#### ASTRONOMER

# OpenLineage & Airflow: A Deeper Dive

#### **Our Speakers**



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The principal sponsors of **OpenLineage** 



What is data lineage and why should we all care?

#### Building a healthy data ecosystem





### Limited metadata = limited context



- What is the data source?
- What is the schema?
- Who is the owner?
- How often is it updated?
- Where does it come from?
- Who is using it?
- What has changed?



### The key = data lineage

Data lineage contains what we need to know to solve our most complicated problems.

- Producers & consumers of each dataset
- Inputs and outputs of each job





How can we collect and study data lineage?

#### Infer or observe?



You can try to infer the date and location of an image after the fact...



...or you can capture it when the image is originally created!

### Forensic data lineage



Integrate with data stores and warehouses

Regularly process query logs to trace lineage

Report to a lineage metadata repository



#### Operational data lineage



Integrate with data orchestration systems

As jobs run, observe the way they affect data

Report to a lineage metadata repository



#### OMG the possibilities are endless

Dependency tracing Root cause identification Issue prioritization Impact mapping Precision backfills Anomaly detection Change management Historical analysis Compliance





How can we study lineage in heterogeneous pipelines?

# OpenLineage

#### **Mission**

To define an **open standard** for the collection of lineage metadata from pipelines as they are running.







**OpenLineage** contributors





### The snowball effect



How does OpenLineage work?

### The OpenLineage Stack



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#### Data model



# Naming conventions

|          | Formulae  | Examples  |
|----------|---|---|
| Datasets | host + database + table<br>bucket + path<br>host + port + path<br>project + dataset + table | postgres://db.foo.com/metrics.salesorders<br>s3://sales-metrics/orders.csv<br>hdfs://stg.foo.com:salesorders.csv<br>bigquery:metrics.sales.orders |
| Jobs     | namespace + name<br>namespace + project + name  | staging.load_orders_from_csv<br>prod.orders_etl.count_orders  |
| Runs     | Client-provided UUID  | 1c0386aa-0979-41e3-9861-3a330623effa  |

#### Lifecycle of a job run



### Extending the model with Facets

Facets are atomic pieces of metadata attached to core entities.

| Self-documenting  | Familiar  |  |  |
|---|---|--|--|
| Facets can be given unique,<br>memorable names                | Facets are defined using JSON schema objects                |  |  |
|   |   |  |  |
| Flexible  | Scalable  |  |  |
| Facets can be attached to any core entity: Job, Dataset & Run | Prefixes on names are used to establish discrete namespaces |  |  |



#### Facet examples

#### Dataset:

- Quality metrics
- Size metrics
- Schema
- Version

#### Job:

- Source code
- Dependencies
- Source control
- Query plan

#### Run:

- Scheduled time
- Batch ID
- Query profile
- Params

What does an OpenLineage event look like?

#### Example: starting a job run

```
( ) > ~/projects/astro ) 🕫 🤌 main 🔰 bat -p startjob.json
"eventType": "START",
"eventTime": "2020-12-28T19:52:00.001+10:00",
"run": {
  "runId": "d46e465b-d358-4d32-83d4-df660ff614dd"
},
"job": {
  "namespace": "my-namespace",
  "name": "my-job"
},
"inputs": [{
  "namespace": "my-namespace",
 "name": "my-input"
}],
"producer": "https://github.com/OpenLineage/OpenLineage/blob/v1-0-0/client"
(c) > ~/projects/astro) & P main curl -X POST http://nuckles.rtrk.us:5000/api/v1/lineage \
-H 'Content-Type: application/json' \
-d @startjob.json
( ) 🖕 ~/projects/astro ) 🕫 🤌 main
```

### Example: completing a job run

```
( ) > ~/projects/astro ) # 12 main ?1 ) bat -p completejob.json
   "eventType": "COMPLETE",
   "eventTime": "2020-12-28T20:52:00.001+10:00",
   "run": {
       "runId": "d46e465b-d358-4d32-83d4-df660ff614dd"
   },
   "iob": {
       "namespace": "my-namespace",
       "name": "my-job"
   },
   "outputs": [{
       "namespace": "my-namespace",
       "name": "mv-output"
   }],
    "producer": "https://github.com/OpenLineage/OpenLineage/blob/v1-0-0/client"
}
 🔹 ) 🖕 ~/projects/astro ) 🕸 🤌 main ?1 🛛 curl –X POST http://nuckles.rtrk.us:5000/api/v1/lineage 🔪
 -H 'Content-Type: application/json' \
 -d @completejob.json
 💼 ) 🖕 ~/projects/astro ) 🕫 🛿 main ?1
```

# Example: viewing a job run

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| -\$c       | > Base                  | •              | my-namespa         | ob my-output |            |   |      |  |
|            | my-input                |                |                    |              |            |   |      |  |
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|            | Attribute               | Туре           | C                  | Description  |            |   |      |  |
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|            | b                       | VARCHAR        |                    |              |            |   | _    |  |
| ۴          |                         |                |                    |              |            |   |      |  |

How does Airflow work with OpenLineage?

### Lineage is collected with Extractors



### Enabling the integration

Airflow 2.1+

( ) > ~/projects/astro bat -p .env AIRFLOW\_LINEAGE\_\_BACKEND=openlineage.lineage\_backend.OpenLineageBackend

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Airflow 1.10+

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#### Available Extractors

|                           | BigQueryOperator P |  | ostgresOperator |     | Si | SnowflakeOperator |  |  |
|---------------------------|--------------------|--|-----------------|-----|----|-------------------|--|--|
| GreatExpectationsOperator |                    |  | PythonOpera     | tor |    | BashOperator      |  |  |

# Registering new Extractors

d >> ~/projects/astro bat -p .env OPENLINEAGE\_EXTRACTOR\_MyOperator=full.path.to.MyExtractor

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#### How to build an Extractor



Extend the - OpenLineage BaseExtractor

Extract lineage metadata for **these** operators

Record **these** Dataset objects as inputs/outputs

# Code example

# Thanks :)

