



# Data Skipping technology

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*May the*  $14^{th} - 20$ 

Co-funded by the European Commission Horizon 2020 - Grant # 779747







## Data Skipping: technology context

- 1. Big (semi) structured data
- 2. Object Storage
- 3. Apache Spark: one of the most popular Analytics engines for big data
- 4. More specifically Apache Spark SQL











Modern BigData architectures decouple storage from compute

Hence:

Big data analytics implies a (big) data transfer

Therefore:

Data Skipping is important for BigDataStack

**Proof:** Data Skipping is already incorporated into IBM products (see status slide)



### Data Skipping: goal

- 1. Big (semi) structured data
- 2. Object Storage
- 3. Apache Spark: one of the most popular Analytics engines for big data
- 4. More specifically Apache Spark SQL

## Data Skipping goal is to minimize the <u>data transfer</u>









### Data Skipping: how does it work?

## Determine which objects are NOT relevant for a SQL query using a data skipping index

- Stores summary index metadata for each object
- No change to Apache Spark base code
- "just" take advantage of a Spark external API which permits to refine the set of objects relevant to a given query.

#### Skip over irrelevant objects

- Skipped objects are not touched at all
- IBM Data skipping is state of the art. It comprises:
  - UDFs support
  - Data Skipping for LIKE and general regular expressions
  - Multiple indexes including Bloom Filter, etc...
  - Plug-in user indexes
  - Etc...

➔ Saves time and \$

#### Possibly relevant object are ingested WHERE Clause Data Skipping Index of All Objects Det of All Objects

#### Example: Look for data in violent storm conditions

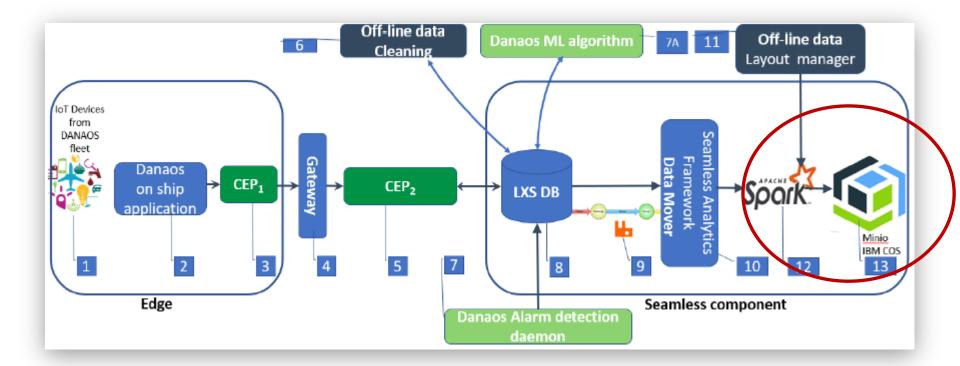
SELECT vessel\_code, datetime, longitude, latitude, wind\_speed
FROM cos://us-south/.../danaos stored as parquet
WHERE wind\_speed > 30

Min/max index on wind\_speed column

14.05.2020



### Data Skipping within the maritime use case



Danaos vessel dataset

Typical SQL queries: SELECT vessel\_code, datetime, longitude, latitude, wind\_speed FROM cos://us-south/.../danaos stored as parquet WHERE wind\_speed > 30

The Object Storage: either <u>remote</u> IBM Cloud Object Storage (COS) (as shown) or local

Depending on query and data partitioning we get up to 99% reduction in data transfer



### Data Skipping: status

Data Skipping for the BigDataStack maritime dataset demonstrated at THINK '19

(joint work with Danaos: the BigDatastack maritime use-case partner)

#### **IBM Products**

- Database Catalog Support added to <u>IBM Cloud SQL Query</u>
  - Blog published <u>here</u>
  - Released as open beta
- Data Skipping integrated within <u>IBM Cloud SQL Query</u>
  - Blog published <u>here</u>
  - Released as closed beta (as of now)
- IBM Analytics Engine (IAE)
  - Data Skipping feature available as open beta

That's all ... for now

Scientific paper soon to be submitted





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Data Skipping: next steps

Data partitioning

- Push for additional adoption
- Decouple Data Skipping from Apache Spark





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