



Machine Learning supported Integration of heterogenous Database Eco-Systems

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Master thesis presentation
Summer 2022
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Prof. Dr. Karabatis

Technology
Arts Sciences
TH Köln



Content

1. Problem Statement
2. Related Work
3. Inteplato
4. Performance Evaluation
5. Conclusion
6. Limitations and Future Work

Problem Statement

"Just because different pieces of data share the same syntax does not mean that they are automatically interoperable." - Pollock and Hodgson (2004)

Data Discovery

- Growth of data
- Domain-independent consolidation
- Heterogeneous architectures
- Limited human resources

Technical

- Schematic and semantic conflicts
- Scalable algorithms $O(N^N) \rightarrow O(2N)$
- Human-in-the-loop

Related Work in DI: schema mapping

Driven by DWH, MDM, Semantic Web and Big Data Vs

Machine Learning

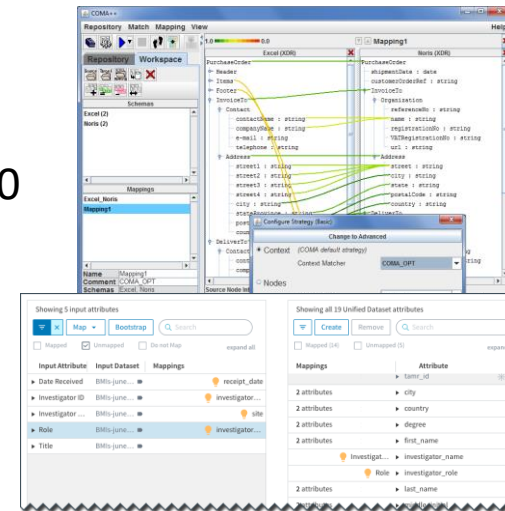
- Labeled data through unsupervised methods
- Instance transformation capabilities
- Meta / instance multi-dimensional representations
- Learn schema mapping, duplicate detection, and data fusion jointly
- Neural network sceptis

Existing Applications

- Yearly benchmark challenges drive new algorithms but **less applications**

• COMA 3.0

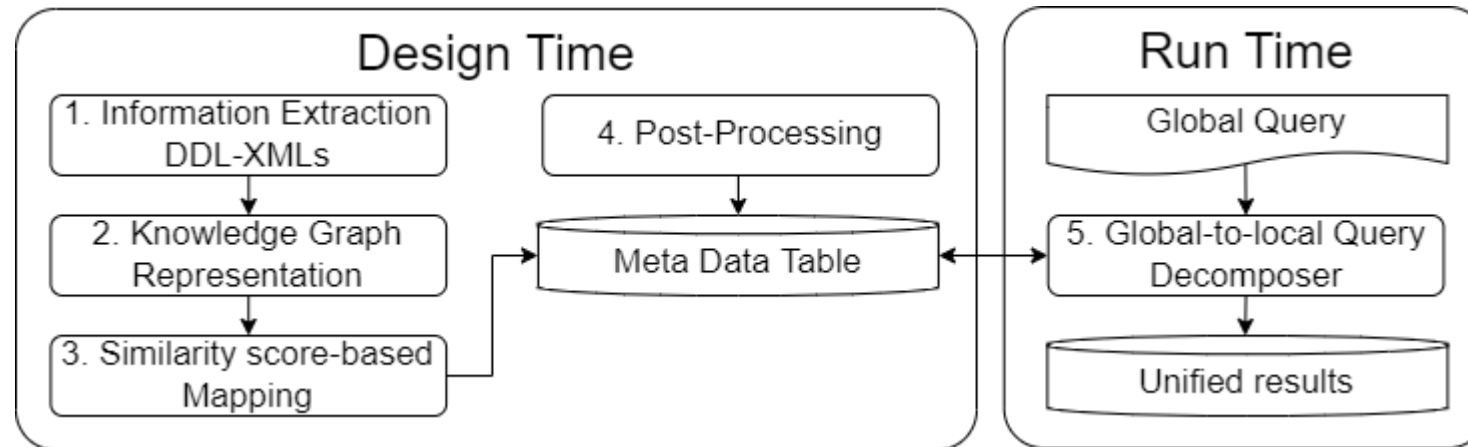
• Tamr



Map schemas with Inteplato

A **web-based application** mapping **multiple schemas** represented in a **knowledge graph**.

The framework provides **explainable recommendations** through a **similarity scoring-system** and an **interactive human-in-the-loop** processing with linkage to a **global-to-local-query decomposer**.



Oracle SQL Developer: C:\Users\Leo\Google Drive\SS21 Thesis Research\Tool Development\DDLParser\extractddl_sxml.sql

Datei Bearbeiten Ansicht Navigieren Ausführen Quelle Team Extras Fenster Hilfe

Verbindungen

- QUERY_TOKENS
- TEMP_RESULTS_DB1
- TEMP_RESULTS_DB2
- TEMP_RESULTS_DB3
- TEMP_RESULTS_DB4
- Views
- Indizes
- Packages
- Prozeduren
- ASSIGN_LOCAL_VALS_TO_TOKENS
- ASSIGN_TOKEN_TYPE
- CONSOLIDATE_RESULTS
- CONVERT_PRICE_FIELD_TO_NUMBER
- DB1_CREATECUSTOMER
- DB1_INSERTPRODUCTS
- GETVALUESFROMMETADATATABLE
- SQL_QUERY_IN_TABLE
- TEMP_RESULTS_LOC_QUERY
- TOKENIZE_SQL_QUERY
- Funktionen
- Operatoren
- Queues
- Queue tabellen
- Trigger
- Typen
- Sequences

extractddl_sxml.sql

SQL-Arbeitsblatt Historie

Arbeitsblatt Query Builder

```

12 SET LONG 2000000
13 SET PAGESIZE 0
14 SELECT DBMS_METADATA.GET_SXML('TABLE', TABLE_NAME) AS sxml_col FROM USER_TABLES WHERE TABLE_NAME LIKE 'DB1%';
15 SELECT DBMS_METADATA.GET_SXML('TABLE', TABLE_NAME) AS sxml_col FROM USER_TABLES WHERE TABLE_NAME LIKE 'DB4%';
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34

```

Design Time

```

graph TD
    A[1. Information Extraction DDL->XMLs] --> B[2. Knowledge Graph Representation]
    B --> C[3. Similarity score-based Mapping]
    C --> D[4. Post-Processing]
    D --> E[Meta Data Table]
    E --> F[5. Global-to-local Query Decomposer]
    F --> G[Unified results]

```

Run Time

```

graph TD
    H[Global Query] --> I[5. Global-to-local Query Decomposer]
    I --> J[Unified results]

```

LEO18C_FEB22

Abfrageergebnis

Alle Zeilen abgerufen: 4 in 2,411 Sekunden

XML_COL
1 <TABLE xmlns="http://xmlns.oracle.com/ku" version="1.0"> <SCHEMA>LEO</SCHEMA> <NAME>DB1_ORDERINGDB_CUSTOMERS</NAME> <RELATIONAL_TABLE> <COL_LIST> <COL_LIST_ITEM> <NAME>...
2 <TABLE xmlns="http://xmlns.oracle.com/ku" version="1.0"> <SCHEMA>LEO</SCHEMA> <NAME>DB1_ORDERINGDB_LINEITEMS</NAME> <RELATIONAL_TABLE> <COL_LIST> <COL_LIST_ITEM> <NAME>...
3 <TABLE xmlns="http://xmlns.oracle.com/ku" version="1.0"> <SCHEMA>LEO</SCHEMA> <NAME>DB1_ORDERINGDB_ORDERS</NAME> <RELATIONAL_TABLE> <COL_LIST> <COL_LIST_ITEM> <NAME>DB...
4 <TABLE xmlns="http://xmlns.oracle.com/ku" version="1.0"> <SCHEMA>LEO</SCHEMA> <NAME>DB1_ORDERINGDB_PRODUCTS</NAME> <RELATIONAL_TABLE> <COL_LIST> <COL_LIST_ITEM> <NAME>...

Verzweigungsvergleich Ausstehende Änderungen (GIT) Nachrichten - Log Zum Starten von "Gehe zu Deklaration" klicken Sie mit gedrückter Strg-Taste auf einen Identifier

Zeile 14 Spalte 109 Einfügen Windows: CF

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Slide 6

Inteplato

SCHEMA UNIVERSE OPTIONS

Upload new schema

Delete schema

GLOBAL SCHEMA OPTIONS

New global table

New global attribute

CONCEPT FILTER OPTIONS

Tables

Attributes

PATH FILTER OPTIONS

Table to attributes

Global to local

Dashboard

Design Time

Run Time

Info Save Options Concept List Local Max Matcher Metadata Table

Upload new schema

XML DDL 1 XML DDL2 Global

```
<WHOLESHEMA> <TABLE xmlns="http://xmlns.oracle.com/ku" version="1.0"> <SCHEMA>LEO</SCHEMA>
<NAME>DB1_ORDERINGDB_CUSTOMERS</NAME> <RELATIONAL_TABLE> <COL_LIST> <COL_LIST_ITEM> <NAME>DB1_CUSTOMER_ID</NAME>
<DATATYPE>NUMBER</DATATYPE> <SCALE>0</SCALE> </COL_LIST_ITEM> <COL_LIST_ITEM> <NAME>DB1_CUSTOMER_NAME</NAME>
<DATATYPE>VARCHAR2</DATATYPE> <LENGTH>255</LENGTH> <COLLATE_NAME>USING_NLS_COMP</COLLATE_NAME> </COL_LIST_ITEM>
<COL_LIST_ITEM> <NAME>DB1_CELLNUMBER</NAME> <DATATYPE>NUMBER</DATATYPE> <PRECISION>10</PRECISION> <SCALE>0</SCALE>
</COL_LIST_ITEM> <COL_LIST_ITEM> <NAME>DB1_EMAIL_ID</NAME> <DATATYPE>VARCHAR2</DATATYPE> <LENGTH>50</LENGTH>
<COLLATE_NAME>USING_NLS_COMP</COLLATE_NAME> </COL_LIST_ITEM> <COL_LIST_ITEM> <NAME>DB1_SHIPPING_ADDRESS</NAME>
<DATATYPE>VARCHAR2</DATATYPE> <LENGTH>255</LENGTH> <COLLATE_NAME>USING_NLS_COMP</COLLATE_NAME> </COL_LIST_ITEM>
</COL_LIST> <CHECK_CONSTRAINT_LIST> <CHECK_CONSTRAINT_LIST_ITEM> <CONDITION>db1_email_id like </CONDITION>
</CHECK_CONSTRAINT_LIST_ITEM> <CHECK_CONSTRAINT_LIST_ITEM> <CONDITION>LENGTH(db1_cellNumber)=10</CONDITION>
</CHECK_CONSTRAINT_LIST_ITEM> </CHECK_CONSTRAINT_LIST> <PRIMARY_KEY_CONSTRAINT_LIST> <PRIMARY_KEY_CONSTRAINT_LIST_ITEM>
<COL_LIST> <COL_LIST_ITEM> <NAME>DB1_CUSTOMER_ID</NAME> </COL_LIST_ITEM> </COL_LIST> <USING_INDEX> <INDEX_ATTRIBUTES>
<PCTFREE>10</PCTFREE> <INITRANS>2</INITRANS> <MAXTRANS>255</MAXTRANS> <STORAGE> <INITIAL>65536</INITIAL>
<NEXT>1048576</NEXT> <MINEXTENTS>1</MINEXTENTS> <MAXEXTENTS>2147483645</MAXEXTENTS> <PCTINCREASE>0</PCTINCREASE>
<FREELISTS>1</FREELISTS> <FREELIST_GROUPS>1</FREELIST_GROUPS> <BUFFER_POOL>DEFAULT</BUFFER_POOL>
<FLASH_CACHE>DEFAULT</FLASH_CACHE> <CELL_FLASH_CACHE>DEFAULT</CELL_FLASH_CACHE> </STORAGE>
<TABLESPACE>USERS</TABLESPACE> <LOGGING>Y</LOGGING> </INDEX_ATTRIBUTES> </USING_INDEX>
</PRIMARY_KEY_CONSTRAINT_LIST_ITEM> </PRIMARY_KEY_CONSTRAINT_LIST>
<DEFAULT_COLLATION>USING_NLS_COMP</DEFAULT_COLLATION> <PHYSICAL_PROPERTIES> <HEAP_TABLE> <SEGMENT_ATTRIBUTES>
<SEGMENT_CREATION_IMMEDIATE></SEGMENT_CREATION_IMMEDIATE> <PCTFREE>10</PCTFREE> <PCTUSED>40</PCTUSED>
```

Close Import DDL into Concept List

Concept Detailview

Name

Type

Data Type

Constraint

Table Source

Schema Source

intepiato

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GLOBAL SCHEMA OPTIONS

New global table

New global attribute

CONCEPT FILTER OPTIONS

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PATH FILTER OPTIONS

Table to attributes

Global to local

Das

Design Time

Run Time

1. Information Extraction DDL-XMLs

2. Knowledge Graph Representation

3. Similarity score-based Mapping

4. Post-Processing

5. Global-to-local Query Decomposer

Global Query

Meta Data Table

Unified results

Concept List

Id

Concept Name

Manipulated Name

Synonyms

Parent #

Type

Schema

Data Type

Constraint

Constraint #

Global #

CONCEPT_1

global

schema

☒

CONCEPT_2

Customers

Customers Client

CUSTOMERS CLIENT,CLIENT,CUSTOMERS,CUSTOMER,GUEST,NODE,CLIENT

CONCEPT_1

table

global

☒

CONCEPT_3

Customer_Id

Customer Id

CONCEPT_2

attribute

global

NUMBER

PRIMARY KEY

☒

CONCEPT_4

Customer_Name

Customer Name

CONCEPT_2

attribute

global

VARCHAR2

☒

CONCEPT_5

Customer_Phone_number

Customer Phone nu

CONCEPT_2

attribute

global

VARCHAR2

☒

CONCEPT_6

Customer_Mail_Id

Customer Mail Id

CONCEPT_2

attribute

global

VARCHAR2

☒

CONCEPT_7

Customer_Address

Customer Address

CONCEPT_2

attribute

global

VARCHAR2

☒

CONCEPT_8

Customer_Title

Customer Title

CONCEPT_2

attribute

global

VARCHAR2

☒

CONCEPT_9

Customer_Credit_Card

Customer Credit Ca

CONCEPT_2

attribute

global

VARCHAR2

☒

CONCEPT_10

Customer_CVC

Customer CVC

CONCEPT_2

attribute

global

VARCHAR2

☒

CONCEPT_11

Products

Products

CONCEPT_1

table

global

☒

CONCEPT_12

Product_Id

Product Id

CONCEPT_11

attribute

global

NUMBER

PRIMARY KEY

☒

CONCEPT_13

Product_Name

Product Name

CONCEPT_11

attribute

global

VARCHAR2

☒

CONCEPT_14

Product_Category

Product Category

CONCEPT_11

attribute

global

VARCHAR2

☒

CONCEPT_15

Product_Description

Product Description

CONCEPT_11

attribute

global

VARCHAR2

☒

CONCEPT_16

Product_Price

Product Price

CONCEPT_11

attribute

global

NUMBER

☒

CONCEPT_17

Product_Quantity

Product Quantity

CONCEPT_11

attribute

global

NUMBER

☒

CONCEPT_18

Product_Quantity_Per_Unit

Product Quantity Pe

CONCEPT_11

attribute

global

NUMBER

☒

CONCEPT_19

Product_Sold

Product Sold

CONCEPT_11

attribute

global

NUMBER

Concept Detailview

Name

Type

Data Type

Constraint

Table Source

Schema Source

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 Delete schema

GLOBAL SCHEMA OPTIONS

+

 New global table

+

 New global attribute

CONCEPT FILTER OPTIONS

Tables

Attributes

PATH FILTER OPTIONS

Table to attributes

Global to local

Dashboard

Design Time

1. Information Extraction
DDL-XMLs

2. Knowledge Graph
Representation

3. Similarity score-based
Mapping

4. Post-Processing

Meta Data Table

Run Time

Global Query

5. Global-to-local Query
Decomposer

Unified results

Info

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Options

Concept List

Local Max Matcher

Metadata Table

Schema Universe

DB1_CUSTOMER_ID

DB1_CUSTOMER_NAME

DB1_ORDERINGDB_CUSTOMERS

DB1_SHIPPING_ADDRESS

DB1_ORDER_ID

DB1_ORDERINGDB_ORDERS

DB1_ORDER_TOTAL_PRICE

CATEGORY_ID

DB4_CATEGORIES

DB1_CELLNUMBER

DB1_EMAIL_ID

DB1_ORDER_DATE

DB1_CUSTOMER_ID

DB1_NO_OF_PRODUCTS

CATEGORY_NAME

CATEGORY_DESCRIPTION

DB1_PRODUCT_ID

COUNTRY

CREDIT_CVC

REGION

CREDIT_CARD

DB1_ITEM_ID

DB1_ITEM_DESCRIPTION

DB1_ORDERINGDB_LINEITEMS

DB1_PRICE_PER_UNIT

DB1_PRODUCT_ID

DB1_ORDERINGDB_PRODUCTS

DB1_PRODUCT_PRICE

CUSTOMER_ID

DB4_CUSTOMERS

DB1_ITEM_QUANTITY

DB1_PRODUCT_NAME

DB1_PRODUCT_DESCRIPTION

DB1_PRODUCT_QUANTITY

CUSTOMER_NAME

CUSTOMER_PHONE

CUSTOMER_TITLE

CUSTOMER_EMAIL

CLIENT_NAME

CLIENT

CLIENT_ID

Concept Detailview

Name

CLIENT_ID

Type

attribute

Data Type

NUMBER

Constraint

PRIMARY KEY

Table Source

CLIENT

Schema Source

global

Global-to-local relationships

Local Schema 1

DB1_CUSTOMER_ID

Local Schema 2

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+

New global attribute

CONCEPT FILTER OPTIONS

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Table to attributes

Global to local

Dashboard

1. Information Extraction
DDL-XMLs

2. Knowledge Graph
Representation

3. Similarity score-based
Mapping

4. Post-Processing

Meta Data Table

5. Global-to-local Query
Decomposer

Global Query

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Local Max Matcher

Metadata Table

Local concept finder

Mapping suggestions for global table **CUSTOMER (CONCEPT_121)**:
Retrieved Synonyms (2) for manipulated name **CUSTOMER** are **CLIENT,CUSTOMER**

id	name	manipulated_name	schema	synonyms	fuzzy search	#datatypes	tot score table	tot score attribute	tot score set
CONCEPT_42	DB1_ORDERINGDB_CUSTOMERS	CUSTOMERS	SCHEMA1	1/2	0.999	2/2	2.499	1	3.499
CONCEPT_73	DB4_CUSTOMERS	CUSTOMERS	SCHEMA2	1/2	0.999	2/2	2.499	1	3.499
CONCEPT_61	DB1_ORDERINGDB_PRODUCTS	PRODUCTS	SCHEMA1	0	0	2/2	1	0.7219	1.7219
CONCEPT_48	DB1_ORDERINGDB_LINEITEMS	LINEITEMS	SCHEMA1	0	0	2/2	1	0.6105	1.6105
CONCEPT_108	DB4_PRODUCTS	PRODUCTS	SCHEMA2	0	0	2/2	1	0.2493	1.2493
CONCEPT_86	DB4_LINE_ITEMS	LINE ITEMS	SCHEMA2	0	0	2/2	1	0.2376	1.2376
CONCEPT_94	DB4_ORDERS	ORDERS	SCHEMA2	0	0	2/2	1	0.2161	1.2161
CONCEPT_116	DB4_SHIPPERS	SHIPPERS	SCHEMA2	0	0	2/2	1	0.2055	1.2055
CONCEPT_68	DB4_CATEGORIES	CATEGORIES	SCHEMA2	0	0	2/2	1	0	1
CONCEPT_55	DB1_ORDERINGDB_ORDERS	ORDERS	SCHEMA1	0	0	1/2	0.5	0	0.5

Close

Concept Detailview

Name

CUSTOMER

Type

table

Data Type

Constraint

Table Source

Schema Source

global

Global-to-local relationships

Local Schema 1

Local Schema 2

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GLOBAL SCHEMA OPTIONS

+

 New global table

+

 New global attribute

CONCEPT FILTER OPTIONS

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PATH FILTER OPTIONS

Table to attributes

Global to local

Dashboard

Schema Universe

1. Information Extraction DDL-XMLs

2. Knowledge Graph Representation

3. Similarity score-based Mapping

4. Post-Processing

Meta Data Table

5. Global-to-local Query Decomposer

Unified results

Global Query

Global-to-local Query Decomposer

Unified results

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Concept List

Local Max Matcher

Metadata Table

Concept Detailview

Name

Customers

Type

table

Data Type

Constraint

Table Source

Schema Source

global

Global-to-local relationships

Local Schema 1

Local Schema 2

CONSOLE

CONCEPT_14 has similarly scored local concepts. Human support required for SCHEMA1

CONCEPT_16 has similarly scored local concepts. Human support required for SCHEMA1

CONCEPT_19 has similarly scored local concepts. Human support required for SCHEMA2

CONCEPT_24 has similarly scored local concepts. Human support required for SCHEMA2


CONCEPT_29 has similarly scored local concepts. Human support required for SCHEMA1

CONCEPT_40 has similarly scored local concepts. Human support required for SCHEMA1

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 Delete schema

GLOBAL SCHEMA OPTIONS

+

 New global table

+

 New global attribute

CONCEPT FILTER OPTIONS

Tables

Attributes

PATH FILTER OPTIONS

Table to attributes

Global to local

Dashboard

Schema Universe

Transformation rules for local concepts

Global table Products is represented as:

Local Schema 1

Local Schema 2

SELECT * FROM DB4_PRODUCTS
INNER JOIN DB4_CATEGORIES

SELECT

*

FROM

INNER JOIN

LEFT JOIN

RIGHT JOIN

FULL JOIN

UNION

ON

=

DB1_ORDERINGDB_PRODUCTS

DB4_CATEGORIES

DB4_PRODUCTS

Close

Save Transformation Rules

Concept Detailview

Name

Products

Type

table

Data Type

Constraint

Table Source

Schema Source

global

Global-to-local relationships

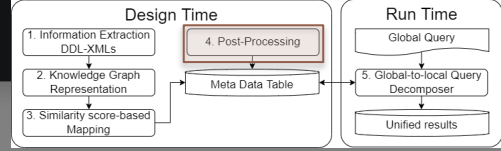
Local Schema 1

DB1_ORDERINGDB_PRODUCTS

Local Schema 2

DB4_CATEGORIES

DB4_PRODUCTS



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SCHEMA UNIVERSE OPTIONS

+

Upload new schema

×

Delete schema

GLOBAL SCHEMA OPTIONS

+

New global table

+

New global attribute

CONCEPT FILTER OPTIONS

☑

Tables

☑

Attributes

PATH FILTER OPTIONS

☑

Table to attributes

☑

Global to local

Da

Design Time

1. Information Extraction
DDL-XMLs

2. Knowledge Graph
Representation

3. Similarity score-based
Mapping

4. Post-Processing

Run Time

Global Query

5. Global-to-local Query
Decomposer

Unified results

Metadata Table

#	Global Concept Name	Transformation rule for schema 1	Transformation rule for schema 2
CONCEPT_2	Customers	DB1_ORDERINGDB_CUSTOMERS	DB4_CUSTOMERS
CONCEPT_3	Customer_Id	DB1_CUSTOMER_ID	CUSTOMER_ID
CONCEPT_4	Customer_Name	DB1_CUSTOMER_NAME	CUSTOMER_NAME
CONCEPT_5	Customer_Phone_number	DB1_CUSTOMER_NAME	CUSTOMER_PHONE
CONCEPT_6	Customer_Mail_Id	DB1_EMAIL_ID '@googlemail.com'	CUSTOMER_EMAIL
CONCEPT_7	Customer_Address	DB1_SHIPPING_ADDRESS	ADDRESS
CONCEPT_8	Customer_Title	DB1_CUSTOMER_NAME	CUSTOMER_TITLE
CONCEPT_9	Customer_Credit_Card	DB1_CUSTOMER_NAME	CREDIT_CARD
CONCEPT_10	Customer_CVC	DB1_CUSTOMER_NAME	
CONCEPT_11	Products	DB1_ORDERINGDB_PRODUCTS	SELECT * FROM DB4_PRODUCTS INNER JOIN DB4_CATEGORIES
CONCEPT_12	Product_Id	DB1_PRODUCT_ID	PRODUCT_ID
CONCEPT_13	Product_Name	DB1_PRODUCT_NAME	PRODUCT_NAME
CONCEPT_14	Product_Category		PRODUCT_NAME
CONCEPT_15	Product_Description	DB1_PRODUCT_DESCRIPTION	PRODUCT_NAME
CONCEPT_16	Product_Price		UNIT_PRICE
CONCEPT_17	Product_Quantity	DB1_PRODUCT_QUANTITY	QUANTITYPERUNIT
CONCEPT_18	Product_Quantity_Per_Unit	DB1_PRODUCT_QUANTITY	QUANTITYPERUNIT
CONCEPT_19	Product_Sold	DB1_PRODUCT_QUANTITY	
CONCEPT_20	Orders	DB1_ORDERINGDB_ORDERS	DB4_ORDERS
CONCEPT_21	Order_Id	DB1_ORDER_ID	ORDER_ID
CONCEPT_22	Order_Date	DB1_ORDER_DATE	ORDER_DATE
CONCEPT_23	Customer_ID	DB1_CUSTOMER_ID	CUSTOMER_ID
CONCEPT_24	Number_Products	DB1_NO_OF_PRODUCTS	
CONCEPT_25	Order_Total_Price	DB1_ORDER_TOTAL_PRICE	TOTAL_PRICE
CONCEPT_26	Order_Required_Date	DB1_ORDER_DATE	ORDER_DATE
CONCEPT_27	Order_Shipped_Date	DB1_ORDER_DATE	ORDER_DATE
CONCEPT_28	Order_Received_Date	DB1_ORDER_DATE	ORDER_DATE

Concept List

Local Max Matcher

Metadata Table

Concept Detailview

Name

Customer_M

Type

attribute

Data Type

VARCHAR2

Constraint

Table Source

Customers

Schema Source

global

Global-to-local relationships

Local Schema 1

DB1_EMAIL_ID


Local Schema 2

CUSTOMER_EMAIL

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Oracle SQL Developer: C:\Users\Leo\AppData\Roaming\SQL Developer\mywork\IS722_Project\demods\demo_display_products_and_cate...

Design Time

```

graph TD
    1[1. Information Extraction DDL/XMLs] --> 2[2. Knowledge Graph Representation]
    2 --> 3[3. Similarity score-based Mapping]
    3 --> 4[4. Post-Processing]
    4 --> 5[5. Global-to-local Query Decomposer]
    5 --> 6[6. Unified results]
    5 --> 7[Global Query]
    7 --> 8[Unified results]
  
```

Run Time

Global Query

Unified results

Verbindungen

- KEYWORDS
- METADATA
- QUERY_TOKENS
- TEMP_RESULTS_DB1
- TEMP_RESULTS_DB2
- TEMP_RESULTS_DB3
- TEMP_RESULTS_DB4
- Views
- Indizes
- Packages
- Prozeduren
- Funktionen
- Operatoren
- Queues
- Queue tabellen
- Trigger
- Typen
- Sequences
- Materialized Views
- Materialized View-Logs
- Synonyme
- Öffentliche Synonyme
- Datenbanklinks
- Öffentliche Datenbanklinks
- Verzeichnisse
- Editions

Versionen

- Git
- Subversion

Arbeitsblatt

Query Builder

```

1 BEGIN
2 TOKENIZE_SQL_QUERY(' SELECT PRODUCTNAME , PRODUCTDESCRIPTION FROM PRODUCTS WHERE PRODUCTQUANTITY > 3 ');
3 END;
4
5 /
6 BEGIN
7 --ASSIGN_TOKEN_TYPE();
8 ASSIGN_LOCAL_VALS_TO_TOKENS();
9 --TEMP_RESULTS_LOC_QUERY();
10 --CONSOLIDATE_RESULTS();
11 END;
12
13
14 select * from query_tokens;
15 select * from consolidated_results;
  
```

Skriptausgabe x Abfrageergebnis x

Alle Zeilen abgerufen: 10 in 0,002 Sekunden

TOKEN_STRING	TOKEN_ID	TOKEN_TYPE	AFTER_FROM	AFTER_WHERE	TOKEN_STRING_DB1	TOKEN_STRING_DB4
1 SELECT	1 standard	0	0	0	SELECT	SELECT
2 PRODUCTNAME	2 lookup	0	0	0	dbl_product_name	product_name
3 ,	3 standard	0	0	0	,	,
4 PRODUCTDESCRIPTION	4 lookup	0	0	0	dbl_product_description	Category_Description
5 FROM	5 standard	0	0	0	FROM	FROM
6 PRODUCTS	6 lookup	1	0	0	dbl_orderingDB_Products	(SELECT * FROM DB4_PRODUCTS NATURAL JOIN DB4_CATEGORIES) DB4PRODUCTS
7 WHERE	7 standard	1	0	0	WHERE	WHERE
8 PRODUCTQUANTITY	8 lookup	1	1	1	dbl_product_quantity	units_stock
9 >	9 standard	1	1	1	>	>
10 3	10 arg	1	1	1	3	3

Verzweigungsvergleich Ausstehende Änderungen (GIT)

Zeile 8 Spalte 31 Einfügen Geändert Windows: C

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Prof. Dr. Behrend
Prof. Dr. Karabatis

Oracle SQL Developer: C:\Users\Leo\AppData\Roaming\SQL Developer\mywork\IS722_Project\demos\demo_display_products_and_cate...

Design Time

```

graph TD
    1[1. Information Extraction DDL-XMLs] --> 2[2. Knowledge Graph Representation]
    2 --> 3[3. Similarity score-based Mapping]
    3 --> 4[4. Post-Processing]
    4 --> 5[5. Global-to-local Query Decomposer]
    5 --> 6[6. Global Query]
    5 --> 7[7. Unified results]
  
```

Run Time

Global Query

Unified results

Verbindungen

- KEYWORDS
- METADATA
- QUERY_TOKENS
- TEMP_RESULTS_DB1
- TEMP_RESULTS_DB2
- TEMP_RESULTS_DB3
- TEMP_RESULTS_DB4
- Views
- Indizes
- Packages
- Prozeduren
- Funktionen
- Operatoren
- Queues
- Queue Tabellen
- Trigger
- Typen
- Sequences
- Materialized Views
- Materialized View-Logs
- Synonyme
- Öffentliche Synonyme
- Datenbanklinks
- Öffentliche Datenbanklinks
- Verzeichnisse
- Editions

Versionen

- Git
- Subversion

SQL-Arbeitsblatt: Historie

Arbeitsblatt Query Builder

```

1 BEGIN
2 TOKENIZE_SQL_QUERY(' SELECT PRODUCTNAME , PRODUCTDESCRIPTION FROM PRODUCTS WHERE PRODUCTQUANTITY > 3 ');
3 END;
4
5 /
6 BEGIN
7 --ASSIGN_TOKEN_TYPE();
8 --ASSIGN_LOCAL_VALS_TO_TOKENS();
9 --TEMP_RESULTS_LOC_QUERY();
10 CONSOLIDATE_RESULTS();
11 END;
12
13 SELECT * FROM TEMP_RESULTS_DB1;
14 SELECT * FROM TEMP_RESULTS_DB4;
15
16 select * from query_tokens;
17 select * from consolidated_results;
  
```

Skriptausgabe x Abfrageergebnis x Abfrageergebnis x

SQL | Alle Zeilen abgerufen: 12 in 0,004 Sekunden

DB1_PRODUCT_NAME	DB1_PRODUCT_DESCRIPTION
1 Adaptive Information 0-471-48854-2	UMBC Books
2 BASEBALL CANTON T-SHIRT	UMBC Merchandise
3 BASEBALL EZA CAP	UMBC Merchandise
4 BEACH TOWEL: UMBC	UMBC Merchandise
5 BINDER: 1" UMBC COLLAGE	UMBC Books
6 Data Mining 978-0-12-804291-5	UMBC Books
7 FLIP FLOPS: BEACH DUD	UMBC Merchandise
8 Iphone 12	Mobile Phone
9 MASK: UMBC RETRIEVER	UMBC Merchandise
10 Mac Book Pro	13 inch Laptop
11 STRESS RELIEVER: VOLLEYBALL	UMBC Merchandise
12 Samsung Galaxy S20	5g Mobile Phone

Verzweigungsvergleich | Ausstehende Änderungen (GIT) | Nachrichten - Log

| Zeile 17 Spalte 36 | Einfügen | Geändert | Windows: C

28.05.2021

Slide 15

Master thesis presentation
Leonard Traeger
Prof. Dr. Behrend
Prof. Dr. Karabatis

Performance Evaluation

Goal: **mapping a global schema with two local schemas**

Evaluation: **human experts** versus **Inteplato's similarities** and **objective function**

Data: **two independently created logistics** and **single mediator schemas**

Inteplato Configuration	Local schema(1) *	Local schema(2)	Average Accuracy
No synonyms retrieval and distance parameter(0.95)	17/25	17/39	55.80%
No synonyms retrieval and distance parameter(0.975)	17/25	17/39	55.80%
No synonyms retrieval and distance parameter(1)	20/25	21/39	66.92%
Synonyms retrieval and distance parameter(0.95)	21/25	23/39	71.49%
Synonyms retrieval and distance parameter(0.975)	22/25	26/39	77.33%
Synonyms retrieval and distance parameter(0.99)	23/25	28/39	81.90%
Synonyms retrieval and distance parameter(1)	23/25	28/39	81.90%

Limitations

- Global schema is given
- Global schema is context-dependent
- Experimental data is self-made
→ benchmarks

* Non-existent global concept correspondences (14 out of 39) were cleaned before evaluation.

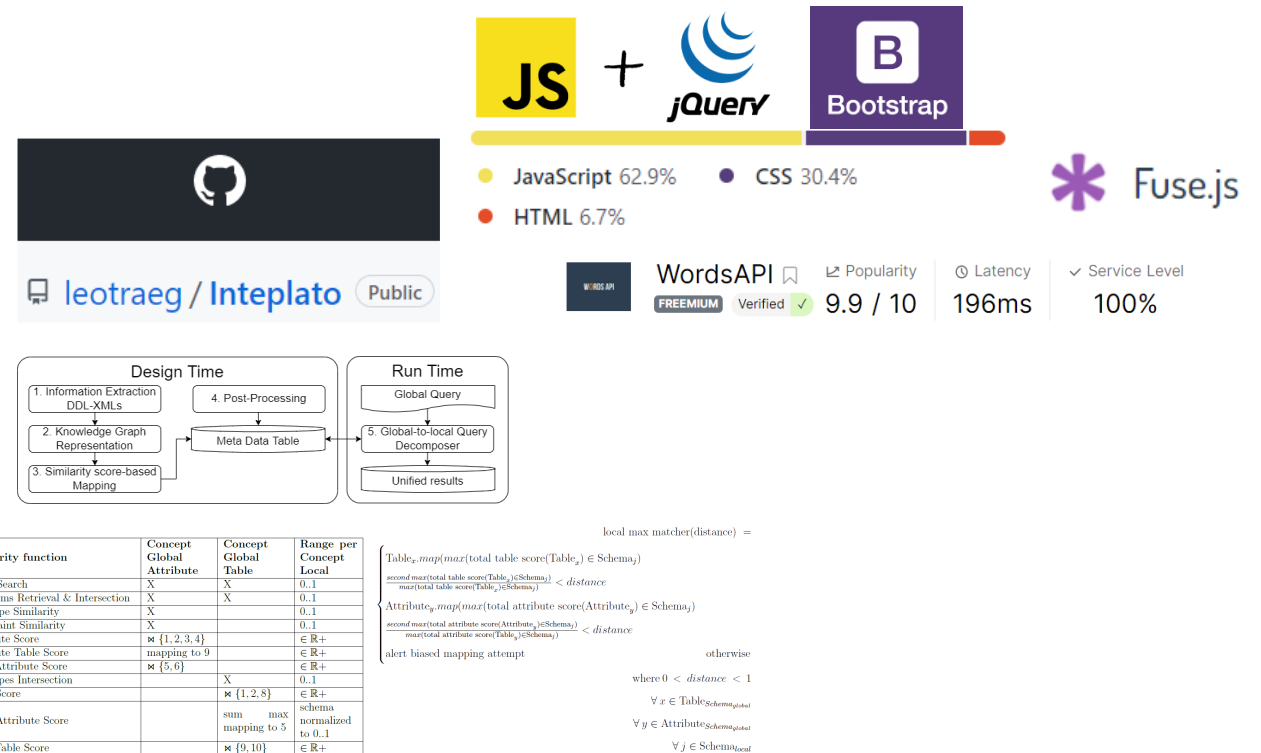
Conclusion

Mastering the process of schema mapping with algorithmic support and traceability for data experts

- Scientific directions

Inteplato

- Web-based schema mapping application
- Human-centric and scalable framework
- Technical documentation
- Performance evaluation



Limitations and Future Work

- Word-embeddings
 - Rule-based conflict resolution
 - Data preparation
 - Field intersections
-
- Competitions
 - Bridge run & design time
 - Plug-and-play system

Thank you for your attention!

Q&A