

Model Experimentation by Parias

Screenshot of all the experiments

The screenshot shows the mlflow Experiments page. On the left, there's a sidebar with 'Experiments' and a search bar. Below it, a list of experiments is shown: 'Default', 'Baseline_model_exp_01' (selected), and 'Baseline_model_exp_02'. The main area displays details for 'Baseline_model_exp_01'. It includes a 'Track machine learning training runs in experiments' message, the experiment ID '1', and a 'Description' section. Below this, there are buttons for 'Refresh', 'Compare', 'Delete', 'Download CSV', and a dropdown for 'Created' (set to 'All time'). A search bar with the query 'metrics.rmse < 1 and params.model = "tree"' is present. The table shows 12 matching runs with columns for 'Created', 'Duration', 'Run Name', 'User', 'Source', 'Version', 'Models', 'Metrics' (AUC, Accuracy, F1), and 'Parameters' (C, CPU Job). The runs are sorted by 'Created' time, showing various models like 'Light Gradient Boosting Machine', 'Naive Bayes', 'Ridge Classifier', 'Linear Discriminant Analysis', 'Logistic Regression', 'Decision Tree', 'Extra Trees', 'Random Forest', 'CatBoost Classifier', and 'Extreme Gradient Boosting'.

Created	Duration	Run Name	User	Source	Version	Models	AUC	Accuracy	F1	C	CPU Job
25 minutes ago	3.1s	Light Gradient Boosting Machine	nightfall	ipykernel_launcher.py	-	sklearn	0.82	0.738	0.762	-	-1
25 minutes ago	211ms	Naive Bayes	nightfall	ipykernel_launcher.py	-	sklearn	0.734	0.666	0.721	-	-
25 minutes ago	194ms	Ridge Classifier	nightfall	ipykernel_launcher.py	-	sklearn	0	0.7	0.727	-	-
25 minutes ago	185ms	Linear Discriminant Analysis	nightfall	ipykernel_launcher.py	-	sklearn	0.773	0.7	0.727	-	-
25 minutes ago	193ms	Logistic Regression	nightfall	ipykernel_launcher.py	-	sklearn	0.783	0.709	0.739	1.0	-
25 minutes ago	217ms	Decision Tree	nightfall	ipykernel_launcher.py	-	sklearn	0.816	0.737	0.757	-	-
25 minutes ago	202ms	Extra Trees	nightfall	ipykernel_launcher.py	-	sklearn	0.817	0.737	0.758	-	-
25 minutes ago	212ms	Random Forest	nightfall	ipykernel_launcher.py	-	sklearn	0.818	0.738	0.759	-	-
25 minutes ago	200ms	Light Gradient Boosting Machine	nightfall	ipykernel_launcher.py	-	sklearn	0.82	0.738	0.762	-	-
25 minutes ago	190ms	CatBoost Classifier	nightfall	ipykernel_launcher.py	-	sklearn	0.82	0.739	0.76	-	-
25 minutes ago	2.2s	Extreme Gradient Boosting	nightfall	ipykernel_launcher.py	-	sklearn	0.82	0.739	0.762	-	-

Screenshot of one experiment with all the artifacts visible

The screenshot shows the mlflow experiment details page for 'Baseline_model_exp_01'. The page title is 'Light Gradient Boosting Machine'. It displays the Run ID: 699b7c6285a949f78549f61255352b31, User: nightfall, Lifecycle Stage: active, Date: 2023-04-16 21:07:08, Duration: 3.1s, Source: ipykernel_launcher.py, and Status: FINISHED. The 'Artifacts' section is expanded, showing a list of artifacts: 'model', 'AUC.png', 'Confusion Matrix.png', 'Feature Importance.png', 'Holdout.html', and 'Results.html'. The 'model' artifact is selected, showing its full path and a 'Register Model' button. Below this, the 'MLflow Model' section provides code snippets for making predictions using the logged model. The 'Model schema' section shows the input and output schema for the model. The 'Make Predictions' section shows the code to load the model and make predictions on a Spark DataFrame.

```
import mlflow
from pyspark.sql.functions import struct, col
logged_model = 'runs:/699b7c6285a949f78549f61255352b31/model1'

# Load model as a Spark UDF. Override result_type if the model does not return double values.
loaded_model = mlflow.pyfunc.spark_udf(spark, model_uri=logged_model, result_type='double')

# Predict on a Spark DataFrame.
df.withColumn('predictions', loaded_model(struct(*map(col, df.columns))))
```

Screenshot of MLflow UI after dropping features

Screenshot of all the experiments

The screenshot shows the MLflow Experiments page for 'Baseline_model_exp_02'. The interface includes a search bar, a list of experiments, and a table of runs. The table columns are: Created, Duration, Run Name, User, Source, Version, Models, Metrics (AUC, Accuracy, F1), and Parameters (C, CPU Job). The table shows 13 matching runs, with the first run being 'Session Init...' and the last run being 'Extreme Gr...'. A 'Load more' button is visible at the bottom of the table.

Created	Duration	Run Name	User	Source	Version	Models	Metrics	Parameters
25 minutes ago		Session Init...	nightfall	ipykern...	-	-	-	-
1 minute ago	4.4s	Light Gradi...	nightfall	ipykern...	-	sklearn	0.821, 0.739, 0.761	-
25 minutes ago	2.7s	Light Gradi...	nightfall	ipykern...	-	sklearn	0.82, 0.739, 0.762	-
25 minutes ago	301ms	Naive Bayes	nightfall	ipykern...	-	sklearn	0.734, 0.672, 0.724	-
25 minutes ago	1.9s	Linear Discr...	nightfall	ipykern...	-	sklearn	0.772, 0.699, 0.726	-
25 minutes ago	4.3s	Ridge Class...	nightfall	ipykern...	-	sklearn	0, 0.699, 0.726	-
25 minutes ago	310ms	Logistic Re...	nightfall	ipykern...	-	sklearn	0.783, 0.709, 0.739	1.0
25 minutes ago	297ms	Decision Tr...	nightfall	ipykern...	-	sklearn	0.816, 0.737, 0.757	-
25 minutes ago	313ms	Extra Trees ...	nightfall	ipykern...	-	sklearn	0.817, 0.737, 0.758	-
25 minutes ago	0.7s	Random Fo...	nightfall	ipykern...	-	sklearn	0.818, 0.738, 0.759	-
25 minutes ago	182ms	CatBoost CL...	nightfall	ipykern...	-	sklearn	0.82, 0.739, 0.76	-
25 minutes ago	226ms	Light Gradi...	nightfall	ipykern...	-	sklearn	0.82, 0.739, 0.762	-
25 minutes ago	3.2s	Extreme Gr...	nightfall	ipykern...	-	sklearn	0.82, 0.739, 0.762	-

Screenshot of one experiment with all the artifacts visible

The screenshot shows the MLflow UI for a specific experiment, 'Light Gradient Boosting Machine'. The interface displays the experiment's metadata, including the Run ID, Date, Source, User, Duration, and Status. Below the metadata, there are tabs for Description, Parameters, Metrics, Tags, and Artifacts. The Artifacts tab is selected, showing a list of artifacts including 'model', 'MLmodel', 'conda.yaml', 'model.pkl', 'python_env.yaml', 'requirements.txt', 'AUC.png', 'Confusion Matrix.png', 'Feature Importance.png', 'Holdout.html', and 'Results.html'. The 'model' artifact is expanded, showing the 'MLflow Model' details, including the code snippets for making predictions using the logged model.

Light Gradient Boosting Machine

Run ID: d9a45e7af2424fd7a4eadf52da819312
Date: 2023-04-16 21:31:47
Source: ipykernel_launcher.py
User: nightfall
Duration: 4.4s
Status: FINISHED
Lifecycle Stage: active
Parent Run: b4dbf413679040b58cd0d33a40639a98

Artifacts

- model
 - MLmodel
 - conda.yaml
 - model.pkl
 - python_env.yaml
 - requirements.txt
 - AUC.png
 - Confusion Matrix.png
 - Feature Importance.png
 - Holdout.html
 - Results.html

MLflow Model

The code snippets below demonstrate how to make predictions using the logged model. You can also register it to the model registry to version control.

Model schema

Input and output schema for your model. [Learn more](#)

Name	Type
No schema. See MLflow docs for how to include input and output schema with your model.	

Make Predictions

Predict on a Spark DataFrame:

```
import mlflow
from pyspark.sql.functions import struct, col
logged_model = 'runs:/d9a45e7af2424fd7a4eadf52da819312/model'

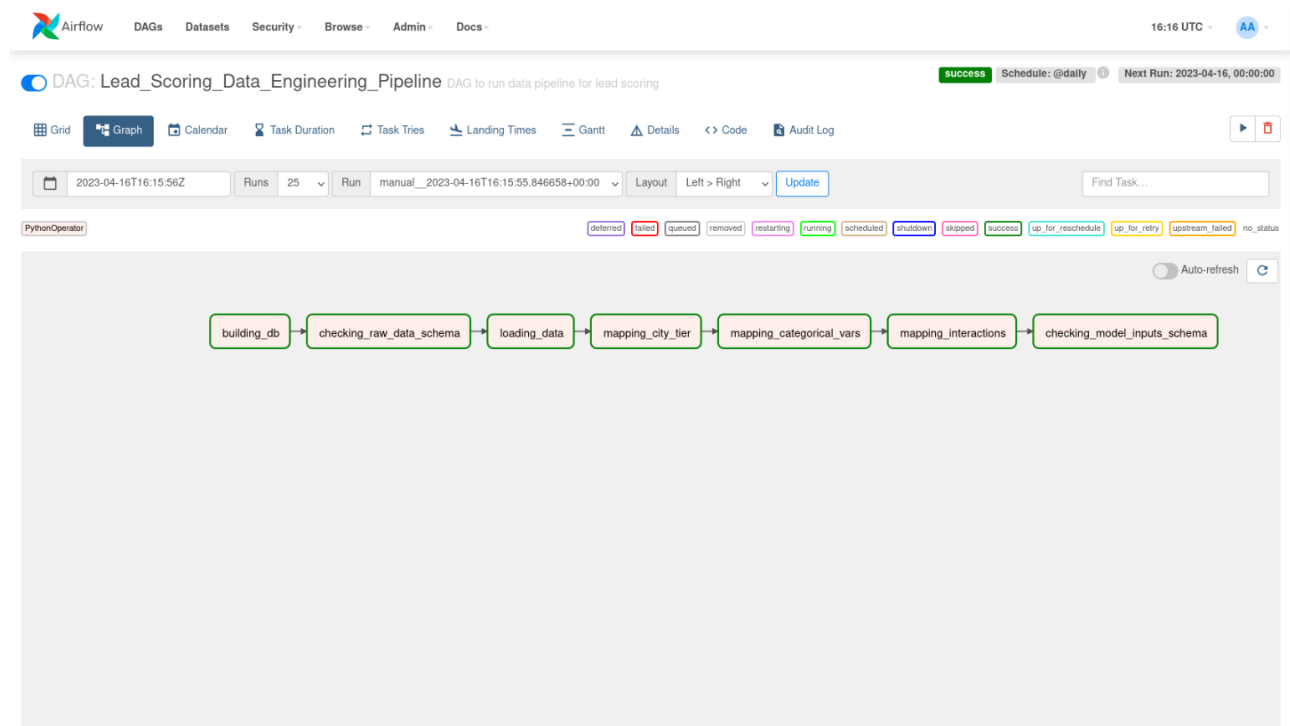
# Load model as a Spark UDF. Override result_type if the model does not return double values.
loaded_model = mlflow.pyfunc.spark_udf(spark, model_uri=logged_model, result_type='double')

# Predict on a Spark DataFrame.
df.withColumn('predictions', loaded_model(struct(*map(col, df.columns))))
```

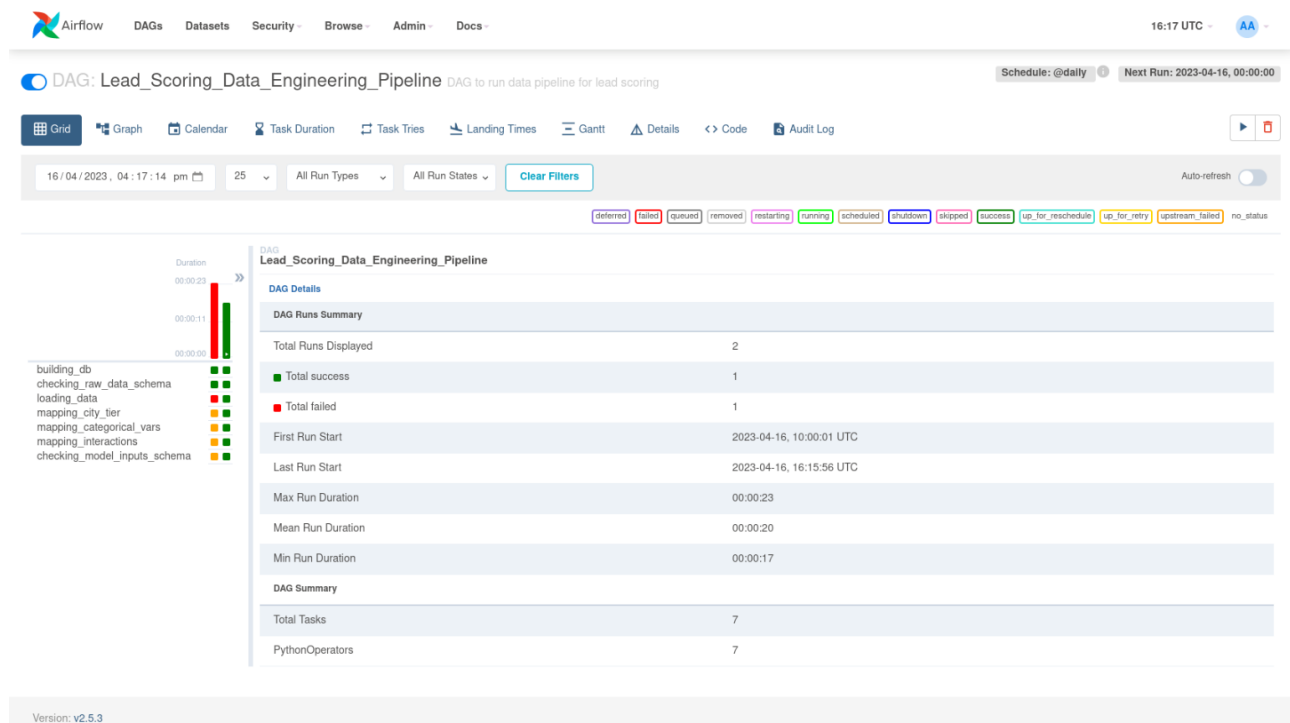
Or predict on a Pandas DataFrame:

Data Pipeline

Screenshot of successful execution Airflow DAG in graph

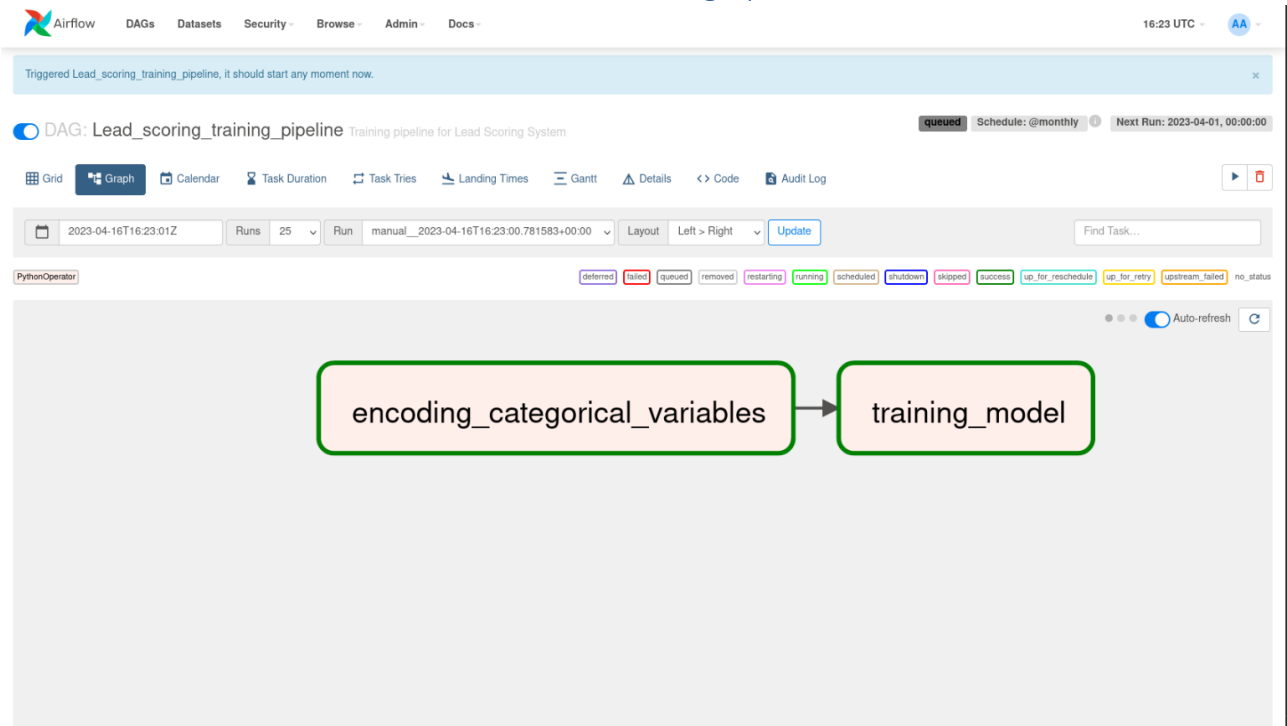


Screenshot of Airflow UI grid

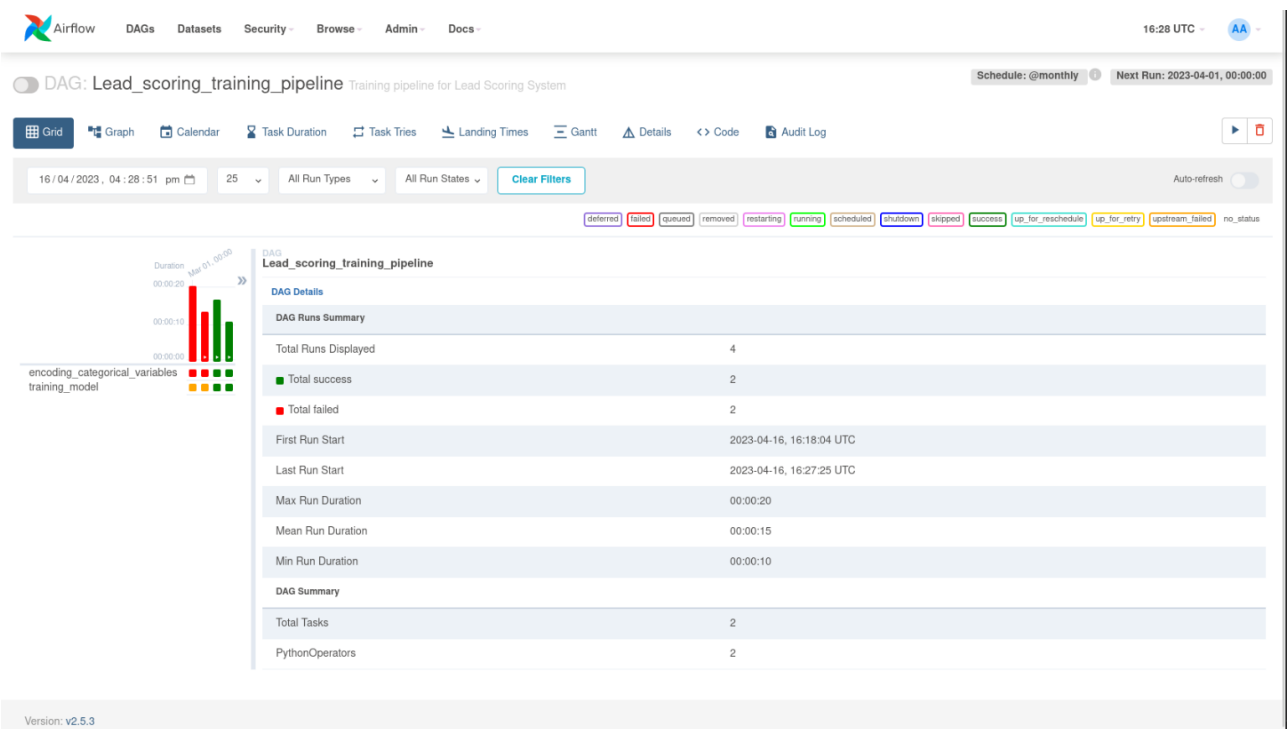


Training pipeline

Screenshot of successful execution Airflow DAG in graph



Screenshot of Airflow UI grid



ML artifacts for training pipeline

Screenshot of experiments with all the artifacts visible

The screenshot displays the MLflow web interface for an experiment named 'Lead_scoring_mlflow_production'. The top navigation bar includes the MLflow logo, version 1.30.0, and tabs for 'Experiments' and 'Models'. The breadcrumb trail shows 'Lead_scoring_mlflow_production' > 'Lead_scoring_mlflow_production1604_2023_00_00_00'. The main header shows the run ID 'Lead_scoring_mlflow_production1604_2023_00_00_00'. Below this, metadata is provided: Run ID: 5a33f1d674894fc0a10ce6d69ec66333, Date: 2023-04-16 21:53:14, Source: airflow, User: nightfall, Duration: 3.8s, and Status: FINISHED. The Lifecycle Stage is active. A sidebar on the left contains expandable sections for Description, Parameters (23), Metrics (9), Tags, and Artifacts. The Artifacts section is expanded, showing a file tree for 'models' with files: MLmodel, conda.yaml, model.pkl, python_env.yaml, and requirements.txt. The main content area shows the 'MLflow Model' section, which includes a description of the model and a 'Make Predictions' section with a code snippet for loading and using the model. The code snippet is as follows:

```
import mlflow
from pyspark.sql.functions import struct, col
logged_model = 'runs:/5a33f1d674894fc0a10ce6d69ec66333/model1s'

# Load model as a Spark UDF. Override result_type if the model does not return double values.
loaded_model = mlflow.pyfunc.spark_udf(spark, model_uri=logged_model, result_type='double')

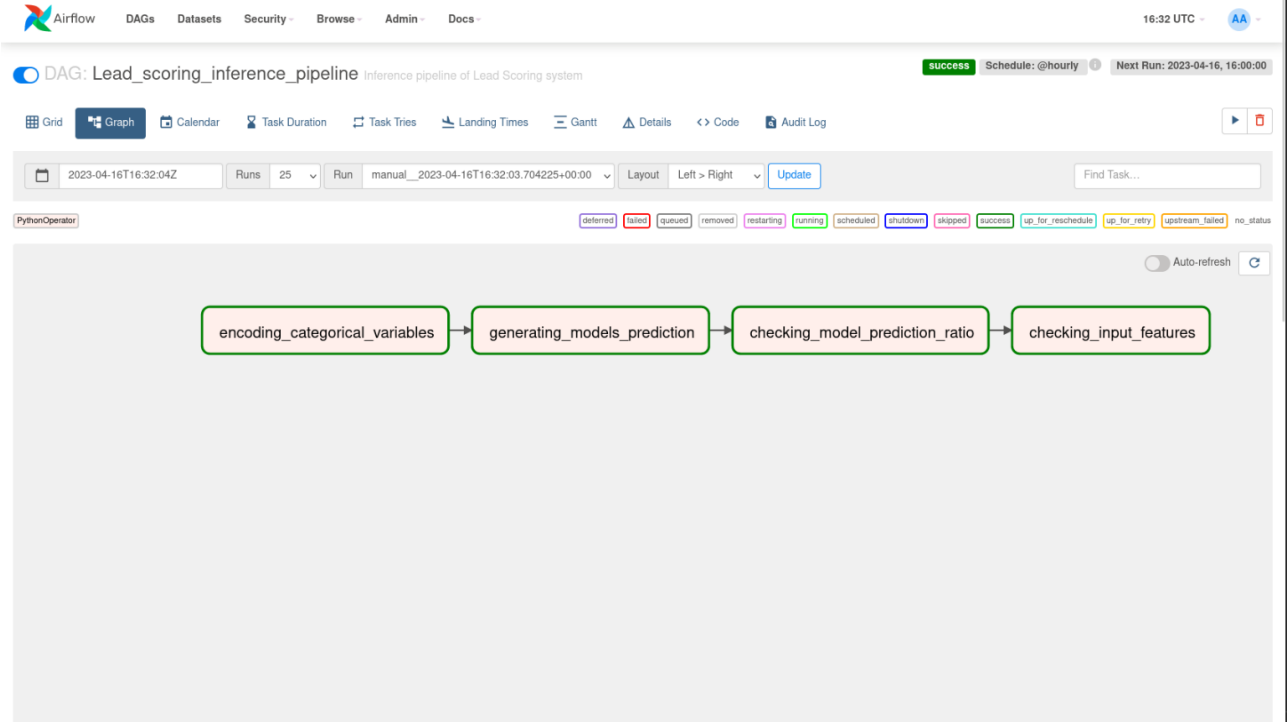
# Predict on a Spark DataFrame.
df.withColumn('predictions', loaded_model(struct(*map(col, df.columns))))
```

Screenshot of model registry with model name and stage as 'production'

The screenshot displays the MLflow web interface for the model registry. The top navigation bar includes the MLflow logo, version 1.30.0, and tabs for 'Experiments' and 'Models'. The breadcrumb trail shows 'Registered Models' > 'LightGBM' > 'Version 2'. The main header shows the model name 'Version 2'. Below this, metadata is provided: Registered At: 2023-04-16 21:57:34, Stage: Production, and Last Modified: 2023-04-16 21:58:10. The Source Run is 'Lead_scoring_mlflow_production1604_2023_00_00_00'. A sidebar on the left contains expandable sections for Description, Tags, and Schema. The Schema section is expanded, showing a table with columns 'Name' and 'Type'. The table is empty, and a message below it states: 'No schema. See MLflow docs for how to include input and output schema with your model.'

Inference Pipeline

Screenshot of successful execution Airflow DAG in graph



Screenshot of Airflow UI grid

