## SQL AI Assistant in Data Warehouse Public Cloud (Preview)

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## About the Hue SQL AI Assistant

A SQL AI Assistant has been integrated into Hue with the capability to leverage the power of Large Language Models (LLMs) for various SQL tasks. It helps you to create, edit, optimize, fix, and succinctly summarize queries using natural language and makes SQL development faster, easier, and less error-prone. SQL AI assistant is available with the Hue image version 2023.0.16.0 and higher on the public cloud. Both Hive and Impala dialects are supported.

**Note:** The Hue SQL AI assistant is in technical preview and not recommended for use in production deployments. Cloudera recommends that you try this feature in test and development environments.

## Which AI models and services does Hue use?

The AI Assistant supports various LLMs and hosting services. The model can run in the infrastructure of a service provider, and the AI Assistant can be configured to use them remotely. Cloudera has tested with GPT running in Azure OpenAI, and the following service-model combinations are supported

Service Provider	Model	Model versions
OpenAl	OpenAl GPT	gpt-3.5-turbo gpt-3.5-turbo-16k
Microsoft Azure	OpenAl GPT	gpt-3.5-turbo gpt-3.5-turbo-16k
Amazon Bedrock	Anthropic Claude	anthropic.claude-v1 anthropic.claude-v2
Amazon Bedrock	Amazon Titan	amazon.titan-text-express-v1

**Note:** Cloudera recommends using the Hue AI assistant with the Azure OpenAI service.

For augmenting the results, the SQL AI Assistant uses a Retrieval Augmented Generation (RAG)-based architecture. It uses the sentence-transformer library for semantic search, and Hue can be configured with any of <u>these</u> pre-trained models for better multi-lingual support. By default, **all-MiniLM-L6-v2** models are used.

Embedding Model	Language Support
all-MiniLM-L6-v2	English only

## What data is shared with the LLM models?

The following details are shared with the Large Language Models (LLMs):

- Everything that a user inputs
- Dialect in use
- Table details such as table name, column names, column data types and related keys, partitions, and constraints that the logged-in user has access to.
- Three sample rows from the tables (as per the best practices specified in <u>Rajkumar et al.</u> 2022)

## Prerequisites for enabling the SQL AI Assistant

As an administrator, you must obtain clearance from your organization's infosec team to make sure it is safe to use the SQL AI Assistant because some of the table metadata and data, as mentioned in the previous section, is shared with the LLM.

## Configuring the SQL AI Assistant on the Microsoft Azure OpenAI Service

Microsoft Azure allows dedicated deployments of OpenAI GPT models. Using Azure's OpenAI service is much more secure than the publicly hosted OpenAI APIs because the data can be processed in your Virtual Private Cloud (VPC). Due to security considerations, Cloudera recommends that you use GPT models in Hue SQL AI Assistant with Azure's OpenAI service.

#### Steps

- 1. Obtain a Microsoft Azure subscription by working with your organization's IT team. Subscriptions vary based on your team and purpose.
- Register to access the Azure OpenAI service. Azure OpenAI requires registration and is currently only available to approved enterprise customers and partners. Customers who wish to use Azure OpenAI are required to submit a registration form.
- 3. Create an Azure OpenAI resource in the Azure portal.

Home > Create a resource 3	>	
Marketplace		
Get Started	Azure openai	× PI
Service Providers	/	
M	Azure services only	
Management		
Private Marketplace	Vew: Get Al-genera	ted suggestions for your search.
Private Offer Management		
	Showing 1 to 20 of 29 results for	'azure openai'. <u>Clear search</u>
My Marketplace	~	
Favorites	5	Free trial
My solutions	Azure OpenAl	ChatBot with OPENAI- CHATGPT in Azure
Recently created	Microsoft	readymind
Private plans	Azure Service	SaaS
	The Azure OpenAI service.	Chat Bot with Open AI and ChatGPT
Categories		
Al + Machine Learning (25)		Starte at
IT & Management Tools (11)		US\$5,000.00/1 year
Analytics (3)	Create $\lor$	🕈 Subscribe 🗸 🛇

4. Obtain the resource URL and resource keys from the Develop tab under the resource details page.

You can use any one of the two keys as shown in the following image:

hue-ai-assistant	A 🛪 …				
P Search	« 📑 Go to Azure OpenAI Studio 🔋 Delete				
Ø Overview	↑ Essentials				
Activity log	Resource group (move) : hue-ai API Kind : OpenAl				
So Access control (IAM)	Status : Active Pricing tier : Standard				
A T	Location : East US Endpoints : <u>Click here to view endpoints</u>				
V rags	Subscription (move) : thunderhead-dev Manage keys : <u>Click here to manage keys</u>				
Diagnose and solve problems	Subscription ID :				
Resource Management	Tags (edit) : Add tags				
Keys and Endpoint	Get Started Develop				
Model deployments	Keys and endpoint				
Encryption	Next and encycline				
Pricing tier					
Networking	These keys are used to access your Azure AI service API. Do not share your keys. Store them securely- for				
identity	example, using Azure Key Vault. We also recommend regenerating these keys regularly. Only one keys is necessary to make an AP call. When recoveration the first keys vou can use the second key for continued access to the				
S Cost analysis	service.				
Properties					
A Locks	Show Keys				
LUCKS	KEY 1				
Monitoring					
Alerts	KEY 2				
A Metrics	······				
Diagnostic settings	Location/Region ①				
🔎 Logs	eastus				
Automation	OpenAl				
🖧 Tasks (preview)	Use the below endpoints to call into Azure OpenAI endpoints. Learn more				
Export template	Language APIs https://hue-ai-assistant.openai.azure.com/				

- Go to Azure OpenAl Studio at <u>https://oai.azure.com/portal</u> and create your deployment under Management > Deployments. Select gpt-35-turbo-16k or higher.
- 6. Enable the Hue SQL AI Assistant in CDW as follows:
  - a. Log in to the Data Warehouse service as DWAdmin.
  - b. Go to the Virtual Warehouse tab, locate the Virtual Warehouse on which you want to enable this feature, and click **Edit**.
  - c. Go to CONFIGURATIONS > Hue, select hue-safety-value from the Configuration files drop-down menu, and add the following lines under the [desktop] section: [desktop]

```
[[ai_interface]]
    service='azure'
    model_name='[***DEPLOYMENT-NAME***]'
base_url="https://[***RESOURCE***].openai.azure.com/"
    token="[***RESOURCE-KEY***]"
```

d. Click Apply Changes.

# Configuring the SQL AI Assistant on the OpenAI Service

#### Before you begin

You must have created an account with the OpenAI platform.

#### Steps

- 1. Log in to the OpenAi portal.
- 2. Obtain the API key by navigating to the API keys from the left navigation pane. The key is required to integrate Hue SQL AI Assistant with the OpenAI service.

\$	API keys						
- Playground							
🙁 Assistants	Your secret AP after you gene	Your secret API keys are listed below. Please note that we do not display your secret API keys again after you generate them. Do not share your API key with others, or expose it in the browser or other client-side code. In order to protect the security of your account, OpenAI may also automatically disable any API key that we've					
😤 Fine-tuning	Do not share v						
API keys	protect the sec						
🖹 Files	found has leak	found has leaked publicly.					
d) Usage	NAME	KEY	CREATED	LAST USED 🛈			
Settings					/ 🗇		
	+ Create new	secret key					

- 3. Enable the Hue SQL AI Assistant in CDW as follows:
  - a. Log in to the Data Warehouse service as DWAdmin.
  - b. Go to the Virtual Warehouse tab, locate the Virtual Warehouse on which you want to enable this feature, and click **Edit**.
  - c. Go to CONFIGURATIONS > Hue, select hue-safety-valve from the Configuration files drop-down, and add the following lines under the [desktop] section: [desktop]

```
[[ai_interface]]
    service='openai'
    token='[***API-KEY***]'
```

d. Click Apply Changes.

## Configuring the SQL AI Assistant on the Amazon Bedrock Service

Amazon Bedrock is a fully managed service that makes foundation models from leading AI startups and Amazon available through an API.

#### Before you begin

You must have an AWS account with Bedrock access.

#### Steps

- 1. Log in to the Amazon Bedrock service.
- 2. Obtain your access key and secret as follows:
  - a. Go to the IAM console: https://console.aws.amazon.com/iam
  - b. Click on Users from the left menu and select the user you want to access.
  - c. Click on Security credentials.
  - d. Go to the Access keys section and note the access keys.
- 3. Establish Anthropic Claude access.

Claude from Anthropic is one of the best models available in Bedrock for SQL-related tasks. By default, Claude is not available on Bedrock. You need to place a special request for Claude. Once you have access, you can try Claude in the text playground under the Amazon Bedrock service. If you are in the us-east-1 region, this must take you to <u>https://us-east-1.console.aws.amazon.com/bedrock/home?region=us-east-1#/text-playgroun</u> d.

- 4. Enable the Hue SQL AI Assistant in CDW as follows:
  - a. Log in to the Data Warehouse service as DWAdmin.
  - b. Go to the Virtual Warehouse tab, locate the Virtual Warehouse on which you want to enable this feature, and click **Edit**.
  - c. Go to **CONFIGURATIONS** > **Hue**, select **hue-safety-valve** from the **Configuration files** drop-down menu, and add the following lines:

[aws]

5. Click Apply Changes.

# Service and model-related configurations for setting up the SQL AI Assistant in CDW

You can configure the AI services and models you want to use by going to **CONFIGURATIONS** > **Hue** > **hue-safety-valve** and adding the following lines:

[desktop]

```
[[ai_interface]]
    [***CONFIG-KEY1***]='[***VALUE***]'
    [***CONFIG-KEY2***]='[***VALUE***]'
[[semantic_search]]
    [***CONFIG-KEY1***]='[***VALUE***]'
    [***CONFIG-KEY2***]='[***VALUE***]'
```

Specify the service and model-related configurations under the [[ai\_interface]] section as listed in the following table:

Al interface config key	Description
service	API service to be used for AI tasks. AI is disabled when a service is not configured. For example, azure, openai, bedrock, and ai_assistant.
trusted_service	Indicates whether the LLM is trusted or not. Turn on to disable the warning. The default value is "True".
model	The AI model you want to use for AI tasks. For example, gpt, llama.
model_name	The fully qualified name of the model to be used. For example, gpt-3.5-turbo-16k.
base_url	Service API base URL.
add_table_data	When enabled, sample rows from the table are added to the prompt. The default value is "True".
table_data_cache_size	Size of the LRU cache used for storing table sample data.
auto_fetch_table_meta_limit	Number of tables to load from a database, initially.
token	Service API secret token.
token_script	Provides a secure way to get the service API secret token.

Specify the semantic search-related configurations used for RAG under the [[semantic\_search]] section, as listed in the following table:

Semantic search config key	Description
relevancy	The technology you want to use for semantic search. Acceptable values are vector_search or vector_db.
embedding_model	The model you want to use for data-embedding. This must be compatible with SentenceTransformer.
cache_size	Size of the LRU cache used for storing embedding.

## How to use the SQL AI Assistant?

To launch the Hue AI assistant, click the blue dot on the Hue web interface interface as shown in the following image:



## Generating SQL from NQL

Click **GENERATE** and type the query in natural language as shown in the following image:



The SQL query is generated as shown in the following image. You can insert it into the editor by clicking **Insert** or you can copy the query into the editor.

Suggestion	×
<pre>1 /* NQL: get names of all customers who made a purchanse in april 2023 */ 2 SELECT 3 c_first_name, 4 c_last_name 5 FROM 6 customer 7 WHERE 8 c_customer_sk IN ( 9 SELECT 10 ss_customer_sk 11 FROM 12 store_sales 13 WHERE 14 ss_sold_date_sk &gt;= 2451179 15 AND ss_sold_date_sk &lt;= 2451208 16 )</pre>	💽 Autoformat SQL 💼 Include prompt as comment
ASSUMPTIONS - The "purchanse" in the NQL statement is a typo and should be "purchase". - The date range for April 2023 is assumed to be from April 1, 2023 (2451179) to April 30, 2023 (2451208).	
Insert 😰 Copy to clipboard	Cancel

### Editing the query in natural language

Click Edit as shown in the following image:

🖗 Hive		Generate	Get names of all	customers w	
	🖉 EDIT	♀ EXPLAIN			
1 /* NQL 2 SELECT 3 c_fi	: get name rst_name,	s of all cus	tomers who made	a purchanse in april 2023 */	

Make the required changes and press enter:

Â	Hive	Ľ	Generate	Get names of all customers w
		get name	es of all custo	mers who made a purchanse in June 2023 🛛 🖵
	1 /* NQL:	get nam	es of all cu	stomers who made a purchanse in april 2023 */

### Getting an explanation of a SQL query in natural language

To understand complex queries in natural language, click **EXPLAIN** as shown in the following image:



The LLM generates the explanation of the SQL query as shown in the following image:

Suggestion	×
<pre>     Audomnat SQL @ Madde prompt as comment     SELECT     Solutioner_sk     FROM     Solutioner_sk     FROM     Solutioner_sk     Solutioner_sk</pre>	on comments
SUMMARY	
The SQL query retrieves the names of all customers who made a purchase in April 2023. EXPLANATION	
The provided SQL query retrieves the names of all customers who made a purchase in April 2023. It does this by first selecting the customer IDs from the store_sales table where the sold date falls within the range of April 2023. Then, it selects the first name and last name of the customers from the customer table using the customer IDs obtained from the previous step.	
To achieve this, the query uses a subquery to fitter the store_sales table based on the solid date. The subquery selects the customer IDs from the store_sales table where the solid date is between April 1, 2023 (represented by the date_sk value 2451179) and April 30, 2023 (represented by the date_sk value 2451208).	
The main query then uses the filtered customer IDs to retrieve the first name and last name of the customers from the customer table.	
The expected result of the query is a list of customer names (first name and last name) who made a purchase in April 2023.	
Insert as comment	Cancel

### Optimizing a query

Click **OPTIMIZE** to improve an existing query as shown in the following image:

🖗 Hive	Ľ	Generate	Get names of all customers w
	🖉 EDIT		
1 /* NQL 2 SELECT 3 c_fi	: get names rst_name,	s of all cus	tomers who made a purchanse in april 2023 */

The following example shows how Hue identifies issues, optimizes a query, and provides an explanation:

Suggestion	×
	Contract SQL
1 SELECT 2 COUNT(*) 3 FROM	1 SELECT 2 COUNT(*) 3 FROM
4 - ( 5 - SELECT 6 - FROM 8 - ( 9 - SELECT 10 - FROM 11 - FROM 12 - item 13 - WHERE 14 - i.corrent_price > 1 15 - ) AS b 16 - WHERE 17 - b.i.stategory = 'Children'	
	4 + item
19 WHERE 20 - c.i color = 'red':	5 WHERE
	6 + i_current_price > 1 7 + AND i_category = 'Children' 8 + AND i_color = 'red';
EXPLANATION	
The original query can be optimized by removing unnecessary subqueries. Instead of using nested subqueries, we can combine the conditions in the WHERE clause of a single query. This eliminates the need for multiple levels of subqueries and improves the query performance.	
Insert Copy to clipboard	Cancel

## Fixing a SQL query

Click **FIX** to correct any syntax errors present in your SQL statement causing the query to fail as shown in the following image:

🖗 Hive		Fix Detai	Details of female customers with a coll			
	🖉 EDIT	O EXPLAIN		<del>〕</del> FIX		

For example:

Suggestion	×
	Autoformat SQL
1 SELECT 2 i.item.id, 3 AVE(ss_quantity) AS agg1, 4 AVE(ss_list_price) AS agg2, 5 AVE(ss_coupon_umt) AS agg3, 6 AVE(ss_slest_price AS agg4, 7 AVE(ss_slest_price AS agg4, 8 AVE(ss_slest_price) AVE(ss_slest_pr	1 SELECT 1, item.id, 3 AVD(ss.quanity) AS agg1, 4 AVD(ss.list.price) AS agg2, 5 AVD(ss_coupon_amt) AS agg3,
0 - MIQ(so_sates_hitle vo ayy+	6 + AVG(ss_sales_price) AS agg4
<pre>7 FROM 9 FROM 9 store_sales 0 JOIN customer_demographics ON ss_cdemo_sk = cd_demo_sk 10 JOIN to date_dim ON ss_sold_date_sk = d_date_sk 11 JOIN item ON ss_stem_sk = i_item_sk 12 JOIN promotion ON ss_promo_sk = p_promo_sk 13 WHERE 14 cd_gender = 'F' 15 AND cd_marital_status = 'W' 16 AND cd_deucation_status = 'College' 17 AND (cd_eucation_status = 'College' 18 p_channel_email = 'N' 19 OR p_channel_event = 'N' 20 ) 21 AND d_year = 2001</pre>	<pre>7 FROM 8 store_sales 9 JOIN customer_demographics ON ss_cdemo_sk = cd_demo_sk 10IN customer_demographics ON ss_cremo_sk = cd_demo_sk 10IN item ON ss_cremo_sk = d_dete_sk 10IN promotion ON ss_cremo_sk = p_promo_sk 14 cd_gender = 'F' 15 AND cd_dmarital_status = 'W' 16 AND cd_deducation_status = 'College' AND cd_education_status = 'College' AND d_vear = 2801 1 AND d_vear = 2801</pre>
22 - GROUPBY	
23 i_item_id 24 ORDER BY 25 i_item_id 26 - LIWITS	23 i_item_id 24 ORDER BY 25 i_item_id
	26 + LIMIT
27 168:	27 168;
Insert Ocpy to clipboard	Cancel

## Limitations

- Non-deterministic: LLMs are non-deterministic, which means you cannot guarantee the same output for the same input every time, and it can lead to different responses to similar queries.
- **Ambiguity**: LLMs may struggle to handle ambiguous queries or contexts. SQL queries often rely on specific and unambiguous language, but LLMs can misinterpret or generate ambiguous SQL queries, leading to incorrect results.
- Hallucination: In the context of LLMs, hallucination refers to a phenomenon where these models generate text or responses that are incorrect, nonsensical, or fabricated. Occasionally you might see incorrect identifiers or literals in the response.