80	2	26	2	0.85	1.70
	100	2	26	2	0.85	1.70
2	20	2	7	1	0.57	0.57
	40	3	11	2	0.48	0.96
	60	5	35	6	0.49	2.95
	80	6	44	8	0.40	3.20
	100	7	72	8	0.75	6.00
3	20	2	8	2	0.28	0.56
	40	2	8	2	0.28	0.56
	60	2	8	2	0.28	0.56
	80	6	49	6	0.22	1.32
	100	10	120	10	0.22	2.20

Query 1: Find titles and years of movies featuring Tom Hanks Query 2: Find titles and reviews of movies featuring Tom Hanks Query 3: Find telephone number(s) for Alaska Airlines

## Experimental Results (cont.)





### • • Conclusions • A novel system that provides a DBlike query interface to distributed structured information sources • Frees the user from interacting with each information source individually • Integrates data from multiple sources and filters information o Information Manifold applicable to WWW and company-wide d-DB's Open Questions How to automatically extract contents and capabilities from sources? • Are there better algorithms to determine the relevant sources? Scalability? • Overall Performance issues ? Discussion Points • A foundational paper in web-data mining.

Substantial impact on current

 Contents & capabilities at the core of the system yet no proposed

• Experiments carried out on a very

integration systems.

generation algorithm.

small set of queries.

• • • Questions ?	-
Ś	