# Use Case Industrialization



### Christelle Lusso

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- Introduction
- 2 DAGs
- 3 CI/CD
- 4 Pub/Sub
- 5 Integrating my ML use case (MEP)

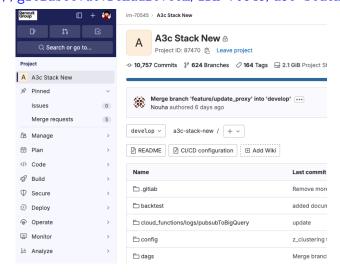
#### Introduction

- How to industrialize a machine learning model from A to Z.
- Context:
  - ► A3CT project.
  - ▶ BigQuery ML (versus Python/Spark).
  - ▶ For newbies.



### A3c Stack New Project

• Add your Use Case to the A3c Stack New Project: https://gitlabee.dt.renault.com/irn-70545/a3c-stack-new.



- 2 In folder  $\frac{dags}{reporting} > create my use case folder.$
- In my\_use\_case\_folder ⇒ add my .sql files.

- 2 In folder  $\frac{dags}{reporting} > create my use case folder.$
- 3 In my use case folder  $\Rightarrow$  add my .sql files.

#### File names standardization

- Code of my use case (mdl cd).
- 2 Name of my use case (mdl typ).
- Step number.
- Step name.

#### suspects\_to\_prospects

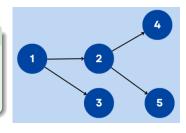
- X 14\_brand\_affinity\_0\_staging\_a3.sql
- X 14\_brand\_affinity\_0\_staging\_cameo.sql
- X 14\_brand\_affinity\_0\_staging\_cdm.sql
- X 14\_brand\_affinity\_0\_staging\_contactability.sql
- X 14\_brand\_affinity\_1\_joined\_with\_contactability.sql
- X 14\_brand\_affinity\_2\_with\_durations.sql
- 💢 14\_brand\_affinity\_3\_brand\_aggregation.sql
- X 14\_brand\_affinity\_4\_joined\_with\_a3.sql
- X 14\_brand\_affinity\_5\_party\_level\_aggregation.sql
- X 14\_brand\_affinity\_6\_joined\_with\_cameo.sql
- X 14\_brand\_affinity\_6b\_balanced\_dataset.sql
- X 14\_brand\_affinity\_7\_eval\_dataset.sql
- X 14\_brand\_affinity\_7\_training\_dataset.sql
- X 14\_brand\_affinity\_8\_brand\_classifier.sql
- X 14\_brand\_affinity\_9\_evaluation.sql

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### Add DAGs to pipeline

#### What is a DAG?

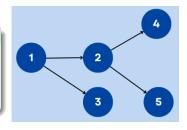
- **1** DAG = Directed Acyclic Graph.
- 2 Represents dependencies between steps.
- $\mathbf{3} \Rightarrow \text{sequences of steps or parallel steps.}$



### Add DAGs to pipeline

#### What is a DAG?

- DAG = Directed Acyclic Graph.
- 2 Represents dependencies between steps.
- $3 \Rightarrow$  sequences of steps or parallel steps.



#### How to add DAG?

### Complete files:

- A3ctBigQueryMLVariables.py (DAG configuration)
- prep\_dashboard.py (DAG creation)

located in dags/reporting folder.

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- Contains DAG configuration in json format.
- → Define my\_use\_case training/predict DAG dictionary.

```
brand affinity training = {
    "area": "bqmlTest",
    "name": "brand affinity training",
    "description": "Training pipeline for Brand Affinity",
    "step list": [
            "name": "staging",
            "type": "table",
            "table list": [
                     "table": "14 brand affinity 0 staging cdm",
                     "dataset dest": "bqml uc",
                     "action": "view".
                     "file": {
                         "file path": "sql/brand affinity/...,
                         "file type": 'sql'
        },
```

- All my .sql files are listed in **step\_list** with specific parameters:
  - "type": "table""table list": ...
  - ► ⇒ CREATE **TABLE**
- Tables are created in dataset dest folder.

```
brand affinity training = {
    "area": "bgmlTest",
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                     "table": "14 brand affinity 0 staging cdm",
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                     "action": "view",
                     "file": {
                         "file path": "sql/brand affinity/...,
                         "file type": 'sql'
```

All my .sql files are listed in step\_list with specific parameters:

```
"type": "model""bqml_list": ...⇒ CREATE MODEL
```

```
"name": "create model".
"type": "model",
"bqml list": [
        "table": "14 brand affinity 8 brand classifier",
        "action": "train".
        "file ": {
            "file_path": "sql/brand affinity/...,
            "file type": 'sql',
    },
```

```
14 brand affinity 8 brand classifier.sql
create or replace model
'irn -70545-dev -54.bqml uc.14 brand affinity 8 brand classifier'
options (
    model type='BOOSTED TREE CLASSIFIER',
    auto class weights=true,
    input label cols=['suspects brand'],
    enable global explain=true
) as
select * except (
  ref country cd,
  prty id
from
'irn -70545-dev -54.bqml uc.14 brand affinity 7 training dataset'
```

#### a3c\_scores columns:

- ref\_country\_cd,
- prty\_id,
- vhcl brand nm,
- mdl segmentation ctgry,
- mdl segmentation ctgry cd,
- mdl sub typ,
- mdl sub cd,
- vhcl brand cd,
- mdl cd,
- mdl typ,
- vhcl vin id,
- mdl\_probability\_nb,
- mdl score ranking nb,
- o mdl validity start dt,
- mdl validity end dt,
- mdl version,

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- ref country cd,
- prty\_id,
- vhcl brand nm,
- mdl segmentation ctgry,
- mdl\_segmentation\_ctgry\_cd,
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- mdl\_sub\_cd,
- vhcl brand cd,
- mdl cd,
- mdl\_typ,
- vhcl vin id,
- mdl\_probability\_nb,
- mdl\_score\_ranking\_nb,
- mdl\_validity\_start\_dt,
- mdl validity end dt,
- mdl version,

 $\Rightarrow$  make sure to use the right types:

```
ref_country_cd,
prty_id,
cast(null as string) as vhcl brand nm,
cast(null as string) as mdl segmentation ctgrv.
cast(null as string) as mdl segmentation ctgry cd,
cast(null as string) as mdl_sub_typ,
cast(null as int64) as mdl sub cd,
cast(null as string) as vhcl_brand_cd,
14 as mdl cd.
"BRAND AFFINITY" as mdl typ,
cast(null as string) as vhcl_vin_id,
round(renault score, 2) as mdl probability nb,
decile as mdl_score_ranking_nb,
current date() as mdl validity start dt.
date add(current date(), interval 7 day) as mdl validity end dt,
"v0" as mdl version.
```

# Append my results to a3c\_scores table:

- Parameter dataset\_dest = prediction.
- Parameter write disposition = WRITE APPEND.

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#### Create DAGs

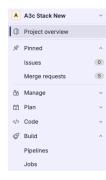
- Create BigQueryPipeline instance with previous configuration.
- Create DAG with make dag dashboard.

```
dag_bqml_brand_affinity_training = BigQueryPipeline(
   conf_dashboard=a3ct_bqml.brand_affinity_training,
   conf_bqml=a3ct_bqml.brand_affinity_training)
)
BRAND_AFFINITY_TRAINING_DAG = dag_bqml_brand_affinity_training.make_dag_dashboard(schedule_interval="0 0 * * 3")
dag_bqml_brand_affinity_predictions = BigQueryPipeline(
   conf_dashboard=a3ct_bqml.brand_affinity_predictions,
   conf_bqml=a3ct_bqml.brand_affinity_predictions
)
BRAND_AFFINITY_PREDICTIONS_DAG = dag_bqml_brand_affinity_predictions.make_dag_dashboard(schedule_interval="0 0 *
```

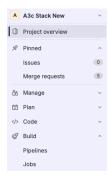
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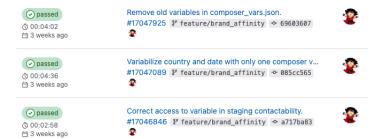
- Push your code branch on GitLab EE.
- Go to the Pipelines page of the A3c Stack New project →



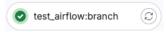
- Push your code branch on GitLab EE.
- Go to the Pipelines page of the A3c Stack New project →



• Click on your most recent pipeline (#17047925):



• Airflow tests must pass.



• Run your utils reporting CI/CD step.



•  $\Rightarrow$  All steps must pass successfully.

• Airflow tests must pass.



• Run your utils\_reporting CI/CD step.



⇒ All steps must pass successfully.

# Failed test (X)

Keep debugging until all tests pass:

- Correct bugs.
- Push code.
- Run all tests.
- Wait for tests to finish.

### Composer

- Go to the dev Composer page.
- Check that your DAGs are listed:



- Click on your DAG.
- Go to the Graph tab.



 $\Rightarrow$  Wait for all steps to pass (shown in green).

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### Add Pub/Sub DAG

# Pub/Sub (Publish/Subscribe)

- Why? Make results available.
- How? Publish them under a Pub/Sub topic.
- Consumers subscribe to the topic.

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### Create Pub/Sub DAG

- Create a Pub/Sub DAG to publish results.
- → Publish my most recent scores from a3c\_scores.

## Pub/Sub (Publish/Subscribe)

- Why? Make results available.
- How? Publish them under a Pub/Sub topic.
- Consumers subscribe to the topic.

### Create Pub/Sub DAG

- Create a Pub/Sub DAG to publish results.
- → Publish my most recent scores from a3c\_scores.

### Trigger Pub/Sub DAG

- Publication must be done after each prediction run.
- ⇒ Trigger Pub/Sub DAG after predictions DAG.

#### How?

### Complete files:

- scoring export dag.py in dags/output.
- 2 BigQueryPipeline.py in dags/utils.
- prep\_dashboard.py in dags/reporting.

#### How?

#### Complete files:

- scoring export dag.py in dags/output.
- BigQueryPipeline.py in dags/utils.
- prep\_dashboard.py in dags/reporting.

### Create Pub/Sub DAG

Call dag\_publish\_to\_pub\_sub in scoring\_export\_dag.py:

```
export_scoring_brand_affinity = dag_publish_to_pub_sub(
    model_code=14,
    model_name="BRAND_AFFINITY",
)
```

• in dags/output folder.

### Trigger Pub/Sub DAG

• Create\* add\_pubsub method in BigQueryPipeline.py file:

```
def add_pubsub(self, trigger_dag_id):
    """
    Add trigger dag run operator as final task
    -------
    :param trigger_dag_id: string
    :return: airflow.models.DAG
    """
    [end] = self._dag.leaves
    end >> TriggerDagRunOperator(
        task_id="trigger_dagrun_export_pubsub",
        trigger_dag_id=trigger_dag_id,
        trigger_rule="all_success",
        dag=self._dag,
    )
```

- \* with Paul Beaujean
- in dags/utils folder.

### Add Pub/Sub DAG to predictions DAG:

Call add pubsub method in prep dashboard.py:

```
dag_bqml_brand_affinity_predictions = BigQueryPipeline(
    conf_dashboard=a3ct_bqml.brand_affinity_predictions,
    conf_bqml=a3ct_bqml.brand_affinity_predictions,
)
brand_affinity_predictions_dag = dag_bqml_brand_affinity_predictions.make_dag_dashboard(
    schedule_interval="0 0 * * 3"
)
brand_affinity_predictions_dag = dag_bqml_brand_affinity_predictions.add_pubsub("ml_brand_affinity_pubsub")
```

• in dags/reporting folder.

#### Caveat!

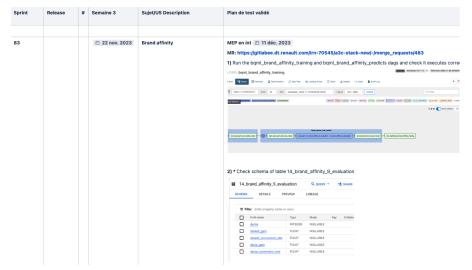
- Modifications in different dags sub-folders.
- ⇒ Run corresponding CI/CD steps.



#### Plan

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- Rebase develop and fix merge conflicts locally.
- Create a Merge Request and assign a DE to it.
- Merge Request = get your commits accepted into develop.
- Fill in planning page at MEP Planning.



#### This is the END!

#### Go have some coffee...

