

End to End Data Engineering Project

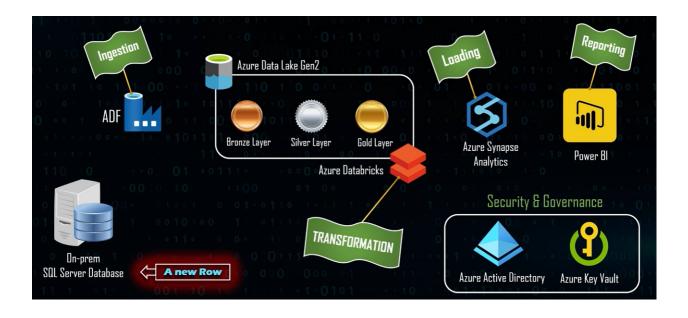
Created by	D Devansh Gupta
① Created time	@September 7, 2023 10:34 AM

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STEP 1: Creation of Resource Group

Create a resource group by selecting the Resource Groups option in Azure Services. Name it according to convention.

Azure services



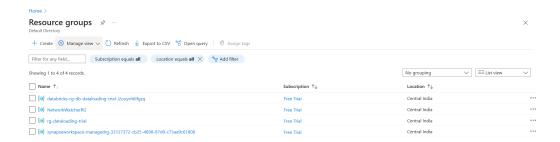
Then add all the below listed resources in the resource group -

- 1. Azure Data Factory Resource
- 2. Azure Databricks
- 3. Azure Data Lake Storage Gen 2
- 4. Azure Key Vault
- 5. Azure Synapse Analytics (it is better to add this later)

Many of these services are chargeable and thus, should be used carefully.

I .Creating resource groups

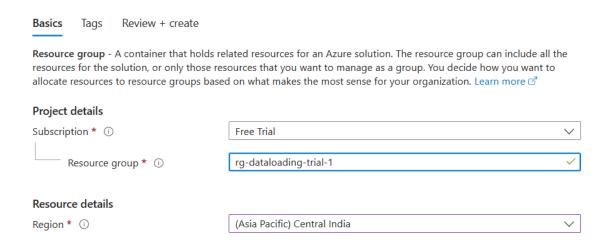
- 1. Sign in to the Azure portal.
- 2. Select Resource groups.
- 3. Select Create



- 4. Enter the following values:
 - Subscription: Select your Azure subscription.
 - Resource group: Enter a new resource group name.
 - Region: Select an Azure location, such as Central India

Home > Resource groups >

Create a resource group

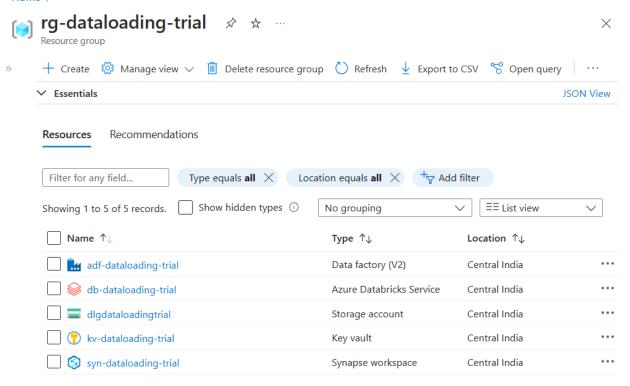


- 5. Select Review + Create
- 6. Select Create. It takes a few seconds to create a resource group.

II.Adding Resouces to Resource Groups

Add all resources as shown below -

Home >



The settings that should be applied while creating each resource are plenty straightforward as should be applied correctly. Videos on YouTube can be referred to see the correct configuration of each resource.

To create a Azure Key Vault -



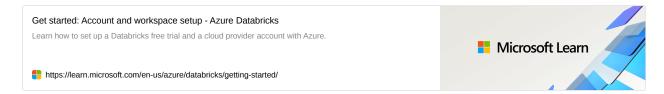
To create a Azure DataLake Gen2 -



To create a Azure Datafactory Resource -



To create a Azure Databricks Service -



To create a Azure Synapse Analytics Workspace -



STEP 2: Setting up the environment

I .Adding database to SQL Server Management Studio

1. Setup SQL Server Management Studio by first installing SQL Server and then SQL Server Management Studio from the internet. Appropriate videos can be referred to from YouTube and the internet.

This section provides direct link to download AdventureWorks sample databases, and instructions for restoring them to SQL Server, Azure SQL Database, and Azure SQL Managed Instance.

https://github.com/Microsoft/sql-server-samples/releases/download/adventureworks/AdventureWorksLT2017.bak

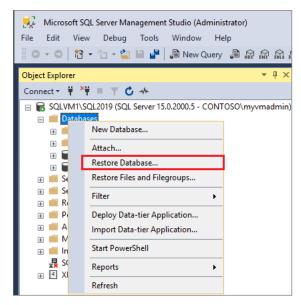
You can use the ...bak file to restore your sample database to your SQL Server instance.

To restore your database in SSMS, follow these steps:

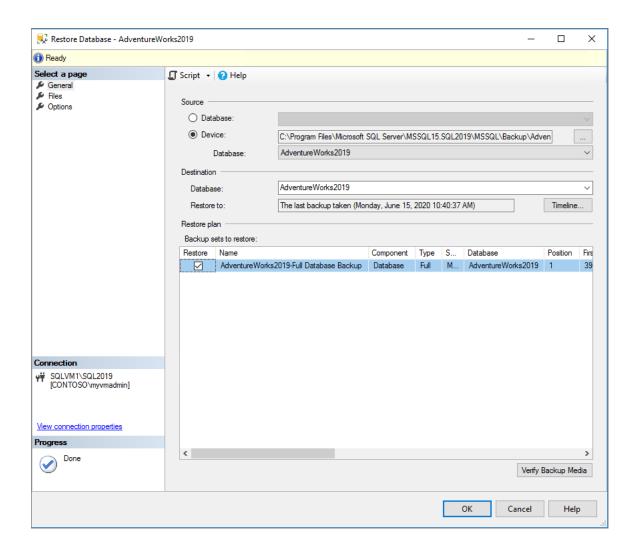
- 1. Download the appropriate bak file from the link provided above.
- 2. Move the back file to your SQL Server backup location. This varies depending on your installation location, instance name and version of SQL Server. For example, the default location for a default instance of SQL Server 2019 (15.x) is:

 ${\tt C:\Program\ Files\Microsoft\ SQL\ Server\MSSQL15.MSSQLSERVER\MSSQL\Backup\ .}$

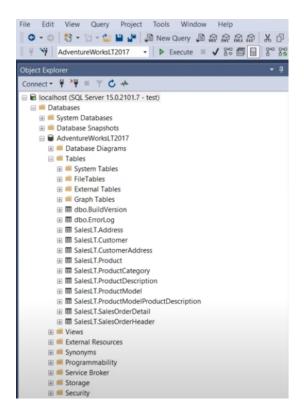
- 3. Open SSMS and connect to your SQL Server instance.
- 4. Right-click Databases in Object Explorer > Restore Database... to launch the Restore Database wizard.



- 5. Select **Device** and then select the ellipses (...) to choose a device.
- 6. Select **Add** and then choose the __bak file you recently moved to the backup location. If you moved your file to this location but you're not able to see it in the wizard, this typically indicates a permissions issue SQL Server or the user signed into SQL Server doesn't have permission to this file in this folder.
- 7. Select **OK** to confirm your database backup selection and close the **Select backup devices** window.
- 8. Check the **Files** tab to confirm the **Restore as** location and file names match your intended location and file names in the **Restore Database** wizard.
- 9. Select **OK** to restore your database.



Doing so will import a sample database by the name - AdventureWorksLT2017 to your SQL Server Management Studio.



II.Creating Login and Password for the Database

1. Create a SQL Notebook file with the following script -

```
CREATE LOGIN <username> WITH PASSWORD = <'password'>
create user devansh for login devansh
```

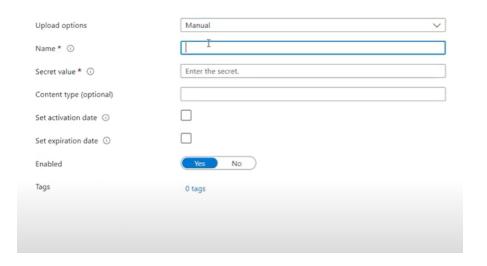
Open this in the SQL Server Management Studio and run this to create a username and password for accessing the database.

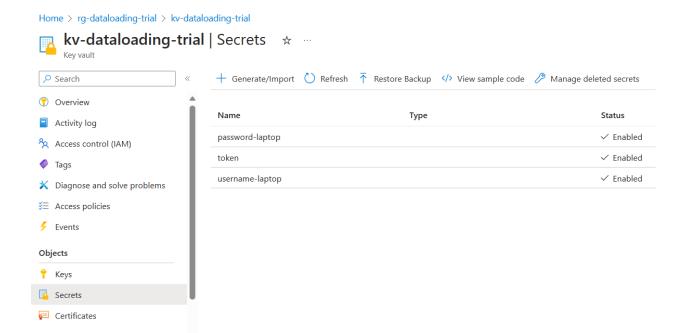
2. To check if the above user with the username and password have been assigned to the database, open the Security → Users → Username. Write click on the username and then click on Properties and under Membership tab, assign db_datareader to the user.



3. Also now add the username and password as secrets in the Azure Key Vault that you have created above in the resource group.

Create a secret



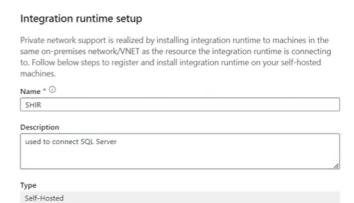


STEP 3: Data Ingestion

1. Launch Azure Data Factory Workspace from the Data Factory that you have created in the resource group. Here go to Manage tab → Integration Runtimes → And then click on New.

The already existing Integration Runtime which is AutoResolveIntegrationRuntime is used to connect cloud components to each other

But in order to connect the on-premises SQL Database (AdventureWorksLT2017), we need to create a new Integration Runtime.
 On clicking New → Azure, Self-Hosted → Self-Hosted → Set the name as "SHIR" → Create.
 This creates the new Integration Runtime.



3. We get two links - one for Express Setup and one for Manual Setup.

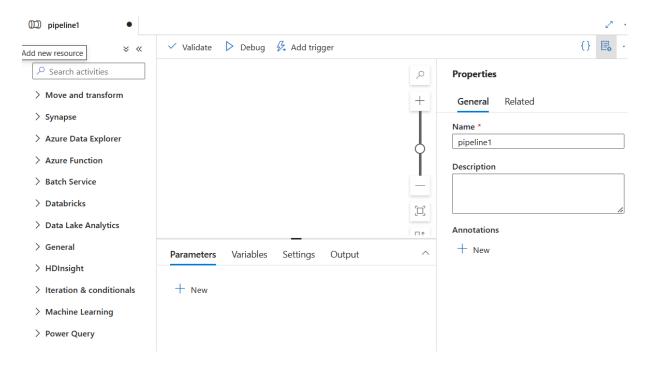
Download the Express Setup as it is more convenient, and it will finish downloading in some time. This is the set-up for a new Integration Runtime that connects cloud to the machine that the on-premises database is present on.

I .Creating Pipeline to Copy only one table.

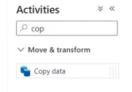
1. To create a new pipeline -

Author tab $\,\to\,$ Click on "+" icon $\,\to\,$ Select Pipeline $\,\to\,$ This creates a new pipeline.

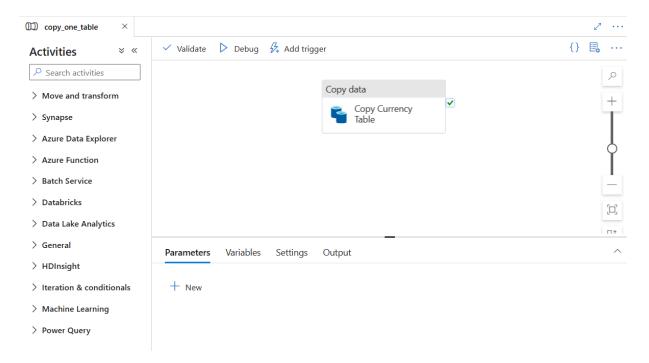
You can rename it if you want.



2. Now go to Activities and search for Copy data -

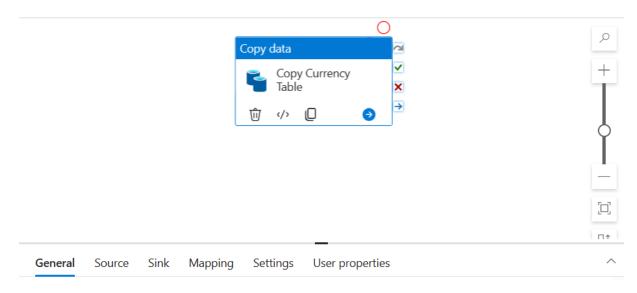


Now drag and drop this Activity in the workspace that you have been provided with.



Also change the name of the Activity to make it more convenient to understand what it is doing.

3. To configure the activity, you have to configure the Source and Sink tabs respectively.



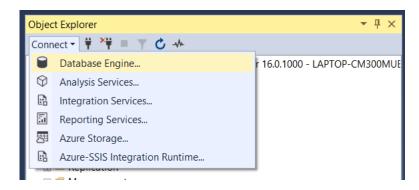
For Source dataset, click on +New \rightarrow Then search for SQL Server \rightarrow And name it as per your convenience. But the option below it - Linked Services have to be configured as done below -

Set properties



Configuring Linked Service

- 1. Linked Service can be named as per convenience. This ensures connectivity of cloud and the on-premises database.
- 2. For the option Connect via integration runtime, Select SHIR as it is used to connect cloud to on-premises machines.
- 3. Now for Server Name, this can be obtained from your SQL Server Management Studio from the Connect option -



- 4. Also add the Database name as AdventureWorksLT2017.
- 5. Now select the Authentication type as SQL authentication:

Also, enter the username as the one set when we added the database to our SQL Server Management Studio, this username is also stored in the Azure Key Vault along with the password.

- 6. For the password, use the Azure Key Vault to retrieve the password (as this ensures more safety).
 - a. Here, you will have to create a AKV linked service.

To do this fill all the fields while referring to below image-

Azure Key Vault Name * AzureKeyVault2 Description Azure key vault selection method ① From Azure subscription ① Enter manually Azure subscription ①

Authentication method

Edit key vault

Azure key vault name *
kv-dataloading-trial

New linked service

System Assigned Managed Identity

V

 ${\it Managed identity name: } \textbf{adf-dataloading-trial}$

Free Trial (51add2c5-ba20-4b84-b627-9d086d739a42)

Managed identity object ID: 14fd7d6f-8cec-44c5-9af7-c9e7c59392a3

Grant Data Factory service managed identity access to your Azure Key Vault. Learn more 🔀

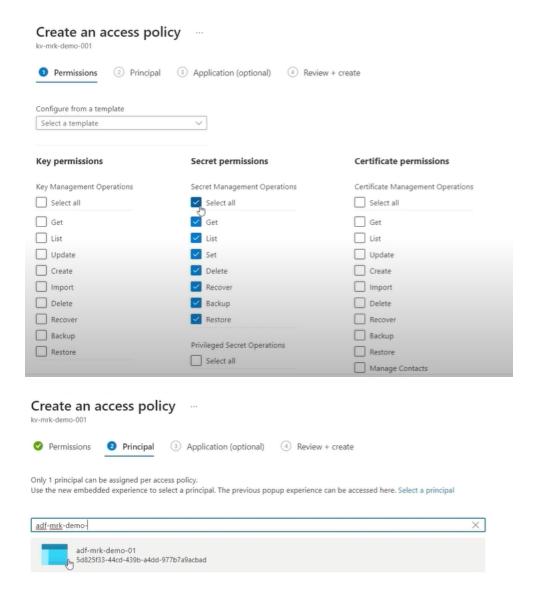
Test connection



Annotations

b. Now, after configuring the AKV linked state, Secret Name can be retrieved by clicking on the dropdown.

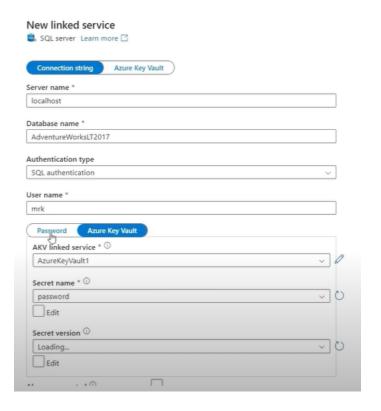
NOTE- Sometimes, you may not be able to retrieve the Secret Name due to accessibility issues. To resolve these, create an access policy in the Azure Key Vault and give your account all these permissions -



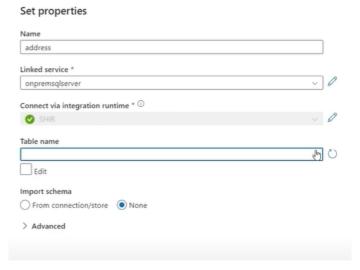
Select the name of your Azure Data Factory.

Doing so will let you access the Secret Name.

c. Final Linked service should look like this -



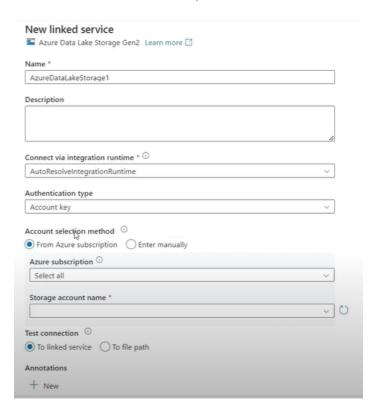
4. After configuring the linked service, the screen becomes something like this -

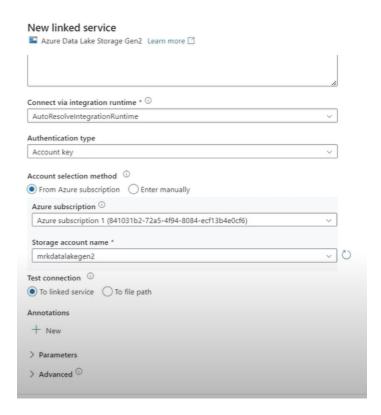


- 5. Now select the table name of the table that you want to import like SalesLT. Address.
- 6. Similarly, configure the Sink dataset. For sink, Sink dataset → +New → Search for Azure Data Lake Storage Gen 2 → Select Parquet Format → Takes you to this page -



Now similar to when we created Linked service for Source dataset, we do the same for Sink dataset.



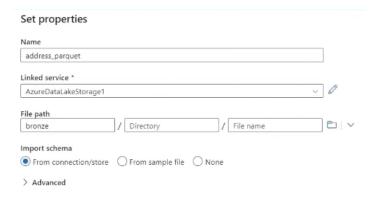


7. Now as soon as you configure Linked services,

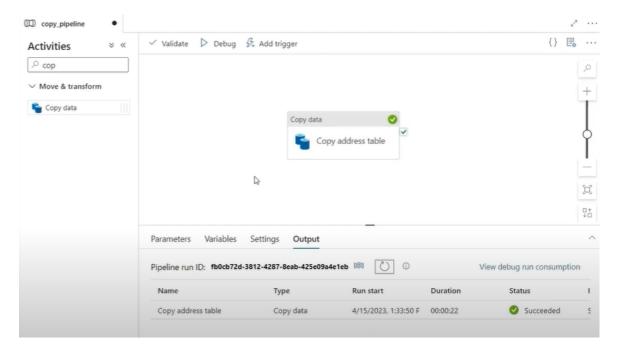


You get a screen like this. Now select the folder or file (in the Data Lake) that you want to store all the databases that we are extracting from the on-premises database.

Create a folder named "bronze" in the Azure Data Lake Gen 2 and the select the path to it in the option.



8. Finally, the Pipeline is configured. Now test the pipeline using the Debug or Add trigger option above the pipeline.



II.Creating Pipeline to Copy all tables.

1. To create a new pipeline -

Author tab \rightarrow Click on "+" icon \rightarrow Select Pipeline \rightarrow This creates a new pipeline.

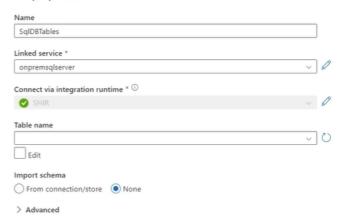
You can rename it if you want.

2. Now go to Activities and search for Lookup-

Change the name to your convenience.

Now under Settings tab \rightarrow Source dataset +New \rightarrow SQL Server \rightarrow We get a tab like this -

Set properties



As Linked Service is already created, just select the created one. Integration Runtime that has to be selected is SHIR as we are connecting on-premises to cloud.

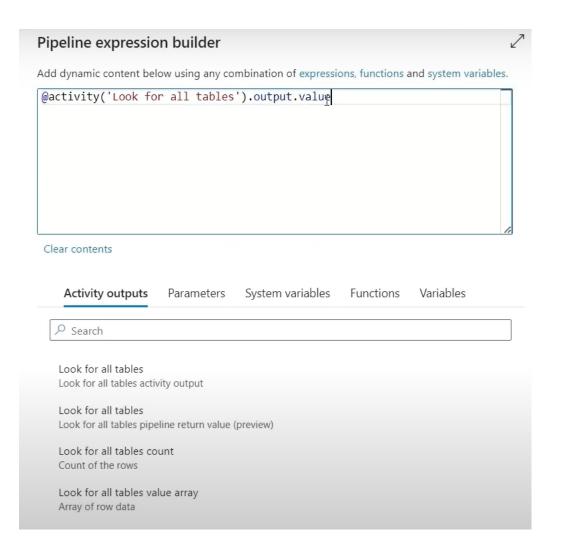
- 3. Now, as Source dataset is configured, we have to configure below options too.
 - a. Uncheck the box First row only
 - b. Use query Select Query option and paste the following query-

```
SELECT
s.name as SchemaName,
t.name as TableName
FROM sys.tables t
INNER JOIN sys.schemas s
ON t.schema_id = s.schema_id
WHERE s.name = 'SalesLT'
```

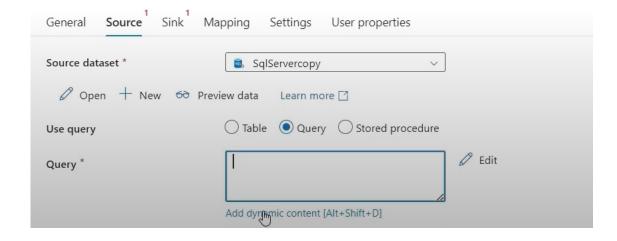
- c. This is done and Lookup is configured.
- 4. Now go to Activities and search for ForEach-
- 5. Connect end of Lookup Activity to ForEach activity.

Change the name to your convenience.

Now under Settings tab \rightarrow Go to Items field \rightarrow Add dynamic content \rightarrow Select look all tables and due to this, a query will be visible in the top message box. Just add .value to the end of it.



- 6. Now under ForEach, go under Activities tab → Click on the pencil icon → This takes us inside the ForEach Activity.
 Now under here, add a new Copy data Activity as we want to copy all tables for each look up value.
 But we have to configure the Copy data Activity -
 - 1. Configure for Source and Sink dataset using the above same method. After configuring Source dataset and then, using the same Linked service that we created earlier.
 - 2. Next, for source dataset, for the Use query option, select Query and then click on Add dynamic content.



3. Now copy paste the below script in the whitespace -

```
@{concat('SELECT * FROM ', item().SchemaName,'.',item().TableName)}
```

- 4. For sink dataset, +New → Azure Data Lake Storage Gen 2 → Parquet → And follow same steps as done in some above steps.
- 5. Now we need the folder structure of all files to be -bronze/Schema/Tablename/Tablename..parquet

To do this, we open (pencil icon) the Sink dataset and here we go the Parameters tab → +New and then Create two parameters schemaname and tablename of type String and set the value of these parameters as @item.SchemaName and @item.TableName respectively.

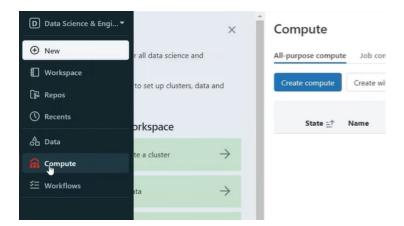
Now go to Connection tab in Sink dataset, and here add file path (by adding dynamic content) and paste this in the whitespace -

```
@{concat(dataset().schemaName, '/',dataset().tableName)}
@{concat(dataset().tableName,'.parquet')}
```

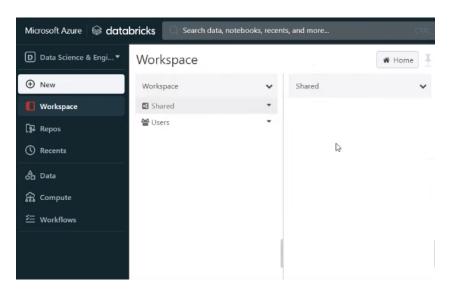
7. We are done and the pipeline is created. Now visit the bronze folder in the Azure Data Lake Storage Gen 2 and check to see all tables as .parquet files.

STEP 4: Data Transformation

1. Sign in to the Azure Databricks portal. Here, create a cluster/compute by going to the Compute tab.



- 1. Policy Unrestricted
- 2. Single Node
- 3. Else everything should be default as suggested by Azure.
- Just enable credential passthrough for user-level data access.
 By enabling this, any user that has access to the Azure Data Lake Storage Gen 2 can also access it through the Databricks.
- 2. Create 2 more folders in Azure Data Lake Storage Gen 2 and name these Silver and Gold to represent the level of transformations.
- 2. Now open workspace tab on the left of the screen. Then go the Shared directory inside which create 3 notebooks to record transformations 1. bronze to silver 2. silver to gold and 3. storagemount which is used to mount the 3 directories.



```
configs = {
   "fs.azure.account.auth.type": "CustomAccessToken",
   "fs.azure.account.custom.token.provider.class": spark.conf.get("spark.databricks.passthrough.adls.gen2.tokenProviderClassName")
}
```

```
dbutils.fs.mount(
source = "abfss://<container-name>@<storage-account-name>.dfs.core.windows.net/",
```

```
mount_point = "/mnt/<mount-name>",
extra_configs = configs)
```

Here replace container-name and mount-name with bronze, silver and gold respectively to mount all the three directories.

```
dbutils.fs.ls("/mnt/bronze/SalesLT/")
```

This code can be used to access all the files in the bronze directory.

4. Now in the bronze to silver directory,

```
table_name=[]
for i in dbutils.fs.ls('mnt/bronze/Sales/'):
    table_name.append(i.name.split('/')[0])

from pyspark.sql.functions import from_utc_timestamp, date_format
from pyspark.sql.types import TimestampType

for i in table_name:
    path = '/mnt/bronze/Sales/'+i+'/'+i+'.parquet'
    df=spark.read.format('parquet').load(path)
    column=df.columns

for col in column:
    if "Date" in col or "date" in col:
        df = df.withColumn(col,date_format(from_utc_timestamp(df[col].cast(TimestampType()),"UTC"),"yyyyy-MM-dd"))

output_path = '/mnt/silver/' +i +'/'
    df.write.format('delta').mode("overwrite").save(output_path)
```

Write this code to apply the first set of changes (converts all columns that contain date to standard date format, removes all timestamps). All new files use the .delta format.

5. Now in the silver to gold directory,

```
table_name=[]
for i in dbutils.fs.ls('mnt/silver/'):
    table_name.append(i.name.split('/')[0])

from pyspark.sql.functions import col,regexp_replace
from pyspark.sql import SparkSession

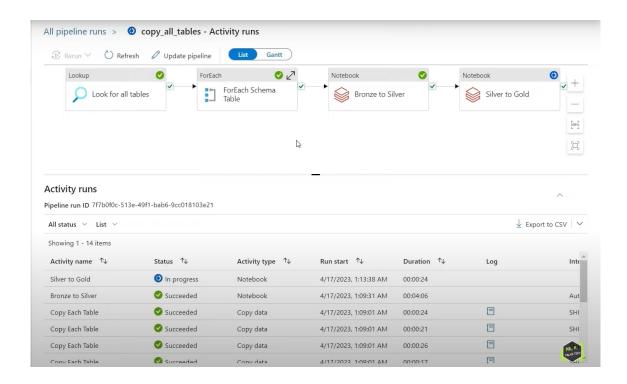
for i in table_name:
    path = '/mnt/silver/'+i
    df=spark.read.format('delta').load(path)
    column=df.columns

for colo in column:
    new_col="".join(["_"+char if char.isupper() and not colo[j-1].isupper() else char for j,char in enumerate(colo)]).lstrip("_
    df=df.withColumnRenamed(colo,new_col)

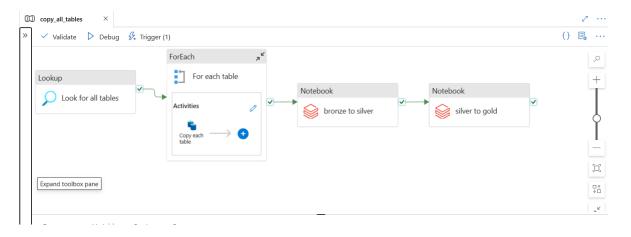
output_path = '/mnt/gold/' +i +'/'
    df.write.format('delta').mode("overwrite").save(output_path)
```

Write this code to apply the first set of changes (converts all column names like FirstColumn to First_Column).

- 6. To automate the process of running these notebooks every time a change happens, we can create a pipeline on top of the previous one which then runs all these processes in an order and regularly. To do this,
 - a. Open Azure Data Factory first create a Linked service between Azure Data Factory and Azure Databricks. Manage → Linked Services → +New.
 - b. Fill in all the information as shown below
 - i. Name Any name of your choice
 - ii. Integration Runtime AutoResolveIntegrationRuntime
 - iii. Azure subscription Your subscription
 - iv. Databricks workspace Pops up with linked subscription
 - v. Authentication type Access Token
 - 1. To get this access token, go to User Settings in the Databricks workspace and then generate new token. Copy this token and save it in Azure Key Vault which stores the value of this token.
 - 2. Now coming back to Data Factory, select AKV Linked Service as the one which you have previously made.
 - 3. Secret name should be the name of the token that you have stored as a secret in the key vault.
 - vi. Choose from existing clusters Choose the cluster that you made in Azure Databricks.
 - c. Now in the pipeline workspace, we already have Lookup and ForEach Activities. Now select Databricks Notebook Activity from the left menu and add 2 such activities (one for each notebook bronze to silver and silver to gold).
 - d. To configure both Activities, choose one of them and then go to the Azure Databricks menu. Select Databricks Linked service as the Linked service that you just created.
 - e. Then go the Settings tab (next to the Azure Databricks tab) and select the Notebook Path which is /Shared/bronzetosliver or /Shared/silvertogold in this case.
 - f. Now publish all changes.
 - g. Run this pipeline (using Debug or Trigger now) to check if the connections are working.

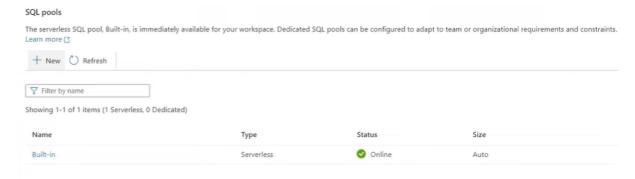


Thus, you have now created a pipeline which ingests and transforms data.



STEP 5: Data Loading

- 1. Open Azure Synapse Analytics studio. The Azure Synapse Analytics Resource is already linked to Azure Data Lake Storage Gen 2 as when creating this Synapse resource, we give the name and primary folder of the corresponding Azure Data Lake Storage Gen 2.
- 2. Now, under the Data tab in Synapse Workspace, create a SQL Database workspace.
 - a. Create a Serverless SQL pool type Database and name it conventionally (say gold_db).
 - b. There is a already Built-In Serverless Database pre-existing.



- 3. Now in Data → Linked → We can access our Storage Container.
- 4. Now in the Develop tab, import this SQL Notebook file by the name of sp_CreateSQLServerlessView_gold: (execute this)

5. Now go Manage tab and under Manage tab, Create a new Linked Service \rightarrow Search for Azure SQL Database.

Now the following values are to be configured -

Name - Any name of your choice

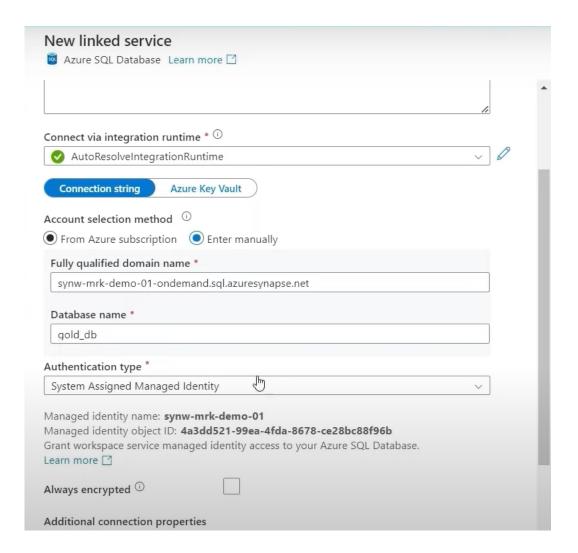
Integration Runtime - AutoResolveIntegrationRuntime

Account Selection Method - Enter manually

Fully qualified domain name - Go to Resource Group \rightarrow Synapse workspace \rightarrow Properties \rightarrow Select serverless SQL endpoint and input it here.

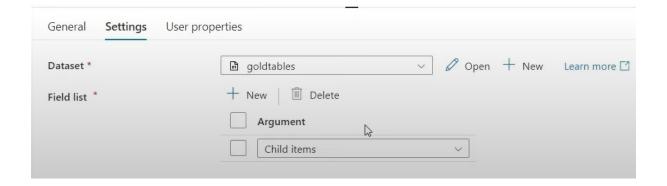
Database name - Created earlier (gold_db)

Authentication type - System Assigned Managed Identity



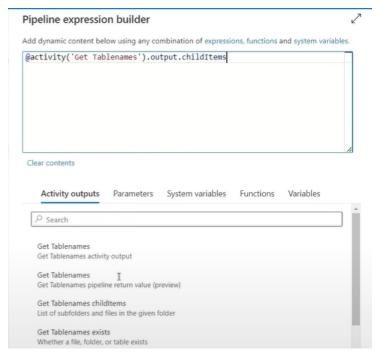
- 6. Finally go to Integrate tab and create a new pipeline which connects to our previous pipeline and is triggered when the pipeline in data factory is triggered.
- 7. For activities in this pipeline
 - a. First take Get Metadata Activity and change it's name to something appropriate like Get tablenames.
 - b. Under the Settings tab, +New Dataset and then select Azure Data Lake Storage Gen 2 and then select format as .binary as we only need to get the tablenames.
 - c. After selecting all these, select the Linked service which we created above.
 - d. After this, set File path to the Gold directory of the Storage container by browsing through the container.
 - e. Now again under the Settings tab, Select +New in Field List and then select Child Items.





- 8. Now add a new Activity. For Each activity is added and configured accordingly. Name it as For Each table name.
 - a. In this, under Settings tab \rightarrow Items \rightarrow Click on whitespace then on Add Dynamic Content. Then, on the new whitespace that opens, add this code -

@activity('Get Tablenames').output.ChildItems



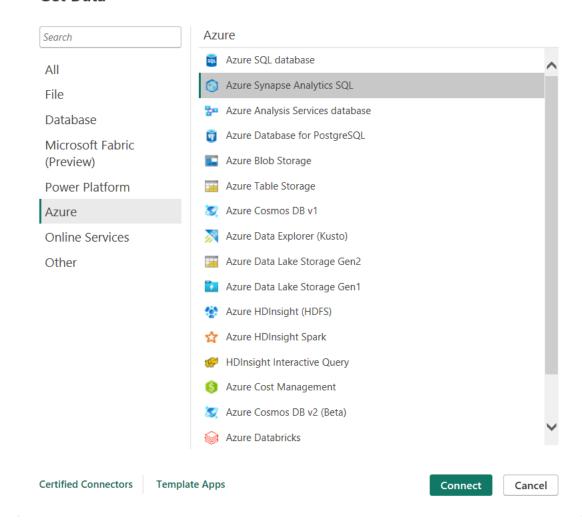
- b. Now, add new Activites under ForEach activity. Add a Stored Procedure activity.
 - i. Under Settings tab, for Linked services select the new Linked Service that we created just earlier.
 - ii. Under the Stored Procedure Name, [dbo].[CreateSQLServerlessView_gold] comes up as this is the stored procedure that we executed earlier. Select this.
 - iii. Also under Stored Procedure Parameters,
 - 1. Name ViewName
 - 2. Type String
 - 3. Value Add Dynamic content → @item().name
- 9. Now we are done. Publish all pending updates and run the new Pipeline using the Debug or Trigger Now options.

STEP 6: Data Reporting

To export all created views, and to prepare reports on the same database, we use POWER BI.

Use the Get Data tab → More.... → Azure → Azure Synapse Analytics SQL, as shown below:

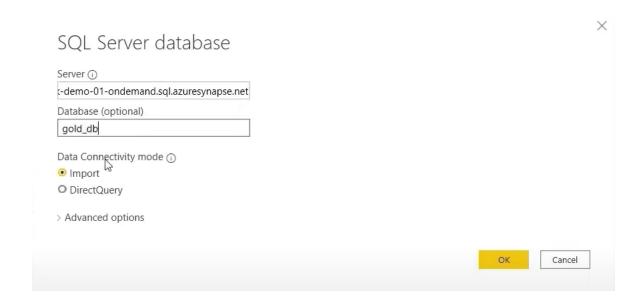
Get Data



After clicking on Connect option, it will ask you the name of the Server and Database.

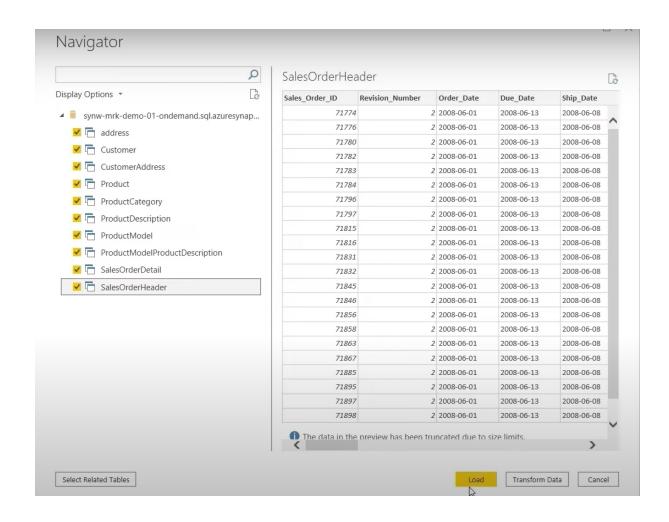
For Server \rightarrow Copy the Serverless SQL Endpoint as we did before

For Database \rightarrow Write the name of the database which in this case is: gold_database (we created this database in Azure Synapse Analytics which contains the views of all original database tables).



Now on continuing, there will be 3 methods to authenticate and connect to the SQL Server Database. Select the Microsoft Account option and then sign in with your Microsoft Account with which you use Microsoft azure.

Now a Navigator window will open and here select all tables and load them \rightarrow



Now use all POWER BI tools to build an informative report.