

SQL

Announcements

Databases

Data is very, very powerful!

AI is made of data...

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Industry experiences on the data challenges of AI and the call for a data ecosystem for industrial enterprises.

BY CHRISTOPH GRÖGER

There Is No AI Without Data

ARTIFICIAL INTELLIGENCE (AI) has evolved from hype to reality over the past few years. Algorithmic advances in machine learning and deep learning, significant increases in computing power and storage, and huge amounts of data generated by digital transformation efforts make AI a game-changer across all industries. AI has the potential to radically improve business processes with, for instance, real-time quality prediction in manufacturing, and to enable new business models,

such as connected car services and self-optimizing machines. Traditional industries, such as manufacturing, machine building, and automotive, are facing a fundamental change: from the production phase up to the delivery of AI-enhanced processes and services as part of Industry 4.0.³⁰ This paper focuses on AI for industrial enterprises with a special emphasis on machine learning and data mining.

Despite the great potential of AI and the large investments in AI technologies undertaken by industrial enterprises, AI has not yet delivered on the promises in industry practice. The core business of industrial enterprises is not yet AI-enhanced. AI solutions instead constitute islands for isolated cases—such as automated inspection of selected machines—in the factory with varying success. According to current industry surveys, data issues constitute the main reasons for the insufficient adoption of AI in industrial enterprises.^{27,35}

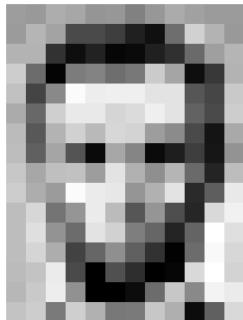
In general, it is nothing new that data preparation and data quality are key for AI and data analytics, as there is no AI without data. This has been an issue since the early days of business intelligence (BI) and data warehousing.³ However, the manifold data challenges of AI in industrial enterprises go far beyond detecting and repairing dirty data. This article profoundly investi-

» key insights

- Despite AI's great potential, the business of industrial enterprises is not yet AI-enhanced. AI is done in an insular fashion, leading to a siloed and heterogeneous enterprise data landscape that limits the comprehensive application of AI.
- Data challenges, such as data management, data democratization, and data governance, are among the major obstacles to leveraging AI and go far beyond ensuring data quality, comprising diverse aspects such as metadata management, data architecture, and data ownership.
- The presented data ecosystem for industrial enterprises addresses these challenges and comprises three components that comprises data producers, data consumers, and data roles for AI.

IMAGE OF ALBERT ANDREWS EDITED WITH ADDITIONAL PHOTOS BY PHOTONSTOCK.COM

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| 157 | 153 | 174 | 168 | 150 | 152 | 129 | 151 | 172 | 161 | 155 | 156 |
| 155 | 182 | 163 | 74 | 75 | 62 | 93 | 17 | 10 | 210 | 180 | 154 |
| 180 | 180 | 50 | 14 | 34 | 6 | 10 | 33 | 48 | 106 | 159 | 181 |
| 206 | 109 | 6 | 124 | 131 | 111 | 120 | 204 | 166 | 16 | 66 | 180 |
| 194 | 68 | 137 | 251 | 237 | 239 | 239 | 228 | 227 | 67 | 71 | 201 |
| 172 | 105 | 207 | 23 | 239 | 214 | 220 | 239 | 228 | 98 | 74 | 206 |
| 188 | 88 | 179 | 209 | 185 | 215 | 211 | 158 | 139 | 75 | 20 | 169 |
| 189 | 97 | 155 | 54 | 10 | 162 | 154 | 11 | 31 | 62 | 22 | 148 |
| 199 | 168 | 191 | 195 | 158 | 227 | 178 | 143 | 182 | 105 | 36 | 190 |
| 205 | 174 | 155 | 252 | 236 | 231 | 149 | 178 | 228 | 43 | 45 | 234 |
| 190 | 216 | 116 | 141 | 236 | 187 | 85 | 150 | 79 | 38 | 210 | 241 |
| 190 | 224 | 147 | 150 | 227 | 210 | 127 | 102 | 36 | 101 | 255 | 224 |
| 190 | 214 | 173 | 56 | 103 | 143 | 96 | 50 | 2 | 109 | 249 | 215 |
| 187 | 196 | 235 | 73 | 1 | 81 | 47 | 0 | 6 | 217 | 255 | 211 |
| 183 | 202 | 237 | 143 | 0 | 9 | 72 | 108 | 200 | 138 | 243 | 236 |
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| 157 | 153 | 174 | 168 | 150 | 152 | 129 | 151 | 172 | 161 | 155 | 156 |
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| 206 | 109 | 5 | 124 | 131 | 111 | 120 | 204 | 166 | 16 | 66 | 180 |
| 194 | 68 | 137 | 251 | 237 | 239 | 239 | 228 | 227 | 67 | 71 | 201 |
| 172 | 105 | 207 | 23 | 239 | 214 | 220 | 239 | 228 | 98 | 74 | 206 |
| 188 | 88 | 179 | 209 | 185 | 215 | 211 | 158 | 139 | 75 | 20 | 169 |
| 189 | 97 | 155 | 54 | 10 | 162 | 154 | 11 | 31 | 62 | 22 | 148 |
| 199 | 168 | 191 | 195 | 158 | 227 | 178 | 143 | 182 | 105 | 36 | 190 |
| 205 | 174 | 155 | 252 | 236 | 231 | 149 | 178 | 228 | 43 | 45 | 234 |
| 190 | 216 | 116 | 141 | 236 | 187 | 85 | 150 | 79 | 38 | 218 | 241 |
| 190 | 224 | 147 | 150 | 227 | 210 | 127 | 102 | 36 | 101 | 255 | 224 |
| 190 | 214 | 173 | 56 | 103 | 143 | 96 | 50 | 2 | 109 | 249 | 215 |
| 187 | 196 | 235 | 73 | 1 | 81 | 47 | 0 | 6 | 217 | 255 | 211 |
| 183 | 202 | 237 | 143 | 0 | 9 | 72 | 108 | 200 | 138 | 243 | 236 |
| 195 | 206 | 123 | 207 | 177 | 121 | 123 | 200 | 175 | 13 | 96 | 218 |

digital images are made out of data...

To many of the biggest, most powerful corporations in the world...



...data about *us* is their most prized resource!

Database Management Systems

Database management systems (DBMS) are important, heavily used, and interesting!

A table is a collection of records, which are rows that have a value for each column

| Latitude | Longitude | Name |
|----------|-----------|-------------|
| 38 | 122 | Berkeley |
| 42 | 71 | Cambridge |
| 45 | 93 | Minneapolis |

The Structured Query Language (SQL) is perhaps the most widely used programming language

SQL is a *declarative* programming language

Programming Paradigms

Programming Paradigms

- **Paradigm** (Merriam Webster): a typical example or pattern of something; a model. Example: "there is a new paradigm for public art in this country"
- **Programming Paradigm** ([Joe Turner, Clemson University](#)): “A programming paradigm is a general approach, orientation, or philosophy of programming that can be used when implementing a program.” You might call this a "style"

Many Different Approaches

There is no universally agreed upon taxonomy of human programming styles.

One possible list:

- Imperative
- Functional
- Array-based
- Object-Oriented
- Declarative

These terms are a bit fluid, and as you'll see if you read more on wikipedia, there is substantial disagreement about these terms.

Some Examples

Example, very different approaches to squaring list:

```
lst = []
for i in range(5):
    lst += [ i*i ]  
  
map(lambda x: x*x, range(5))  
  
[ x * x for x in range(5) ]
range(5).square_nums() # Only theoretically, e.g assume `def square_nums(self)` exists  
  
np.sum(
    np.array([0, 1, 2, 3, 4]) *
    np.array([0, 1, 2, 3, 4])
)  
  
np.sum(np.array([0, 1, 2, 3, 4])) ** 2
```

Declarative Programming

In declarative programming:

- A "program" is a description of the desired result
- The interpreter figures out how to generate the result

Imperative Programming is like...

"Add 2 teaspoons of salt
and 2 teaspoons of
yeast.
Add 3 cups of flour.
Add 2 tablespoons of
olive oil.
Add 1/4th a cup of
water;
Start mixing the
ingredients together.
Put the dough ball on a
surface..."



Declarative Programming is like...

"I would like a pizza"
"16 inches, with
pepperoni"

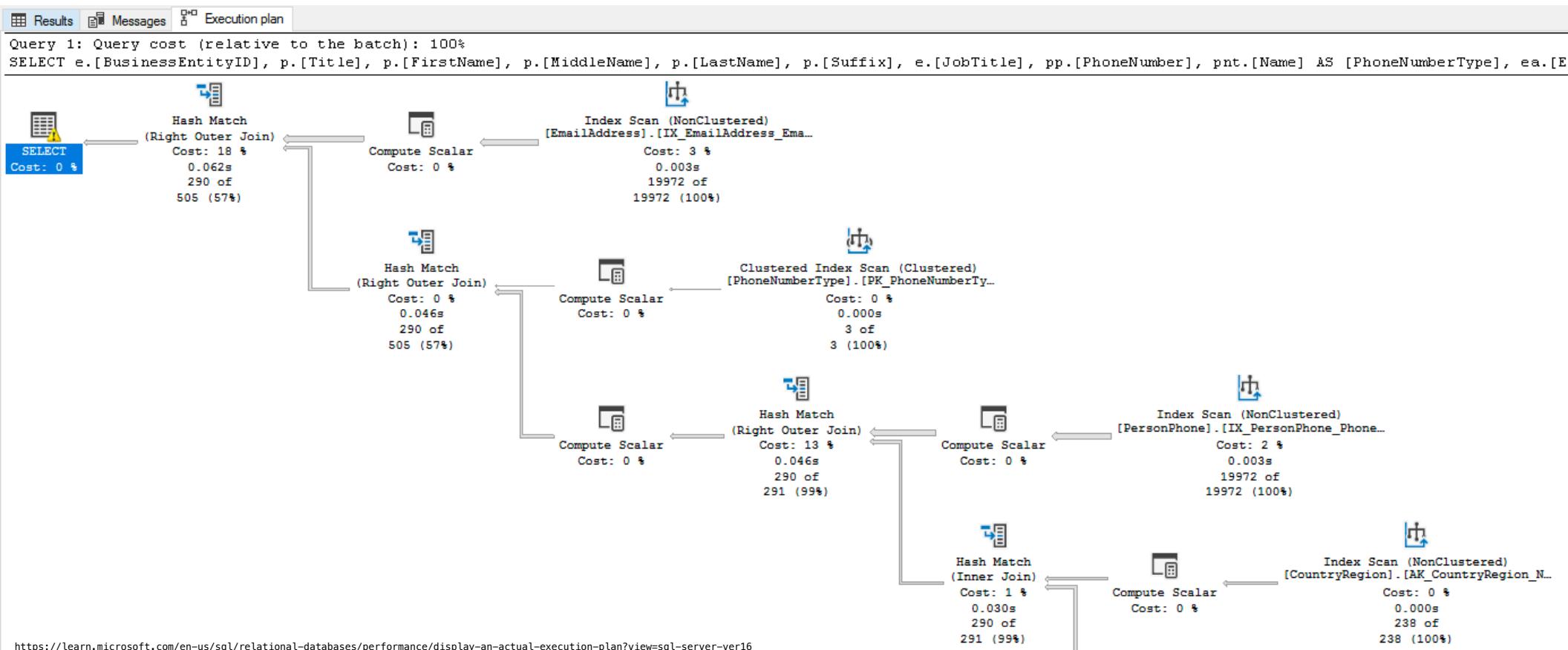


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SQL Server Query Plan:



Structured Query Language (SQL)

Naming Tables

A **select** statement creates a new table and displays it.

A **create table** statement names the result of a **select** statement.

```
create table [name] as [select statement];
```

Here's how I might create a table of some of my most-listened-to spotify tracks in SQL:

```
create table songs as  
  
select "WILDFLOWER" as track, "Billie Eilish" as artist union  
select "BIRDS OF A FEATHER" , "Billie Eilish" union  
select "360" , "Charli xcx" union  
select "Pasilyo" , "Sunkissed Lola" union  
select "Cinderella" , "Remi Wolf" union  
select "Good Luck Babe!" , "Chappell Roan" union  
select "Meow" , "Anamanaguchi";
```

songs:

| track | artist |
|-----------------|----------------|
| WILDFLOWER | Billie Eilish |
| BIRDS... | Billie Eilish |
| 360 | Charli xcx |
| Pasilyo | Sunkissed Lola |
| Cinderella | Remi Wolf |
| Good Luck Babe! | Chappell Roan |
| Meow | Anamanaguchi |

Select Statements Project Existing Tables

A **select** statement can specify an input table using a **from** clause

A subset of the rows of the input table can be selected using a **where** clause

An ordering over the remaining rows can be declared using an **order by** clause

Column descriptions determine how each input row is projected to a result row

```
select [expression] as [name], [expression] as [name], ...;  
select [columns] from [table] where [condition] order by [order];  
select track from songs where artist = "Billie Eilish";  
select track from songs where track < artist;
```

songs:

| track | artist |
|-----------------|----------------|
| 360 | Charli xcx |
| BIRDS... | Billie Eilish |
| Cinderella | Remi Wolf |
| Good Luck Babe! | Chappell Roan |
| Pasilyo | Sunkissed Lola |
| Meow | Anamanaguchi |
| WILDFLOWER | Billie Eilish |

Optional Example:
UC Salary Data / Your Own Data

SOURCES: <https://ucannualwage.ucop.edu>

The University is a public institution, so it is supported to an extent by California taxpayers through an allocation by the state government. In the past, generous state support allowed UC Berkeley to operate while keeping costs to students low. While still an important revenue source, the state's financial support of the university has diminished significantly. Thirty years ago, 50 percent of the university's revenue came from the state, but today, the state provides just 14 percent of the university's revenue.

