

Data Engineering Batch 1

PROJECT 2

Data Processing Pipeline

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Project statement

Implement a serverless data processing pipeline where Azure Data Factory orchestrates data workflows, and Azure Databricks is used as a serverless processing engine for on-demand analytics and transformations.

Project Overview

This project establishes a serverless code analysis pipeline in Azure. By leveraging Azure Data Factory (ADF), code seamlessly moves from a GitHub repository to secure Azure Blob Storage. Azure Databricks, empowered by PySpark, then analyses the data, offering valuable insights into functionality, quality, and potential issues. This automated process streamlines data analysis, reduces manual intervention, and fosters data-driven decision-making for developers.

About the Project

Dataset:

This dataset, named "organisations", contains information about 10,000 organisations. It was downloaded from the website Datablist: <https://www.datablist.com/> and is formatted as a comma-separated values (CSV) file with the following schema:

Attributes:

Index: An integer representing the unique identifier for each organisation within the dataset.

Organization Id: A unique identifier for each organisation, potentially in a non-human-readable format.

Name: The official name of the organisation.

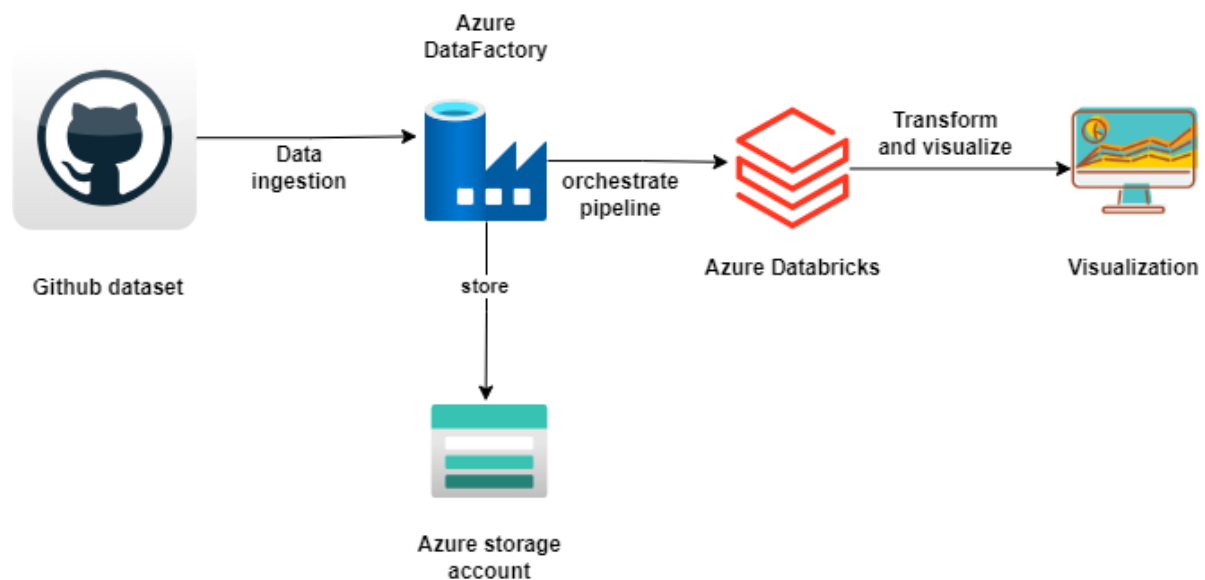
Website: The organisation's website URL (if available).

Country: The country in which the organisation is headquartered.

Description: A brief description of the organisation's activities or mission.

Number of employees: The approximate number of employees working for the organisation (may not be entirely accurate)

Architecture



The architectural diagram depicts a systematic approach to data processing and analysis within the project. It begins with the acquisition of code from a GitHub repository, facilitated by Azure Data Factory (ADF). ADF orchestrates the transfer of code to Azure Blob Storage, where it is securely stored for further processing. Azure Databricks workspace is then provisioned to handle data processing tasks efficiently. Within the workspace, a Notebook activity configured within ADF executes PySpark code responsible for data analysis. This PySpark code loads the code data from Blob Storage into Spark DataFrame, conducts necessary transformations, and performs analysis using PySpark libraries. The results of this analysis are visualized using tools available within Azure Databricks, with options for generating visualizations such as pie charts to represent the code analysis findings. Additionally, if required, the processed data or analysis results can be stored back to Blob Storage for future reference or sharing.

Azure Resources Used for This Project

- **Azure Data Factory (ADF):**

An ADF instance will be created to orchestrate and automate the data transfer process between GitHub and Azure Blob Storage.

Linked Services: Configured to connect to GitHub using an appropriate authentication method (e.g., personal access token, OAuth) and Azure Blob Storage.

Datasets: Defined to represent the schema of the code files (e.g., text format) in the GitHub repository.

Pipelines: Created to define the sequence of activities for copying code from the GitHub repository to a specific blob storage container.

- **Azure Blob Storage:**

A blob storage container will be used as the destination for storing code transferred from the GitHub repository.

This stored code will be accessed by Azure Databricks for data processing tasks.

- **Azure Databricks:**

A Databricks workspace will be provisioned to perform data processing tasks using PySpark.

Databricks Notebooks: Utilized to write and execute PySpark code for code analysis, including tasks like:

Extracting data from the code files (e.g., lines of code, function names, comments).

Performing data transformations and cleaning (e.g., removing irrelevant content, formatting code).

Project Requirements

- **Data Source:**

Type: Identify the specific source of your code, such as a GitHub repository, Azure DevOps repository, or a local file system.

Connectivity: Ensure you have the necessary credentials and access methods to securely connect to this source from the Azure environment.

- **Azure Data Factory (ADF) Configuration:**

Instance: Create an Azure Data Factory (ADF) instance within your Azure subscription.

Linked Services:

Configure a linked service to connect to the GitHub repository using an appropriate authentication method (e.g., personal access token, OAuth).

Configure a linked service to connect to Azure Blob Storage for storing the transferred code.

Datasets: Define a dataset in ADF to represent the schema of the code files (e.g., text format) from the source location.

Pipelines: Create a pipeline in ADF to define the data transfer process:

Use a Copy Activity to copy code from the source location (e.g., GitHub repository) to a specific blob storage container.

Configure the copy activity with source and destination details, scheduling options (e.g., daily), and error handling mechanisms.

- **Data Storage:**

Azure Blob Storage: Utilize a blob storage container as the destination for storing the transferred code retrieved through ADF. This stored code will be accessed by Azure Databricks for further processing.

- **Data Processing with Azure Databricks:**

Provision an Azure Databricks workspace in your Azure subscription.

Define and implement data processing tasks using PySpark within the Databricks environment. PySpark provides a powerful framework for distributed data processing, enabling tasks such as data cleaning, transformation, aggregation, and analysis.

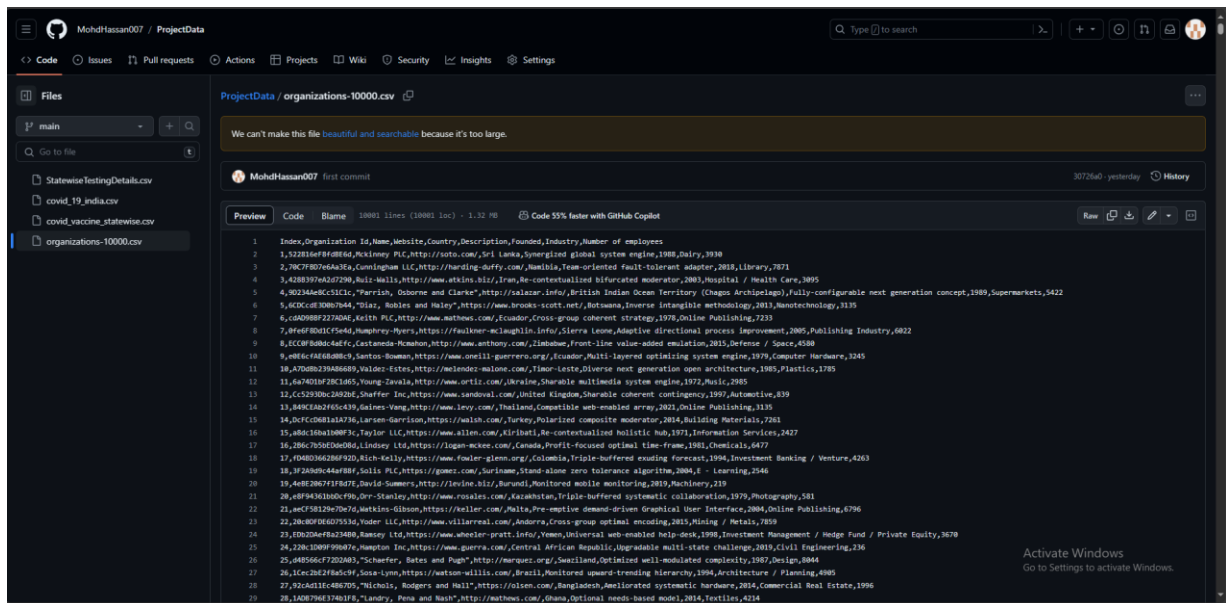
Use Databricks notebooks to write and execute PySpark code interactively, leveraging the scalability and performance of the Databricks runtime.

Tasks performed:

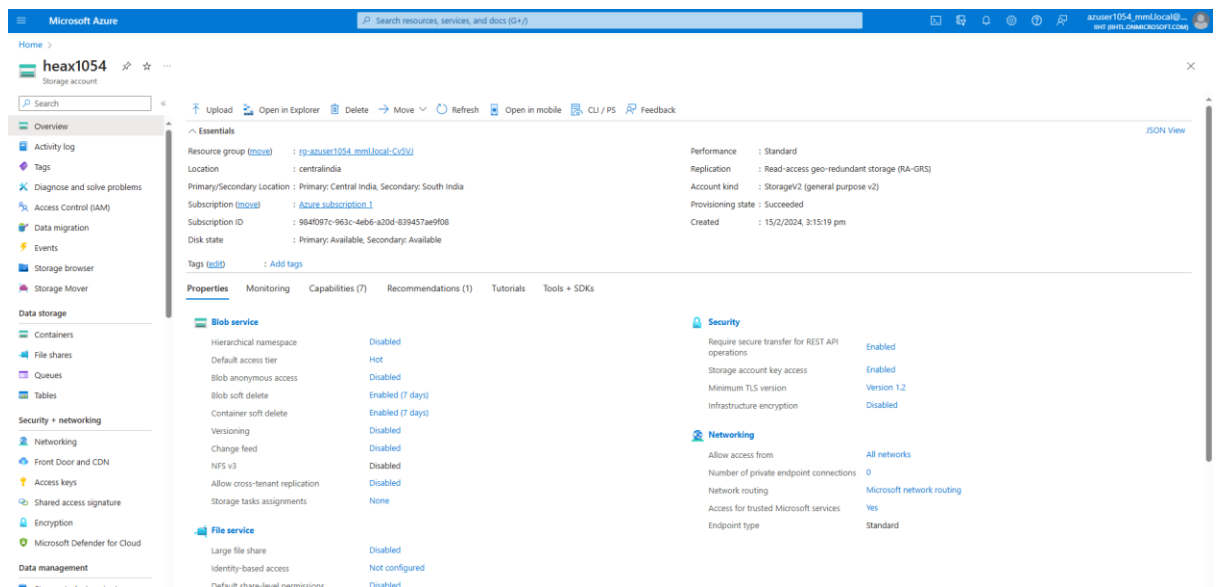
- Acquire data: Retrieve code from a GitHub repository.
- Transfer data: Utilize Azure Data Factory (ADF) to orchestrate the transfer of code from GitHub to Azure Blob Storage.
- Store data: Utilize Azure Blob Storage to securely store the transferred data.
- Process data:
- Provision an Azure Databricks workspace.
- Within ADF, add a Notebook activity: Configure the activity to use your Databricks workspace and specify the PySpark notebook responsible for code analysis.
- Within the PySpark notebook:
- Load data from Blob Storage into a Spark DataFrame.
- Implement data transformations and analysis using PySpark libraries.
- Visualize data: Generate visualizations (e.g., pie charts) depicting the results of code analysis using libraries within Databricks.

Implementation

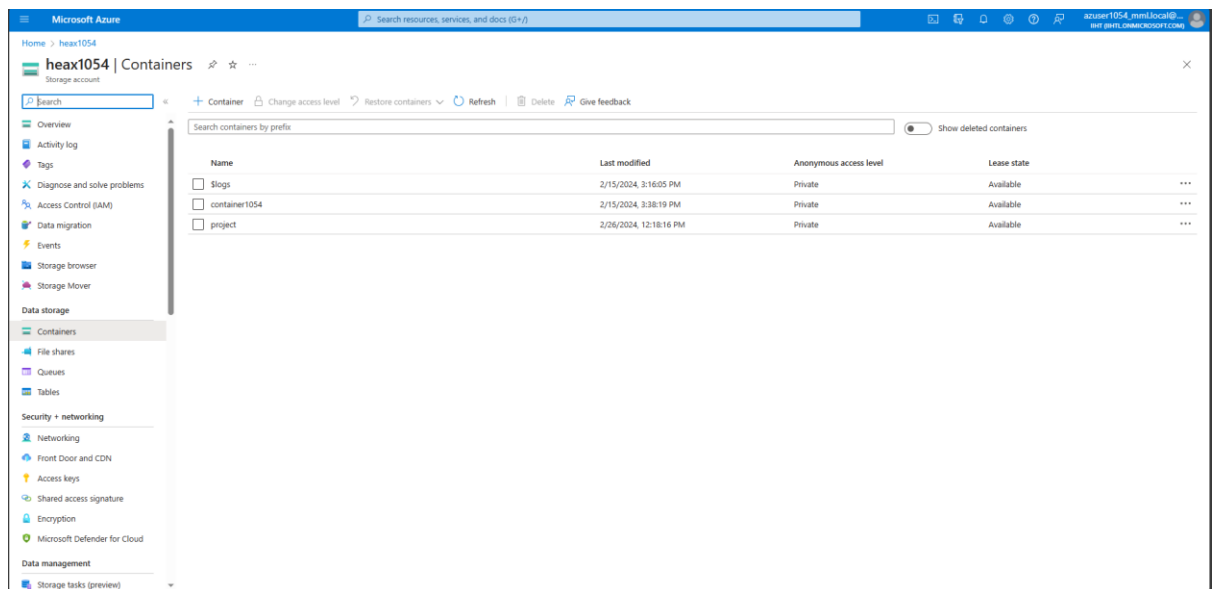
- CSV data on github



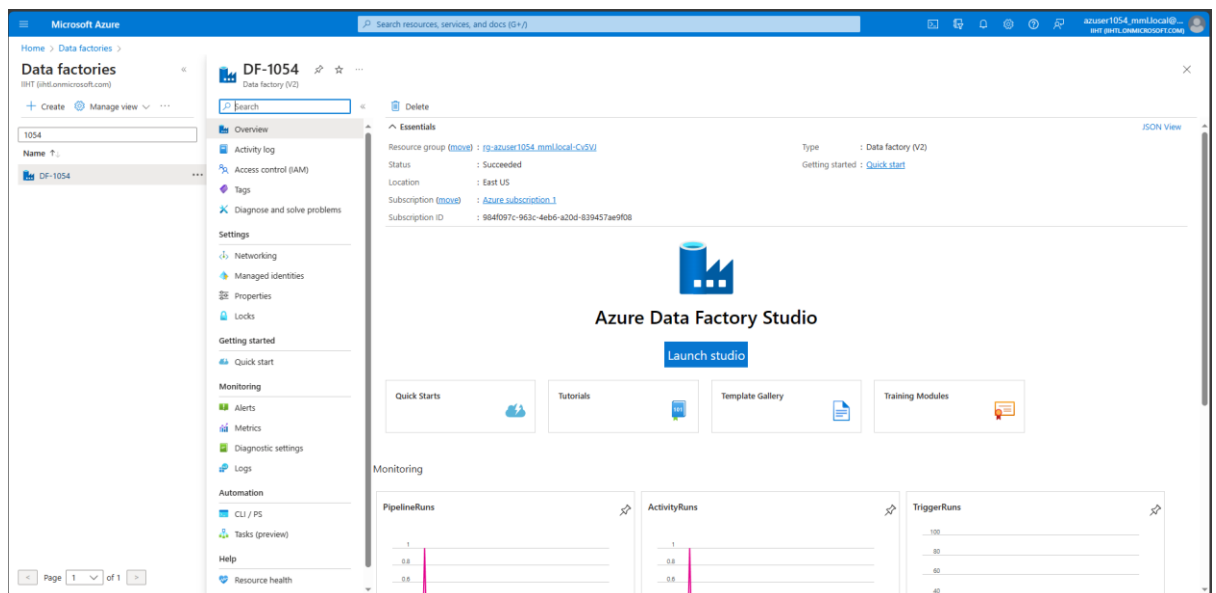
- In azure ,create a storage account mentioning the location



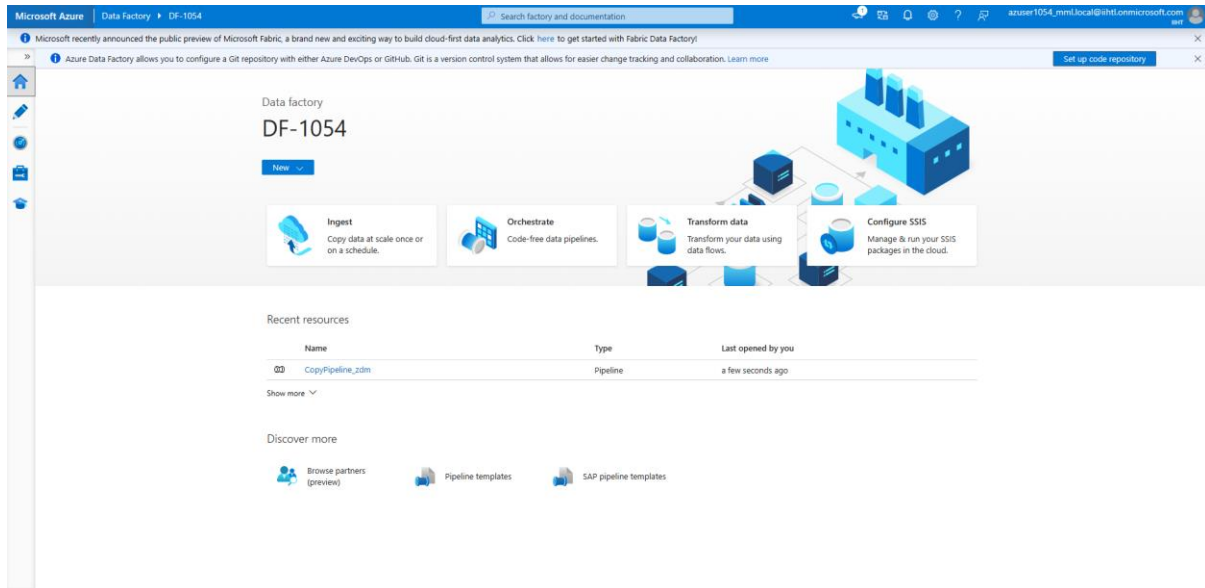
- create a new blob container



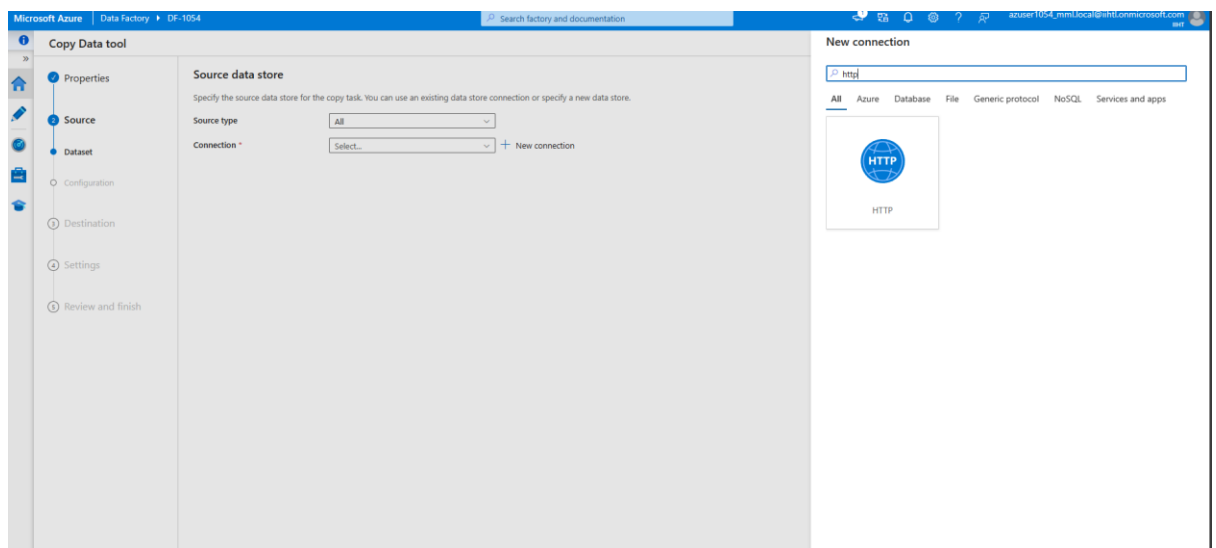
- create a azure data factory account



- select ingest data to create a new data pipeline



- For Source click on new connection and type http



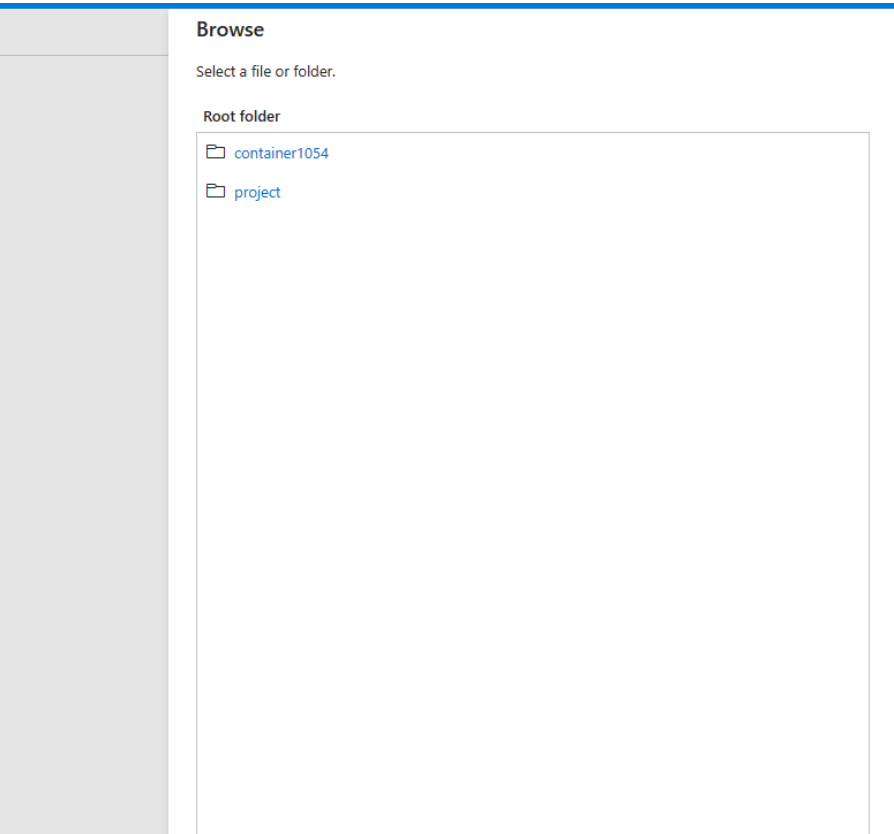
- Copy and paste the raw url of the csv file

The screenshot shows the 'Copy Data tool' configuration page in Microsoft Azure Data Factory. The left sidebar indicates the 'Source' step is selected. The main area is titled 'Source data store' and contains fields for 'Source type' (set to 'All') and 'Connection' (set to 'Select...'). A 'New connection' button is visible. The right sidebar shows the 'New connection' configuration for an 'HTTP' connection. Fields include 'Name' (HttpServer1), 'Description', 'Connect via integration runtime' (set to 'AutoResolveIntegrationRuntime'), 'Base URL' (https://raw.githubusercontent.com/MohdHassan007/ProjectData/main/organizations-10000...), 'Server Certificate Validation' (set to 'Enable'), and 'Authentication type' (set to 'Anonymous'). At the bottom, there are 'Create', 'Back', 'Test connection', and 'Cancel' buttons.



- Create a connection for destination blob storage

The screenshot shows the 'Copy Data tool' configuration page in Microsoft Azure Data Factory, specifically for the 'Destination' step. The left sidebar indicates the 'Destination' step is selected. The main area is titled 'Destination data store' and contains fields for 'Destination type' (set to 'All') and 'Connection' (set to 'Select...'). A 'New connection' button is visible. The right sidebar shows the 'New connection' configuration for an 'Azure Blob Storage' connection. Fields include 'Name' (AzureBlobStorage3), 'Description', 'Connect via integration runtime' (set to 'AutoResolveIntegrationRuntime'), 'Authentication type' (set to 'Account key'), 'Account selection method' (set to 'From Azure subscription'), 'Azure subscription' (set to 'Select all'), 'Storage account name' (hears1054), and 'Additional connection properties'. At the bottom, there are 'Create', 'Back', 'Test connection', and 'Cancel' buttons.

- **Select the container**



- **summary of the deployment of from SQL server to azure blob storage**

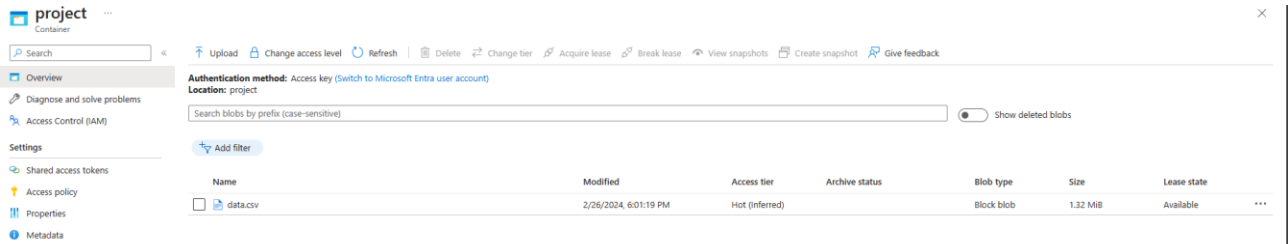
 HTTP →  Azure Blob Storage

Deployment complete

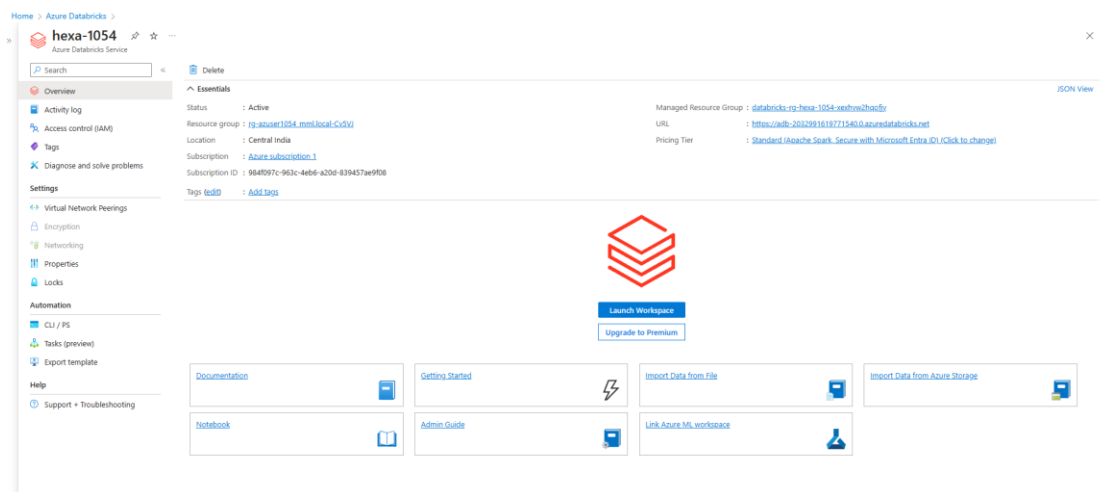
Deployment step	Status
Validating copy runtime environment	✔ Succeeded
> Creating datasets	✔ Succeeded
> Creating pipelines	✔ Succeeded
> Running pipelines	✔ Succeeded

Datasets and pipelines have been created. You can now monitor and edit the copy pipelines or click finish to close Copy Data Tool.

- The csv file is stored in the container



- Create a Azure databricks and launch it



Mount blob storage to azure databricks

- Add source line of the blob storage
- enter the mount points to store in databricks
- Configure extra_configs by mentioning the access key and pasting the key of the blob storage.
- list of the files mounted on Databricks
- display the data frame

Microsoft Azure databricks Search data, notebooks, recents, and more... CTRL + P hexa-1054 azuser1054_mml.local@ihht.onmic...

New Workspace Recents Catalog Workflows Compute Data Engineering Job Runs Machine Learning Experiments Features Models Serving

Project Python File Edit View Run Help Last edit was 6 minutes ago New cell UI ON

Run all azuser1054_mml.local... Schedule Share

Cell 1

```
dbutils.fs.mount(source = 'wasbs://project@hexa1054.blob.core.windows.net',
  mount_point = '/mnt/project',
  extra_configs = {'fs.azure.account.key.hexa1054.blob.core.windows.net': 'P25hOKV1D6H4GUKYBz84CU07XhR1v2JNfHdGhAgQ/RkALDrG6IXj3yDyU592VU7XkQh2+4Stp2uXw=='})
```

True

Cell 2

```
dbutils.fs.ls('/mnt/project')
```

[FileInfo(path="/mnt/project/data.csv", name="data.csv", size=1381093, modificationTime=1708938288000)]

Cell 3

```
df = spark.read.csv('/mnt/project/data.csv', header='true', inferSchema='True')
df.show()
```

df: pyspark.sql.dataframe.DataFrame = [index: integer, Organization id: string ... 7 more fields]

[index]	[Organization id]	[Name]	[Website]	[Country]	[Description]	[Founded]	[Industry]	[Number of employees]
1	522816ef8f086d	Hickinley PLC	http://sato.com/	Sri Lanka	Synergized global...	1988	Dairy	3930
2	70C7F9D7e6Aa3Ea	Cunningham LLC	http://harding-du...	Namibia	Team-oriented fau...	2018	Library	7071
3	4288397ea247290	Ruiz-Wells	http://www.atkins...	Iran	Re-contextualized...	2003	Hospital / Health...	3095
4	90234a48c55C1c1	Parrish, Osborne ...	http://salazar.info/	British Indian Oc...	Fully-configurable...	1969	Supermarkets	5422
5	6C0cdE30b67944f	Diaz, Robles and ...	https://www.brook...	Botsuana	Inverse intangibl...	2013	Nanotechnology	3135
6	6a4D98Bf227AD4e	Keith PLC	http://www.mathes...	Ecuador	Cross-group coher...	1978	Online Publishing	7233
7	0fe6f8Dd1CF5e4d	Humphrey-Hyers	https://faulkner...	Sierra Leone	Adaptive directio...	2005	Publishing Industry	6022
8	EC0F8b0dc4afcf	Castaneda-Rcmahon	http://www.anthon...	Zimbabwe	Front-line value...	2015	Defense / Space	4580
9	4e6c5FAE6308b0c	Santos-Bowman	https://www.onell...	Ecuador	Multi-layered opt...	1979	Computer Hardware	3245
10	AD40b239a0a6680	Valdez-Estes	http://mclendez-m...	Timor-Leste	Diverse next gene...	1965	Plastics	1785
11	647402bf28C1a65	Young-Zavala	http://www.ortiz...	Ukraine	Sharable multimed...	1972	Music	2085
12	CC52930bc2A92bE	Shaffer Inc	https://www.sando...	United Kingdom	Sharable coherent...	1997	Automotive	839
13	849CEAb2F65c439	Gaines-Vang	http://www.levy.com/	Thailand	Competitive web-en...	2021	Online Publishing	3135

Activate Windows Go to Settings to activate Windows.

- Performing data preprocessing activity such trimming blank spaces from columns

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Project Python File Edit View Run Help Last edit was 6 minutes ago New cell UI ON

Run all azuser1054_mml.local... Schedule Share

Cell 4

```
from pyspark.sql.functions import col, cast, trim, upper, lower, coalesce, isnull, lit
```

```
# Data Cleaning
df = df.withColumn("Website", trim(col("Website")))
df = df.withColumn("Description", trim(col("Description")))
df = df.withColumn("Country", upper(col("Country")))
df = df.withColumn("Description", coalesce(col("Description"), lit("")))
df = df.dropDuplicates(["Organization ID"])

df.show()
```

df: pyspark.sql.dataframe.DataFrame = [index: integer, Organization id: string ... 7 more fields]

314	D08f4775Cafec8	Luna, McKellan an...	https://www.dixon...	SOMALIA	Intuitive asynch...	1987	Online Publishing	7649
434	8a6a9139a08777e	Pccall Ltd	http://www.glover...	TONGA	Implemented heur...	2000	Other Industry	3490
578	05C8E78aC8000	Smith Ltd	http://jao-robin...	RUSSIAN FEDERATION	Triple-buffered e...	2009	Apparel / Fashion	3398
643	02d6Aca05D0aC	Gutierrez Ltd	https://www.math...	CAYMAN ISLANDS	Multi-lateral dis...	1999	Computer Games	2746
848	8a805f8a6240a8	Weber Ltd	http://claneros-e...	BOTSWANA	Focused asynchron...	2000	Oil / Energy / So...	5440
1174	9c4a4b4c4c4f4c	Cabrera, Yoder an...	https://stanley.com/	DOMINICAN REPUBLIC	Right-sized dedic...	2021	Capital Markets / ...	943
1189	5a2a22120501a	Gonzales PLC	http://www.menez...	BANGLADESH	Robust maximized...	2002	Transportation	4883
1363	7af7f2D8F628c2	Heath Inc	http://blankensh...	COMOROS	Self-enabling exp...	2002	Plastics	7024
1370	40e24b10D0aa71D	Cain-Hensley	https://west.org/	MONTSERATT	Reduced leading...	1998	Shipbuilding	3664
1944	9a6d89370a0C1	Levy and Sims	https://fontes...	FALKLAND ISLANDS	Cross-platform ex...	1972	Wine / Spirits	9184
2091	937CF3FF40K065	Reynolds-Goodman	https://www.chape...	PERU	Self-enabling mul...	1973	Other Industry	944
2214	842f10dc4a8b0d5	Hillis Inc	https://www.lower...	MEXICO	Progressive didac...	1974	Leisure / Travel	8409
2244	80a8881d12a08f	Potter-Hines	http://ball.com/	CANADON	Open-architected ...	1977	Logistics / Procu...	1990
2310	5a2a22004f40f4e	Livington-Oliver	http://walli.info/	CAYMAN ISLANDS	Optimized direct...	1969	Law Enforcement	361
2378	5f8f1982b12f6	Phelps, Lutz and ...	https://www.hend...	HALLS AND FUTUNA	Integrated compos...	2003	Accounting	2331
2490	9a41489458C8c	Faulkner, Nash an...	https://www.greer...	HAUTITIUS	Universal system...	1997	Research Industry	8540
2652	4710a226f4e792	Hutchinson, Walsh...	https://www.foare...	NEW CALEDONIA	Digitized mission...	1998	Staffing / Recrul...	3364
3207	0710c7a54888C	Woods, Wheeler an...	http://decker.com/	PRINCE POLYNESIA	Cloud responsive...	2020	Research Industry	9627

only showing top 20 rows

Activate Windows Go to Settings to activate Windows.

- Drop rows with Null values

df.na.drop().show()

(2) Spark Jobs

314 D06f4A7F5Cd6ec8 Luna, Mcmillan an... https://www.dixon... SOMALIA Intuitive asynch...	1987 Online Publishing 7649
434 8a6a9A19068f77E McCall Ltd http://www.glover... TONGA Implemented heuri...	2008 Other Industry 3498
578 E8C8B7e60C503cd Smith Ltd http://lam-robins... RUSSIAN FEDERATION Triple-buffered e...	2009 Apparel / Fashion 3398
643 02d6AecA05DDac Gutierrez Ltd https://www.mathi... CAYMAN ISLANDS Multi-lateral dis...	1999 Computer Games 2746
646 bd8057f80A250aB Heber Ltd http://cisneros-e... BOTSWANA Focused asynchron...	2000 Oil / Energy / So... 5440
1174 5cCe4d8Aeffc0 Cabrera, Yoder an... https://stanley.com DOMINICAN REPUBLIC Right-sized dedic...	2021 Capital Markets / ... 943
1189 Eea2a2212D9BA1e Gonzales PLC http://www.nunez-... BANGLADESH Robust maximized ...	2002 Transportation 4883
1363 57a1f12D8F62B2c Heath Inc http://blankenshi... COMOROS Self-enabling exp...	2021 Plastics 7024
1370 ba62ab1d08aa71D Cain-Hensley https://west.org MONTERRAT Reduced loading...	1998 Shipbuilding 3664
1946 ba69c89370a0bC3 Levy and Sons https://fuentes-v... FALKLAND ISLANDS ... Cross-platform ex...	1972 Wine / Spirits 9104
2091 F3F7C0FF089c065 Reynolds-Goodman https://www.chapm... PERU Self-enabling mul...	1973 Other Industry 944
2214 642f1DfEcda80d05 Hills Inc https://www.lower... MEXICO Progressive didac...	1974 Leisure / Travel 8409
2244 86ba8881d21ed0E Potter-Hines http://ball.com CAMEROON Open-architected ...	1977 Logistics / Procu... 1990
2310 83eb230df4a0fb Livingston-Oliver http://walls.info CAYMAN ISLANDS Optimized directi...	1989 Law Enforcement 361
2378 3fDfE1982be12FE Phelps, Lutz and ... https://www.hendr... WALLIS AND FUTUNA Integrated compos...	2003 Accounting 2331
2490 9ad1149f4569Cc8 Faulkner, Nash an... http://www.greer... MAURITIUS Universal system...	1997 Research Industry 8540
2652 e710d2286fae7b2 Hutchinson, Walsh... https://www.juare... NEW CALEDONIA Digitized mission...	1998 Staffing / Recrui... 3364
3207 37139c7ad4848EC Woods, Wheeler an... http://decker.com FRENCH POLYNESIA Cloned responsive...	2020 Research Industry 5027

only showing top 20 rows

- Count of Organisations by Country

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New Workspace Recents Catalog Workflows Compute Data Engineering Job Runs Machine Learning Experiments Features Models Serving Partner Connect Collapse menu

Project Python Last edit was 10 minutes ago New cell UI: ON

Run all azuser1054_mml.local Schedule Share

2244 86ba8881d21ed0E Potter-Hines http://ball.com CAMEROON Open-architected ... 1977 Logistics / Procu... 1990
2310 83eb230df4a0fb Livingston-Oliver http://walls.info CAYMAN ISLANDS Optimized directi... 1989 Law Enforcement 361
2378 3fDfE1982be12FE Phelps, Lutz and ... https://www.hendr... WALLIS AND FUTUNA Integrated compos... 2003 Accounting 2331
2490 9ad1149f4569Cc8 Faulkner, Nash an... http://www.greer... MAURITIUS Universal system... 1997 Research Industry 8540
2652 e710d2286fae7b2 Hutchinson, Walsh... https://www.juare... NEW CALEDONIA Digitized mission... 1998 Staffing / Recrui... 3364
3207 37139c7ad4848EC Woods, Wheeler an... http://decker.com FRENCH POLYNESIA Cloned responsive... 2020 Research Industry 5027

only showing top 20 rows

Just new (16)

```
# Count of Organisations by Country
country_counts = df.groupby("Country").count()

display(country_counts)
```

(3) Spark Jobs

country_counts: pyspark.sql.dataframe.DataFrame = [Country: string, count: long]

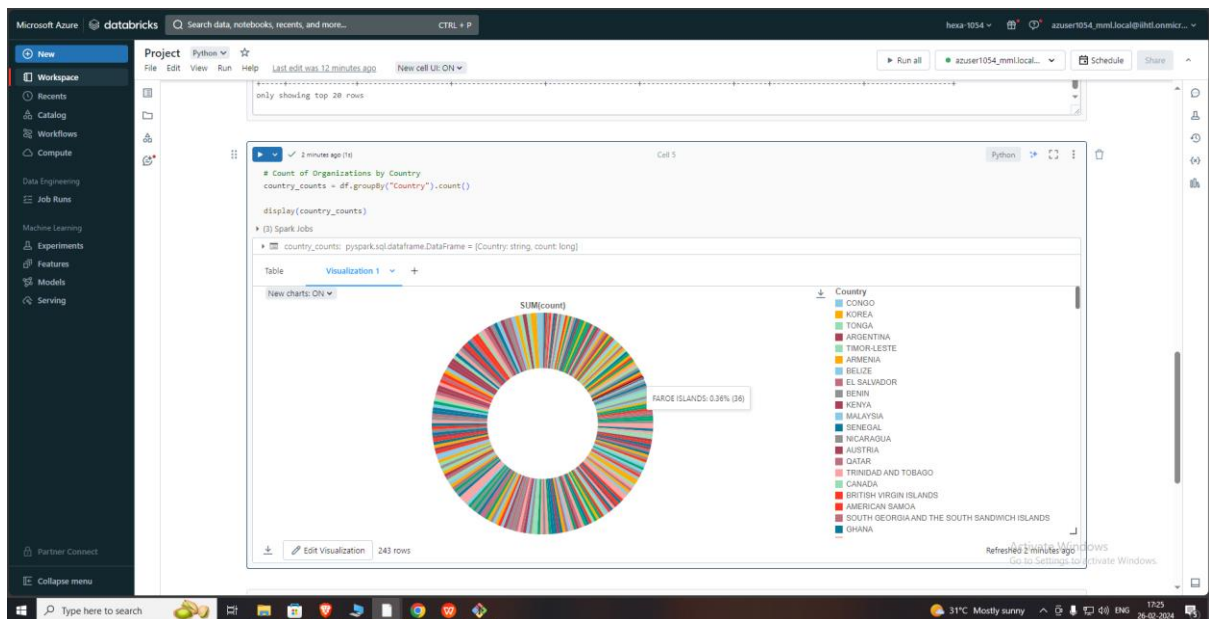
Country	count
1 BAHAMAS	39
2 ARMENIA	57
3 SOUTH AFRICA	41
4 UNITED STATES MINOR OUTLYING ISLANDS	49
5 CAMBODIA	37
6 BANGLADESH	50
7 THAI	47

243 rows | 0.08 seconds runtime Refreshed now

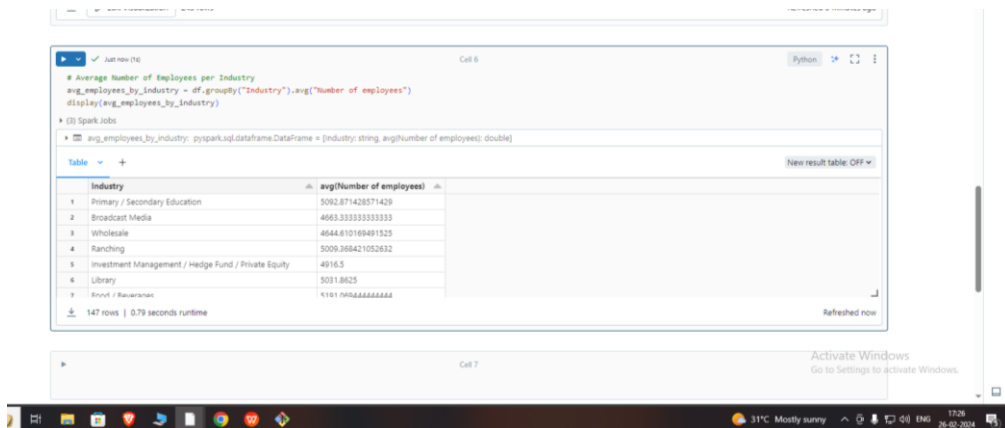
Cell 6 Activate Windows Go to Settings to activate Windows.

Type here to search 31°C Mostly sunny 12:22 26-02-2024

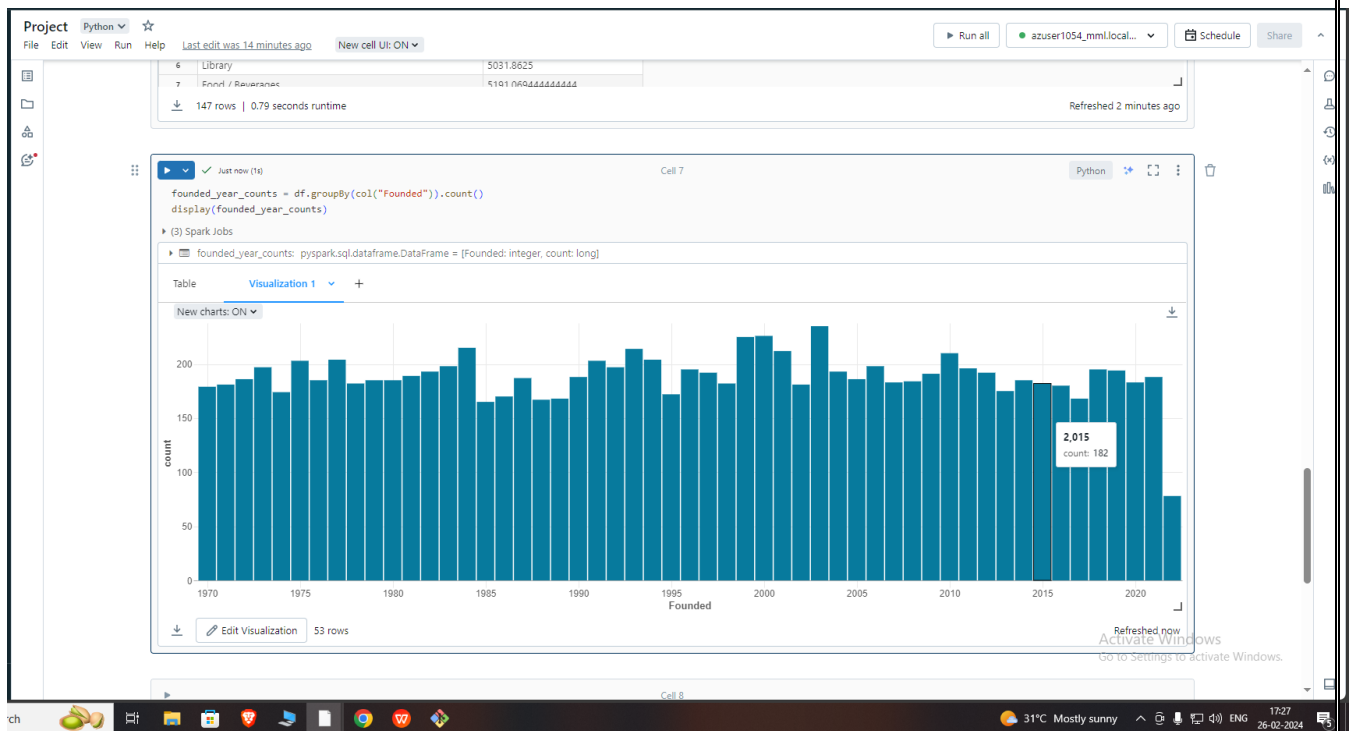
- Visualising count of Organisation by Country using a pie chart



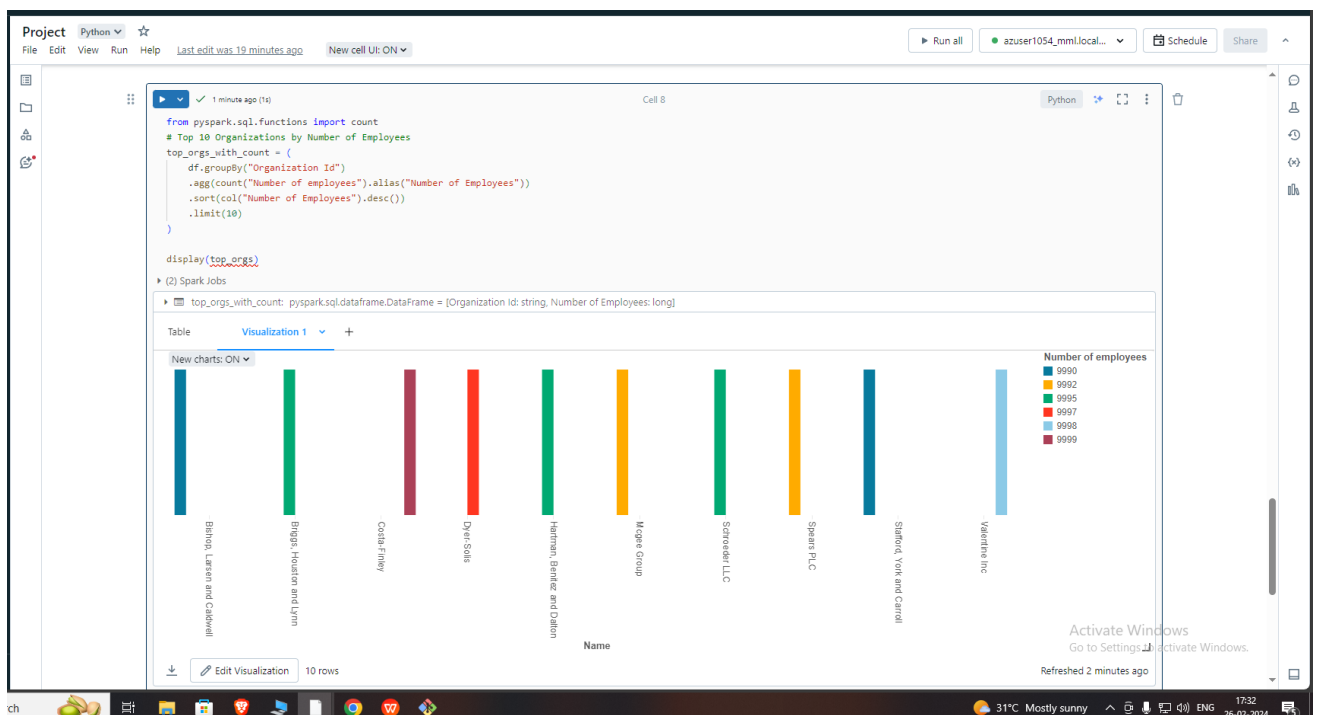
- Average number of Employees per industry



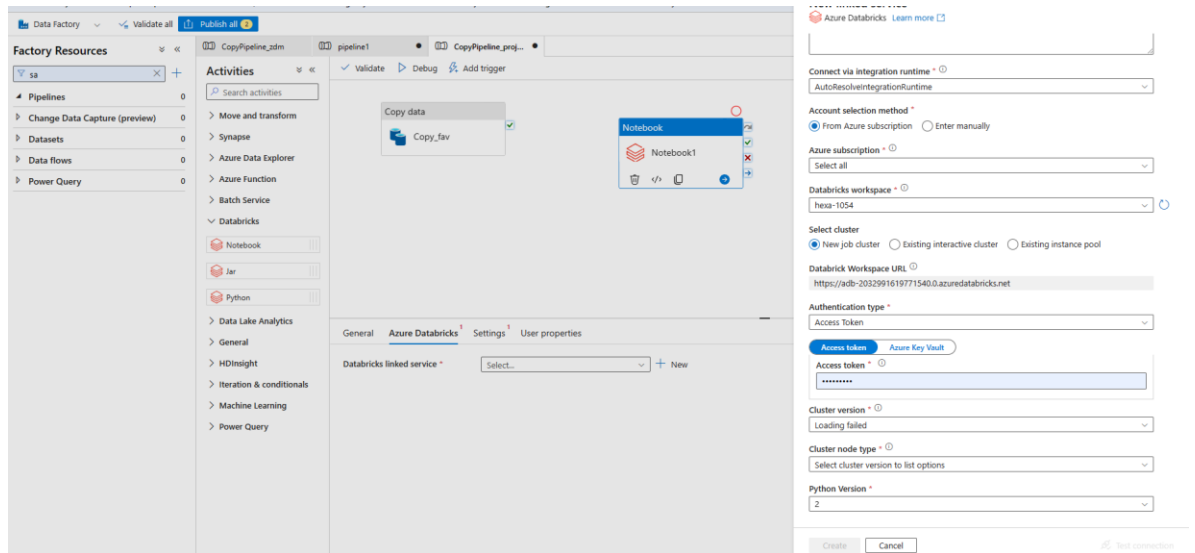
- Visualising count of country grouped by the year in which they were founded using a bar graph



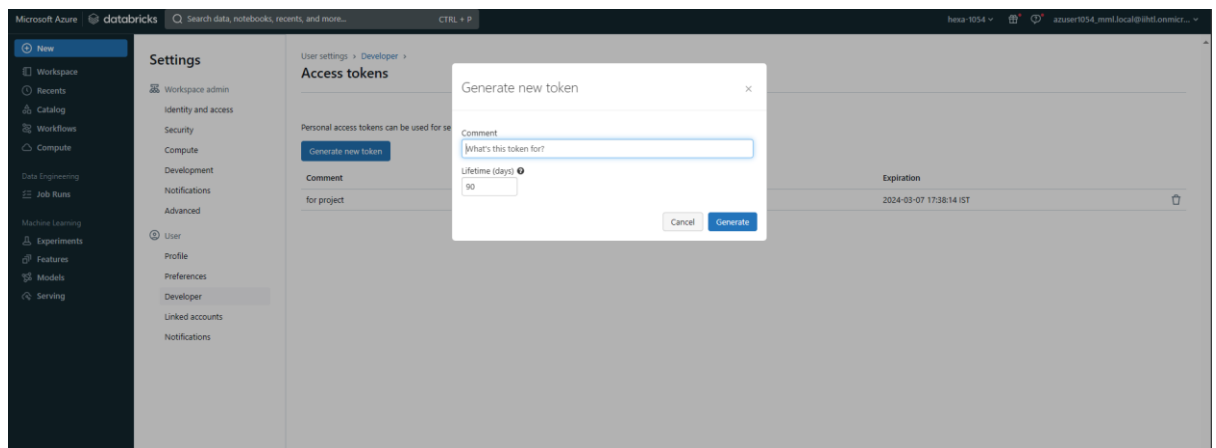
- Top 10 Organisations sorted by the number of employees



- In Azure Datafactory drag and drop the Notebook activity and link it to the databricks Notebook



- Copy the access token from Databricks Notebook by clicking on User settings -> Developer -> Generate new Token



- In Datafactory Validate the pipeline and then click on debug

Microsoft Azure | Data Factory | DF-1054

Microsoft recently announced the public preview of Microsoft Fabric, a brand new and exciting way to build cloud-first data analytics. Click here to get started with Fabric Data Factory!

Factory Resources

- Pipelines
- Change Data Capture (preview)
- Datasets
- Data flows
- Power Query

Activities

- Move and transform
- Synapse
- Azure Data Explorer
- Azure Function
- Batch Service
- Databricks
- Notebook
- Jar
- Python
- Data Lake Analytics
- General
- HDInsight
- Iteration & conditionals
- Machine Learning
- Power Query

CopyPipeline_zdm

Copy data

Notebook

Notebook1

Parameters Variables Settings Output

Pipeline run ID: 34bffff6-9109-45c1-9cae-d9930961bc40

Pipeline status: In progress

All status

Showing 1 - 1 of 1 items

Activity name	Activity status	Activity type	Run start	Duration	Integration run
Copy_data	Queued	Copy data	2/26/2024, 5:41:02 PM	6s	

Pipeline validation output

Your pipeline has been validated.
No errors were found.

Activate Windows
Go to Settings to activate Windows.

- The pipeline is running successfully

Microsoft Azure | Data Factory | DF-1054

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- Iteration & conditionals
- Machine Learning
- Power Query

CopyPipeline_zdm

Copy data

Notebook

Notebook1

Parameters Variables Settings Output

Pipeline run ID: 8a542f5e-640d-4367-8d53-be27c65b2147

Pipeline status: Succeeded

All status

Showing 1 - 2 of 2 items

Activity name	Activity status	Activity type	Run start	Duration	Integration run
Notebook1	Succeeded	Notebook	2/26/2024, 6:01:25 PM	2m 2s	AutoResolveInt
Copy_data1	Succeeded	Copy data	2/26/2024, 6:01:06 PM	16s	AutoResolveInt

Pipeline validation output

Your pipeline has been validated.
No errors were found.

Activate Windows
Go to Settings to activate Windows.

Conclusion

In conclusion, this project successfully demonstrated the integration of various Azure services to create an end-to-end data processing pipeline. Beginning with data acquisition from GitHub, we utilized Azure Data Factory to orchestrate data movement to Azure Blob Storage. Subsequently, Azure Databricks was employed for data processing and analysis, including preprocessing tasks and generating insightful visualizations. The seamless integration of these Azure services facilitated efficient data handling and analysis, showcasing the power of cloud-based data solutions in modern data engineering workflows. This project highlights the effectiveness of Azure's ecosystem in enabling scalable and efficient data processing pipelines for diverse use cases.