

A new car is in town – Apache Airflow in der Azure Data Factory

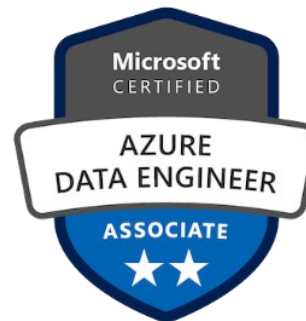
Introducing Apache Airflow Integration in ADF



Stefan Kirner



- › PASS Chapter Lead Karlsruhe ski@sqlpass.de & Beirat
- › Director Business Intelligence scieneers GmbH
- › Twitter: @KirnerKa



Agenda

- Apache Airflow in a nutshell
- Airflow concepts
- Airflow in Azure Data Factory
- Demo
- Comparison Airflow vs. ADF pipelines
- Best fit use cases for Airflow in ADF
- Bugs, Alternatives, Links

Apache Airflow in a nutshell

What is it and how does it work?

What is Airflow?

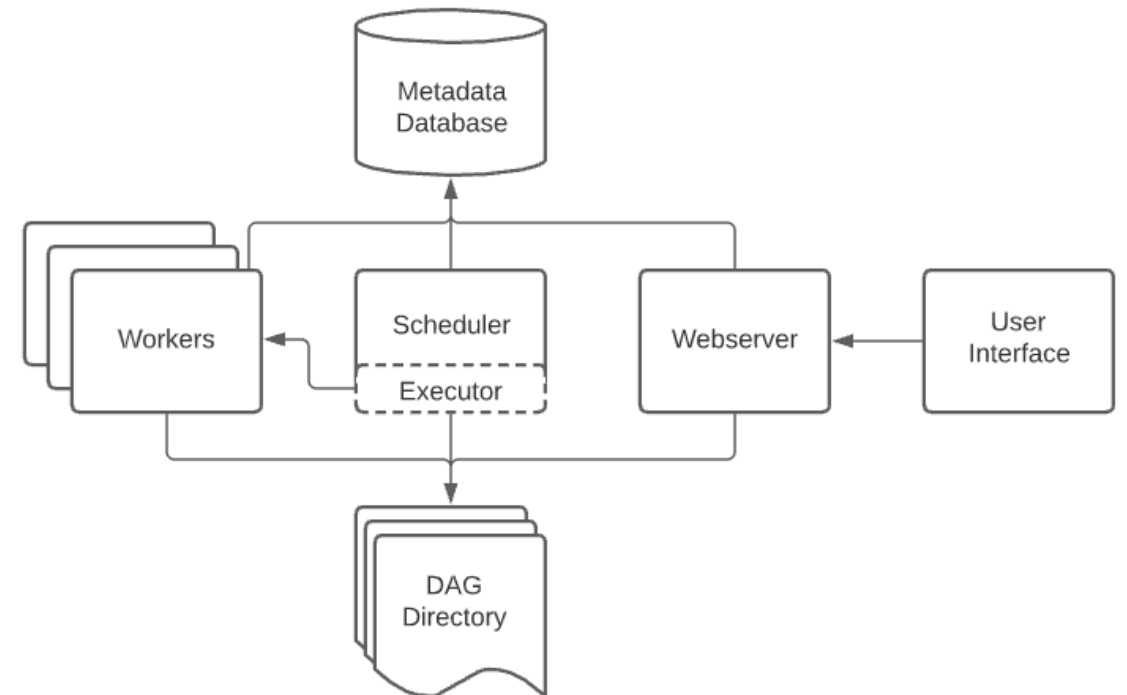
- Platform for authoring, scheduling & monitoring workflows
- Open-Source
- Widely used – 16 Mio downloads / month
- Code-centric – using Python language
- Execute nearly anything in any environment (using Python)
- Extensible by own operators, executors and libraries
- Scalable

What is Airflow **not**?

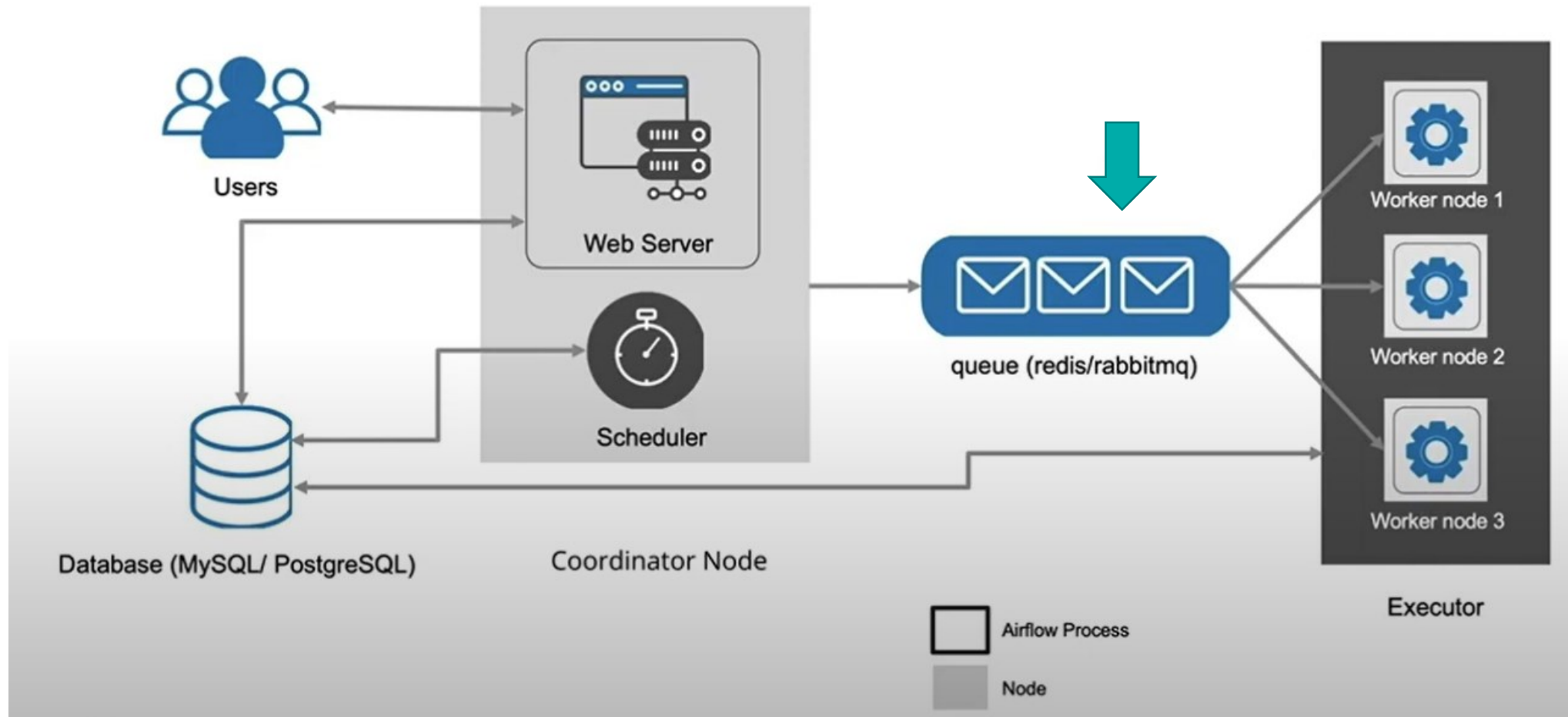
- No GUI-based ETL Tool
- No special support for ETL functionality
 - like parallel threaded bulk load, schema or surrogate key creation
- Not very lightweight (# of components to operate)

Airflow systems architecture overview

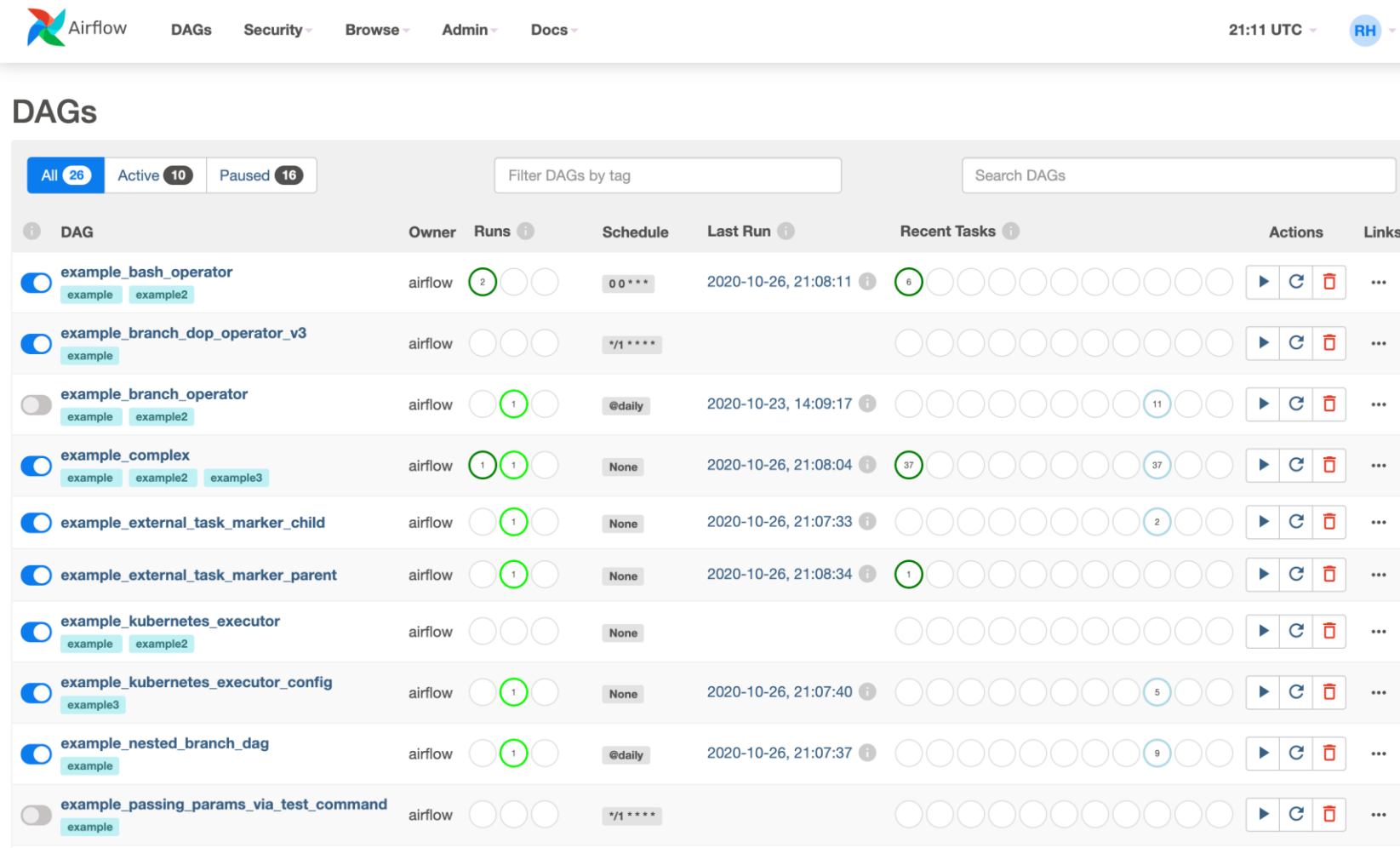
- **Scheduler:** triggering scheduled workflows, and submitting tasks to the executor
- **Executor:** do the work – itself or push it to workers
- **Webserver:** user interface
- **DAG Directory:** folder of DAG files
- **metadata database:** storing state by the components



Airflow systems architecture detailed sample



How does this fancy user interface look?



The screenshot shows the Apache Airflow web interface. At the top, there is a navigation bar with the Airflow logo, menu items for DAGs, Security, Browse, Admin, and Docs, the current time (21:11 UTC), and a user profile icon (RH). Below the navigation bar, the main heading is "DAGs".

The DAGs list is filtered to show "All 26" DAGs, with "Active 10" and "Paused 16" counts. There is a search bar for DAGs and a filter input for tags. The table below lists the DAGs with their status, owner, runs, schedule, last run, recent tasks, and actions.

DAG	Owner	Runs	Schedule	Last Run	Recent Tasks	Actions	Links
<input checked="" type="checkbox"/> example_bash_operator <small>example example2</small>	airflow	2	0 0 ***	2020-10-26, 21:08:11	6	[▶] [↺] [🗑️]	...
<input checked="" type="checkbox"/> example_branch_dop_operator_v3 <small>example</small>	airflow	0	* / 1 * * * *			[▶] [↺] [🗑️]	...
<input type="checkbox"/> example_branch_operator <small>example example2</small>	airflow	1	@daily	2020-10-23, 14:09:17	11	[▶] [↺] [🗑️]	...
<input checked="" type="checkbox"/> example_complex <small>example example2 example3</small>	airflow	1	None	2020-10-26, 21:08:04	37	[▶] [↺] [🗑️]	...
<input checked="" type="checkbox"/> example_external_task_marker_child	airflow	1	None	2020-10-26, 21:07:33	2	[▶] [↺] [🗑️]	...
<input checked="" type="checkbox"/> example_external_task_marker_parent	airflow	1	None	2020-10-26, 21:08:34	1	[▶] [↺] [🗑️]	...
<input checked="" type="checkbox"/> example_kubernetes_executor <small>example example2</small>	airflow	0	None			[▶] [↺] [🗑️]	...
<input checked="" type="checkbox"/> example_kubernetes_executor_config <small>example3</small>	airflow	1	None	2020-10-26, 21:07:40	5	[▶] [↺] [🗑️]	...
<input checked="" type="checkbox"/> example_nested_branch_dag <small>example</small>	airflow	1	@daily	2020-10-26, 21:07:37	9	[▶] [↺] [🗑️]	...
<input type="checkbox"/> example_passing_params_via_test_command <small>example</small>	airflow	0	* / 1 * * * *			[▶] [↺] [🗑️]	...

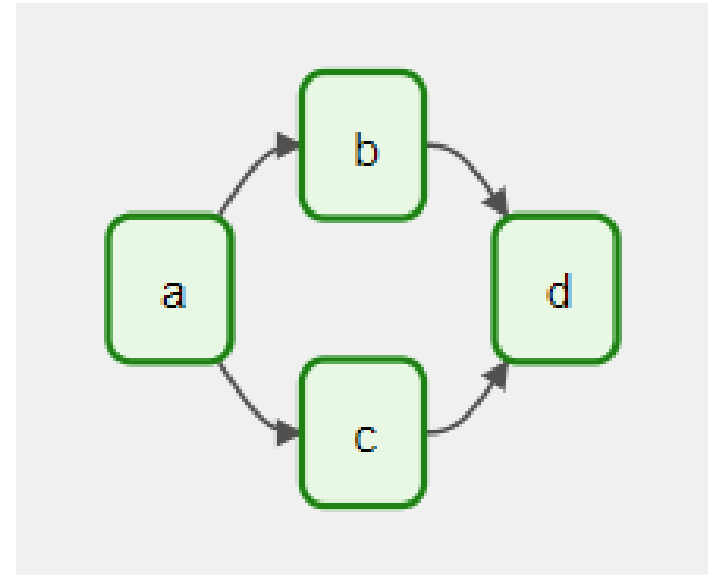


Airflow concepts

Building blocks

What are Directed Acyclic Graphs (DAGs)

- Graph consists of edges and nodes
- Each edge point towards a node
- Directed means that no cycles formed by the edges



<https://airflow.apache.org/docs/apache-airflow/stable/core-concepts/dags.html>

DAGs in Airflow

- Collection of **tasks**
- Authored in Python
- Define running order and dependencies of tasks
- Scheduling and number of repeats defined
- DAGRun: instance of a DAG at runtime

```
import datetime

from airflow import DAG
from airflow.operators.empty import EmptyOperator

with DAG(
    dag_id="my_dag_name",
    start_date=datetime.datetime(2021, 1, 1),
    schedule="@daily",
):
    EmptyOperator(task_id="task")
```

<https://airflow.apache.org/docs/apache-airflow/stable/core-concepts/dags.html>

Tasks / Workloads

- Operators
 - Template for a predefined task like Bash, Python, Email or Database functionality
 - E.g. MsSqlOperator, S3FileTransformOperator...
- Sensors
 - Special operator type waiting for events like a new file occurs
- TaskFlow
 - Packaged custom python functions

Scheduling & Dependencies

- Time based schedules
- Sensor (event) based schedules
- Any kind of dependencies of tasks possible
- Grouping of tasks
- Branching
- Schedules on update of datasets

Datasets

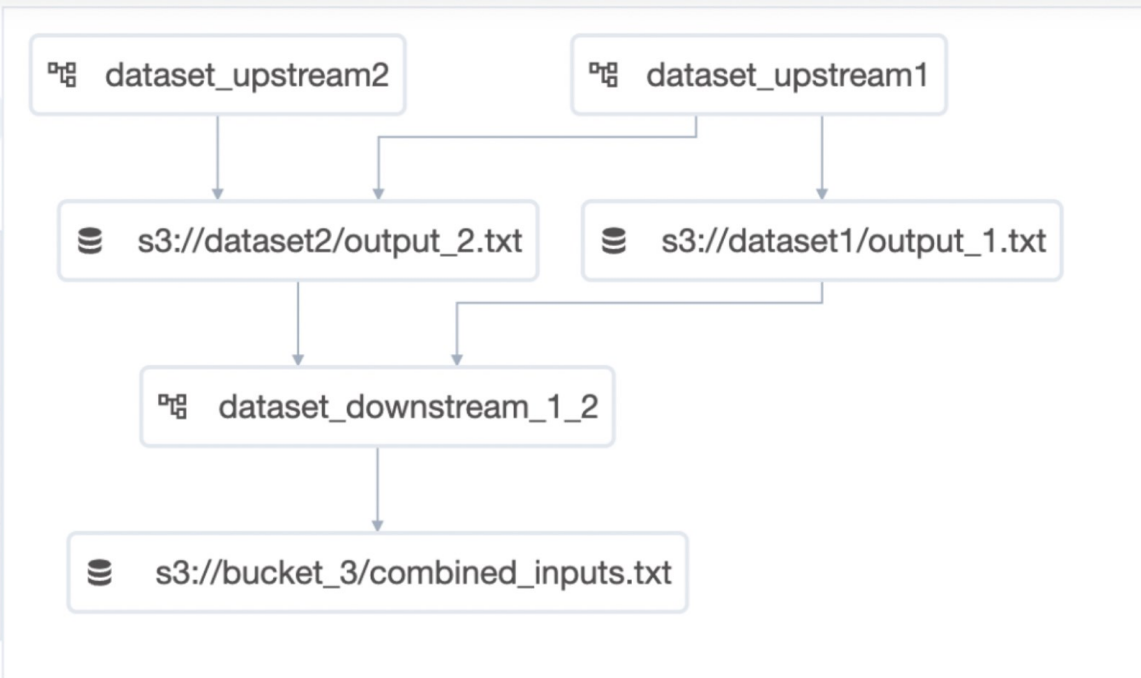
Airflow **DAGs** **Datasets** Security ▾ Browse ▾ Admin ▾ Docs ▾ Astronomer ▾

Datasets

Filter datasets with updates in the past: All Time 30 days 7 days 24 hours **1 hour**

Search by URI...

URI ↕	LAST UPDATE ▾
s3://bucket_3/combined_inputs.txt Total Updates: 1	2022-12-11, 17:45:38 UTC
s3://bucket_1/output_1.txt Total Updates: 2	2022-12-11, 17:45:28 UTC
s3://bucket_2/output_2.txt Total Updates: 2	2022-12-11, 17:45:26 UTC



Secure Strings & Connections

List Variable

Search ▾

+ Actions ▾ ←

<input type="checkbox"/>									Key ↑
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	azure_blob_connection_string
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	twitter_access_key
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	twitter_access_secret
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	twitter_consumer_key
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	twitter_consumer_secret

List Connection

Search ▾

+ Actions ▾ ←

<input type="checkbox"/>									Conn Id ↓
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	airflow_db
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	aws_default
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	azure_batch_default
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	azure_cosmos_default
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	azure_data_explorer_default
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	azure_data_lake_default

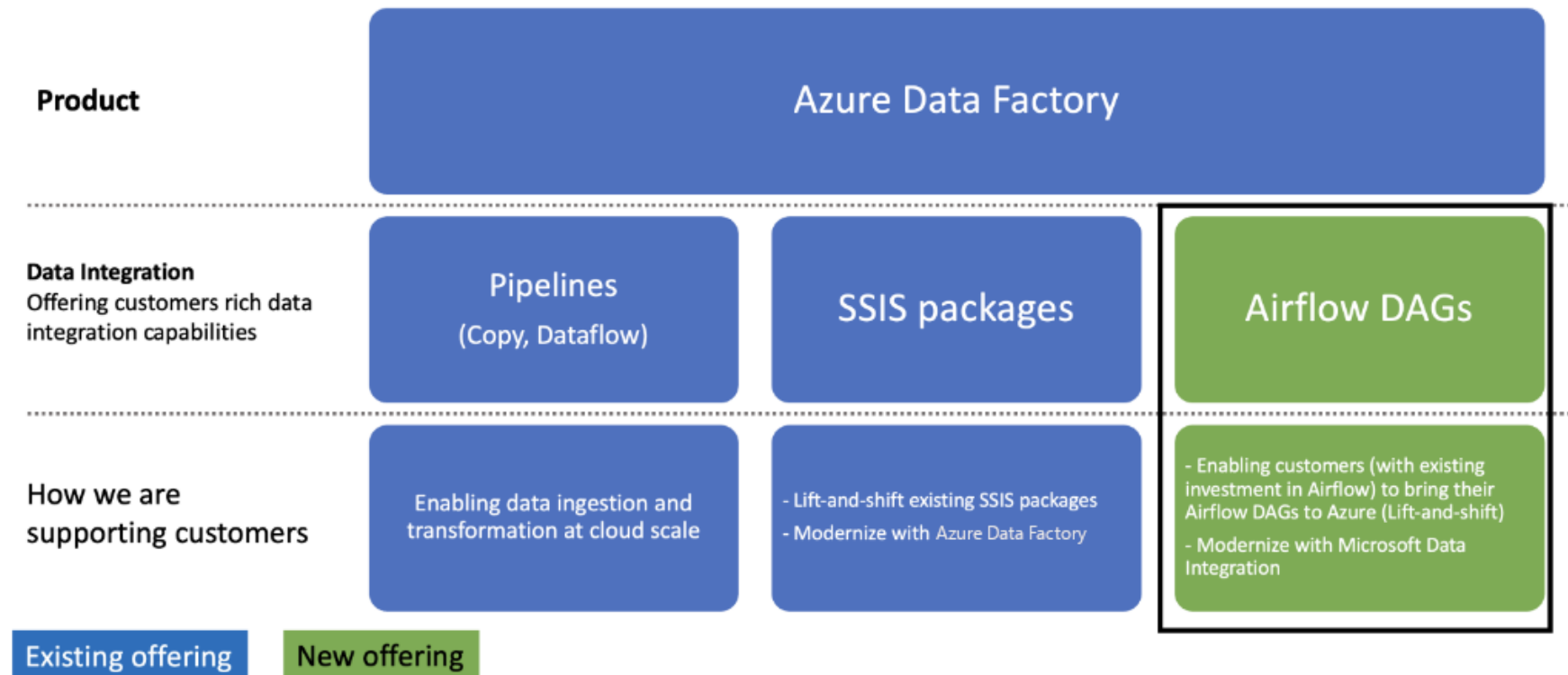
Airflow in der Azure Data Factory

How does this fit in?



Available runtimes in Azure Data Factory

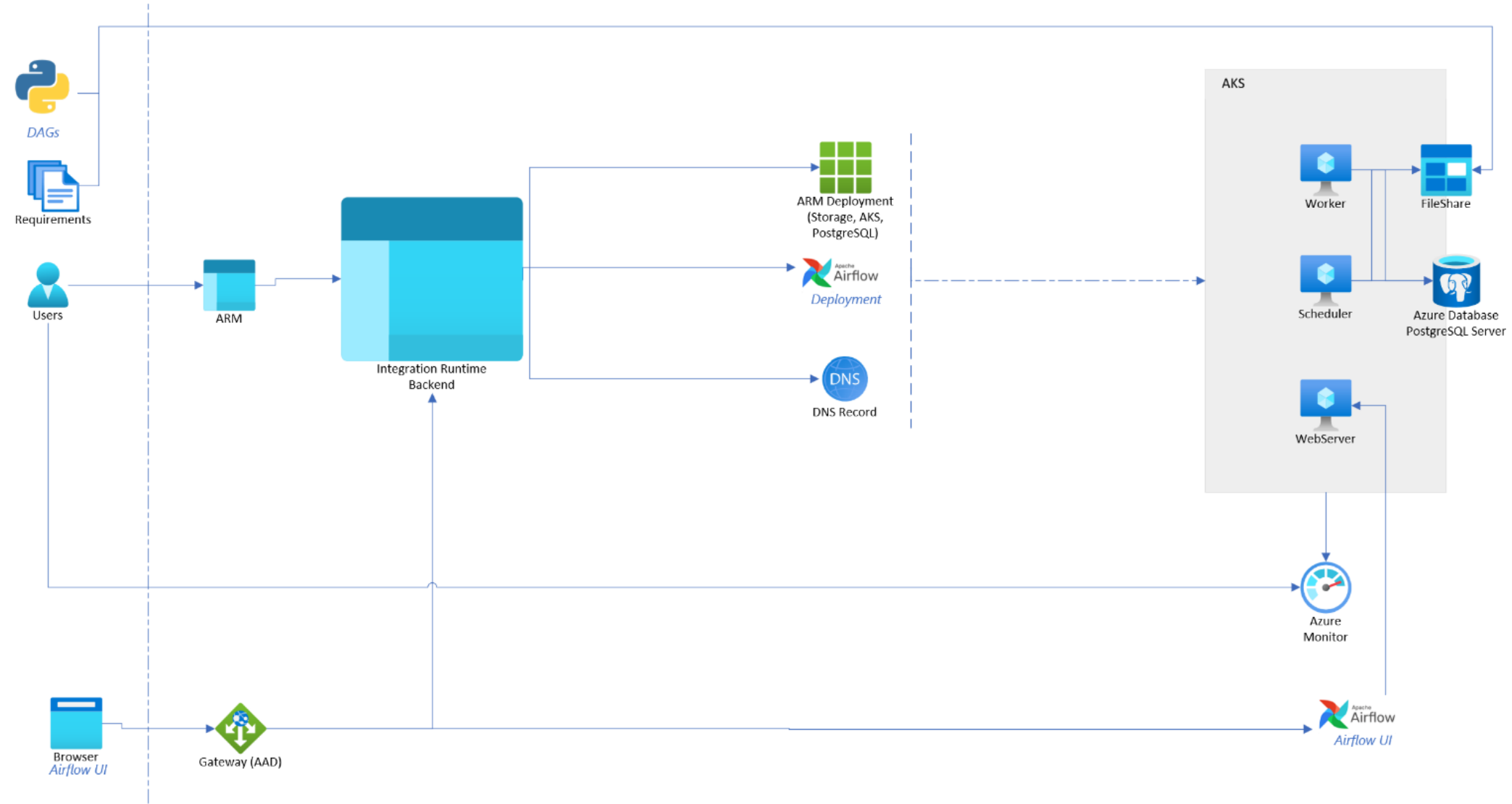
Open Data Integration
Supporting multi-orchestration capabilities



Features of Airflow in Azure Data Factory

- System managed for you by MS
- Fast and simple deployment (of airflow environment itself)
- Azure Active Directory integration
- Metadata encryption
- Azure Monitoring and alerting
- Managed Virtual Network integration (not yet)

Systems architecture on Azure



Adding provider packages

„requirements.txt“ in ADF GUI

Update all Publish all

Airflow

+ New Refresh

Filter by name

Showing 1 - 7 of 7 items

Name	Status	Region
Airflow1	Running	East US
Airflow3	Running	East US
Airflow4	Running	East US
Airflow5	Running	East US
AirflowBasicAuth	Running	East US
AirflowEnv1	Running	East US
integrationRuntime1	Running	East US



Edit airflow environment

Use this interface to setup and create your Airflow integration runtime environment

Name

AirflowEnv1

Description

Enter description here...

Airflow auth type

Azure AD authentication

Region

East US

Compute size

Large (scheduler:3, webserver:1, worker: 6)

Extra nodes

4

Airflow version

2.2.2

Environment variables

+ New

Airflow requirements

apache-airflow-providers-microsoft-azure

Application Lifecycle Management

- Manual:
 - Development with VS.Code etc.
 - Deployment upload to Azure Blob Store
 - Import to filesystem of airflow runtime (GUI only yet)
 - Refresh airflow GUI and check for errors
 - Difficult to automate deployment at the moment
- Git Hub Repo Sync (new)
 - Enable git sync feature while creating IR
 - Files will be updated
 - Or use Rest API for airflow in ADF
 - Should work w/o local dev environment (?)

Limitations (10 / 2023)

- Limited access to work folders
- Only limited regions supported
- Limited connectivity to on-premises data sources
 - (no SHIR support, VPN necessary for on-premises sources)
- Limitations for Blob Storage and ADLS support
 - Blob Storage behind Vnet not yet supported
 - Firewall whitelisting in other services possible using private IP address for airflow runtime

Costs (12/2023)

Size	Workflow Capacity	Scheduler vCPU	Worker vCPU	Web Server vCPU	Price per Hour
Small (D2v4)	Up to 50 DAGs	2	2	2	\$0.49
Large (D4v4)	Up to 1,000 DAGs	4	4	4	\$0.99

Additional node	Worker vCPU	Price per Hour
Small (D2v4)	2	\$0.055
Large (D4v4)	4	\$0.22

Small
per Day: ~12\$ Month: ~353\$

Large
per Day: ~24\$ Month: ~730\$

Instances **cannot** not be **paused**. Auto-scaling not available, yet.

A group of five people are gathered around a computer monitor in what appears to be a meeting or training session. A man with curly brown hair, wearing a dark blue jacket, is pointing his right hand towards the screen. He has a focused expression. Behind him, a woman with long blonde hair and glasses is looking at the screen. To her left, a man with a beard and dark hair is also looking towards the screen. In the background, another man is partially visible. On the far right, the face of a man with glasses is partially visible. The overall scene is dimly lit, with the primary light source coming from the screen area.

Demo

Airflow in Azure Data Factory

Airflow vs. ADF GUI

Comparing functionality of
Airflow and pipelines / triggers



Airflow vs. Azure Data Factory pipelines

Airflow in ADF	ADF pipelines & triggers
Focus on scheduling & orchestration	Focus on ETL/ELT
Python knowledge needed	Easy to learn and use
Github sync as new feature	built-in Git and CI/CD support
Billed by run time of environment – not pausable	Cost-effective – pay what you need
Many plug-and-play operators – adaptable	Built-in connectivity to 90 data sources
	Fast and secure gateway to on-prem data sources
No such certificates	Compliance: HIPAA, GDPR, ISO 27001, others
Scale out using external infrastructure (Databricks etc), auto-scale of airflow instance announced for GA	Scale out included (copy, mapping data flows) and optional external infrastructure



Use cases Airflow in ADF

Why should I use airflow in Azure Data Factory?

Best fit use cases for Airflow in ADF

- Lift & shift from existing on-premises environments
- Experienced team working completely in Python
 - Single stack
 - Data Science / Machine Learning projects
- No sufficient operations skills to run Airflow by yourself
- Very complicated dependencies of many processes
- Lots of testing of the scheduling and dependencies itself is necessary
- Using Airflow for enterprise orchestration which also calls ADF pipelines

The image features two yellow directional signs mounted on a single metal post. The top sign is a right-pointing arrow, and the bottom sign is a left-pointing arrow. The background is a clear blue sky with scattered white clouds, and a green field is visible at the bottom. The text "Known bugs, alternatives, links" is overlaid in white on the top sign.

Known bugs, alternatives,
links

Bugs & fails of current state

- No full access to managed resources reduces usability
- Publishing DAGs manually is cumbersome (give github Sync a try)
- Deletion of DAG only works in ADF GUI, not works in airflow
- Auto-Refresh not working in airflow GUI
- Connections – error when creating connections
- MS Documentation insufficient
- Airflow runtime cannot be paused
- ...but development ongoing (gitsync, Azure Key Vault Integration...)

Alternatives to run airflow on Azure

- Using managed service from Astronomer on your Azure Tenant <https://www.astronomer.io/>
- Announced at Ignite 2023: Native Apache Airflow Service from Astronomer on Azure (Preview) – derzeit kostenlos nutzbar
- Run as Docker Images on Kubernetes cluster
- Run as VMs on Azure

Links which helped me to get in

- Microsofts Docs Airflow in ADF
 - <https://learn.microsoft.com/en-us/azure/data-factory/concept-managed-airflow>
- Apache Airflow Docs
 - <https://airflow.apache.org/docs/apache-airflow/2.4.3/>
- Microsoft Reactor
 - <https://www.youtube.com/live/DLBY8xfhlsQ?feature=share>
- Airflow 101 Turtorial
 - https://www.youtube.com/watch?v=4_lfm4PNRyg&list=PLY-S9rU4aY6Y39ITqY6WVN-eph3QvzWw4&index=1
- Brian Cafferky – Reasons for not using Airflow
 - https://www.youtube.com/watch?v=YQ056EKzCyw&list=PL7_h0bRfL52pygj88FC1laf9F1q7FWnZM



Questions?



Thanks for your attention, I appreciate your feedback!