re:Invent DECEMBER 2 - 6, 2024 | LAS VEGAS, NV

AIM396-NEW

Unlocking power of structured data with Amazon Bedrock Knowledge Bases



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Agenda

- Al for consumers vs. businesses
- Different approaches to customizing Al
- What is Retrieval Augmented Generation (RAG)
- RAG for structured data
- Demo



What was the last prompt you gave to an LLM?

Can you improve this paragraph for style and grammar?

Can you summarize this article?

Can you draft an email about this topic?

Can you solve this math problem?

Can you explain this complex topic?



You are the CXO of

AnyCompany Marketplace

The easiest way to shop online



What prompts should AnyCompany support?

What's your return policy?



Common approaches for customizing foundation models (FMs)

Complexity cost time

Augment knowledge without changing pre-trained model

Prompt engineering

Retrieval Augmented Generation (RAG) Fine Tuning and Continued Pre-training

Train FM from scratch

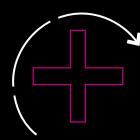


What is Retrieval Augmented Generation (RAG)?



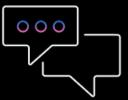
Retrieval

Fetches the relevant content from the external knowledge base or data sources based on a user query



Augmentation

Adding the retrieved relevant context to the user prompt, which goes as an input to the foundation model



Generation

Response from the foundation model based on the augmented prompt



Types of retrieval



Rule-based

Fetches unstructured data like documents

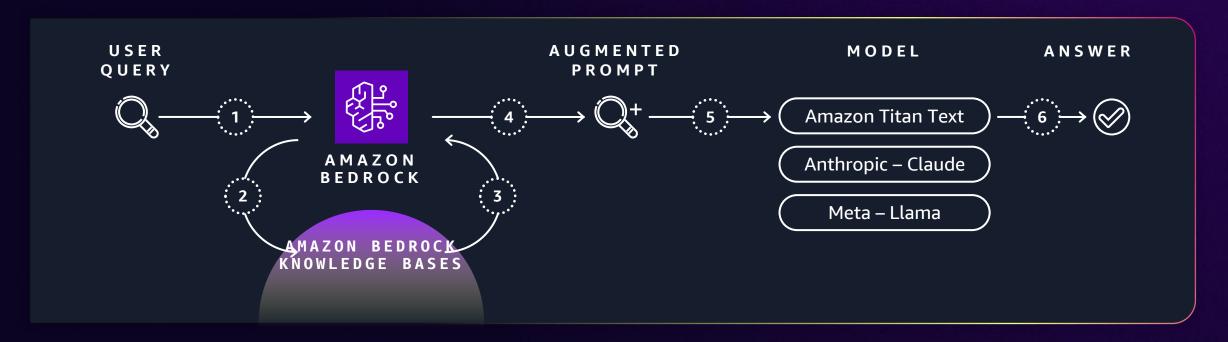
e.g., Keyword searches





Amazon Bedrock Knowledge Bases

FOR UNSTRUCTURED DATA



"What's your return policy for this item?"

"Return policy

- Merchandise, including beauty, must be returned within 30 days
- Merchandise must not be worn, opened, used, altered or washed
- Merchandise must have all tags attached, including seals, and be returned in original packaging"

"You are a customer support agent. Given the context information and not prior knowledge, answer the query.

Context: Return policy . .

Query: What's your return

policy?"

"Hi, rest assured that if for some reason the item isn't to your satisfaction, you can always return the item within 30 days, as long as . . ."



What prompts should AnyCompany support?

What's your return policy?

Do you have size 9 available?

What was the top selling product in November 2024?

What's my order status?

Who was the "Prestige Partner" in November 2024?



Example question: What was the top selling product in November 2024?

order_item_id	product_id	order_id	quantity	price
4319	4044	1437	1	89.99
4320	4015	1437	1	24.99
4321	4034	1437	1	19.99

User_id	username	first_name	Last_name
7001	alejandro_rosa lez	Alejandro	Rosalez
7002	akua_mansa	Akua	Mansa
7003	anacarolina_si lva	Ana Carolina	Silva

id	order_status	user_id	total_amount	ship_mthd	ts1
1437	Delivered	7002	214.96	EXP	2024-11-19 03:45:36
1438	Delivered	7116	629.92	STD	2024-11-04 06:05:15
				•••	

product_id	name	stock_quantity	price	seller_id
4001	Smartphone X	50	699.99	501
4002	Laptop Pro	20	1299.99	501

seller_id	Store_name	User_id	description
501	Tech Store	7001	A cutting-edge electronics store
502	Kitchen Store	7005	go-to destination for top- quality home appliances



Accessing structured data requires more than semantic search

Example question: What was the top selling product in November 2024?

									User id	ı	username		first name	Last_nam
order_item_id	product id	order id	quan	tity	price				osei _tu		——————————————————————————————————————		TITSC_Halle	Last_Hall
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												03:45	5:36	
			1438	Deli	vered	7	116	629.92		S	TD	2024-	-11-04	

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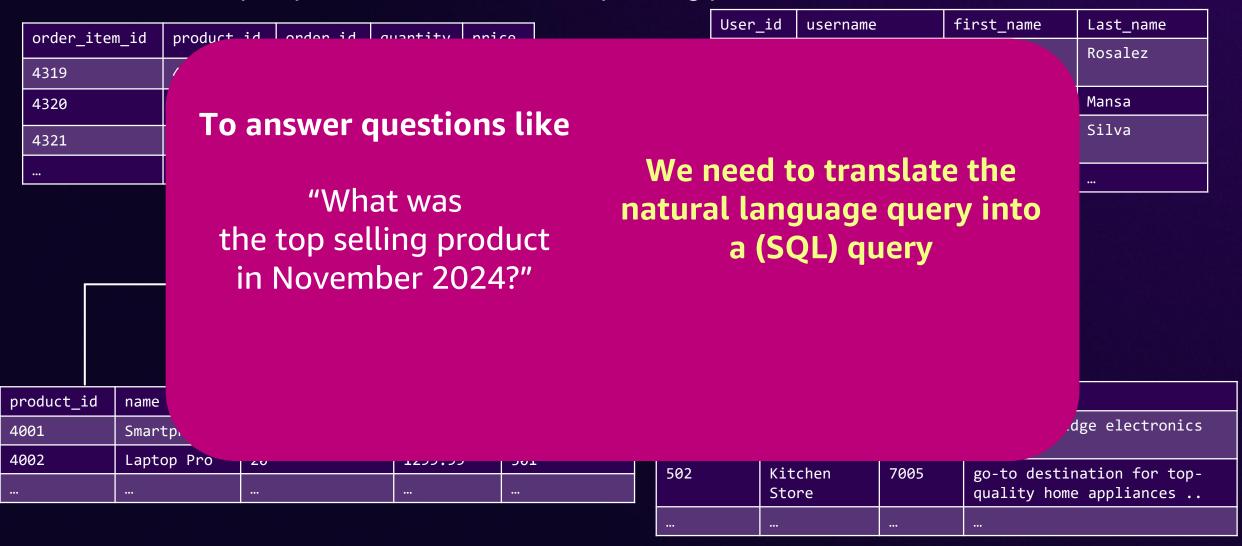
06:05:15

me

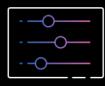


Accessing structured data requires more than semantic search

Example question: What was the top selling product in November 2024?



Typesuof retrievalsqL (NL2SQL) is the RAG for structured data



Rule-based

Fetches unstructured data like documents

e.g., Keyword searches



Semantic search

Get relevant documents based on text embeddings

Subway Statue of Liberty New York Tall buildings



Structured data

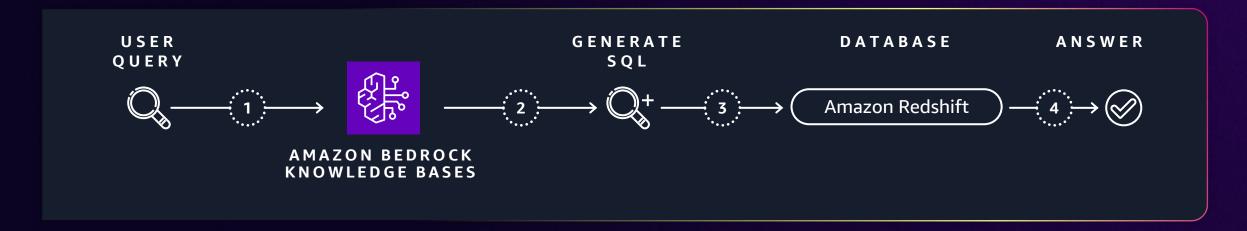
Transactional retrieval from database or API

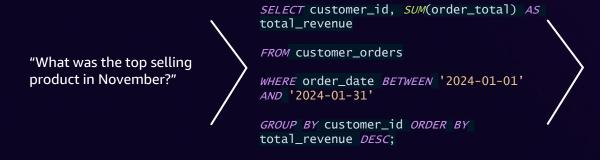
e.g., Select customers from All_orders where order == 'XYZ'

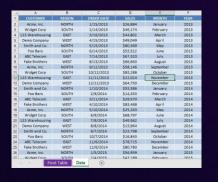


Amazon Bedrock Knowledge Bases

INTRODUCING STRUCTURED DATA RETRIEVAL IN BEDROCK KNOWLEDGE BASES









"In November, the top selling product is YYYY"

A	A	B	C	D	E	F
1	CUSTOMER	REGION	ORDER DATE	SALES	MONTH	YEAR
2	Acme, inc.	NORTH	1/15/2013	\$26,884	January	2013
3	Widget Corp	SOUTH	2/14/2013	\$46,174	February	2013
4	123 Warehousing	EAST	3/16/2013	\$44,802	March	2013





Count the number of schools in Alameda County that have less than 100 test takers



LLM output

```
SELECT COUNT(*)
FROM schools
WHERE district = 'Alameda'
AND test_takers < 100</pre>
```

Expected output

```
SELECT COUNT(*)
FROM schools s
JOIN satscores ss
ON s.CDSCode=ss.cds
WHERE s.County = 'Alameda'
AND ss.NumTstTakr < 100</pre>
```

Personalized to your database, tables, and schema



List the product descriptions of the transactions in gas stations in the Czech Republic



LLM output

SELECT DISTINCT T3.Description
FROM transactions_1k AS T1
INNER JOIN gasstations AS T2
ON T1.GasStationID = T2.GasStationID
INNER JOIN products AS T3
ON T1.ProductID = T3.ProductID
WHERE T2.Country = 'Czech Republic';

Expected output

```
SELECT DISTINCT T3.Description
FROM transactions_1k AS T1
INNER JOIN gasstations AS T2
ON T1.GasStationID = T2.GasStationID
INNER JOIN products AS T3
ON T1.ProductID = T3.ProductID
WHERE T2.Country = 'CZE';
```

Personalized to your data



Of all the contestants, what is the contestant number and name of the contestant who got the least votes?



LLM output

```
SELECT contestant_number, contestant_name
FROM contestants inner join votes on
contestants.contestant_number =
votes.contestant_number
GROUP BY contestant_number, contestant_name
ORDER BY count(*) asc
LIMIT 1;
```

OperationalError ambiguous column name: contestant_number

Expected output

```
SELECT c.contestant_number, c.contestant_name
FROM contestants c inner join votes v on
c.contestant_number = v.contestant_number
GROUP BY c.contestant_number,
c.contestant_name
ORDER BY count(*) asc
LIMIT 1;
```

Personalized to your SQL query engine



How it works

STRUCTURED DATA RETRIEVAL USING GENERATIVE AI

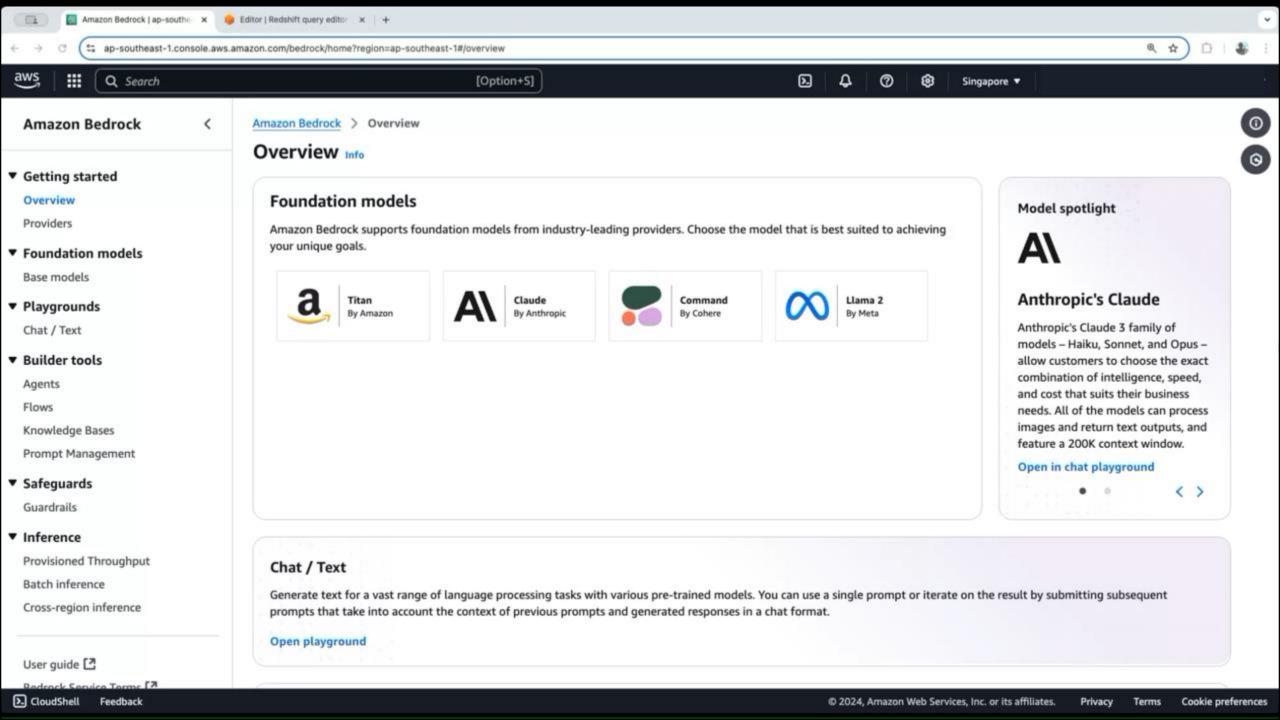


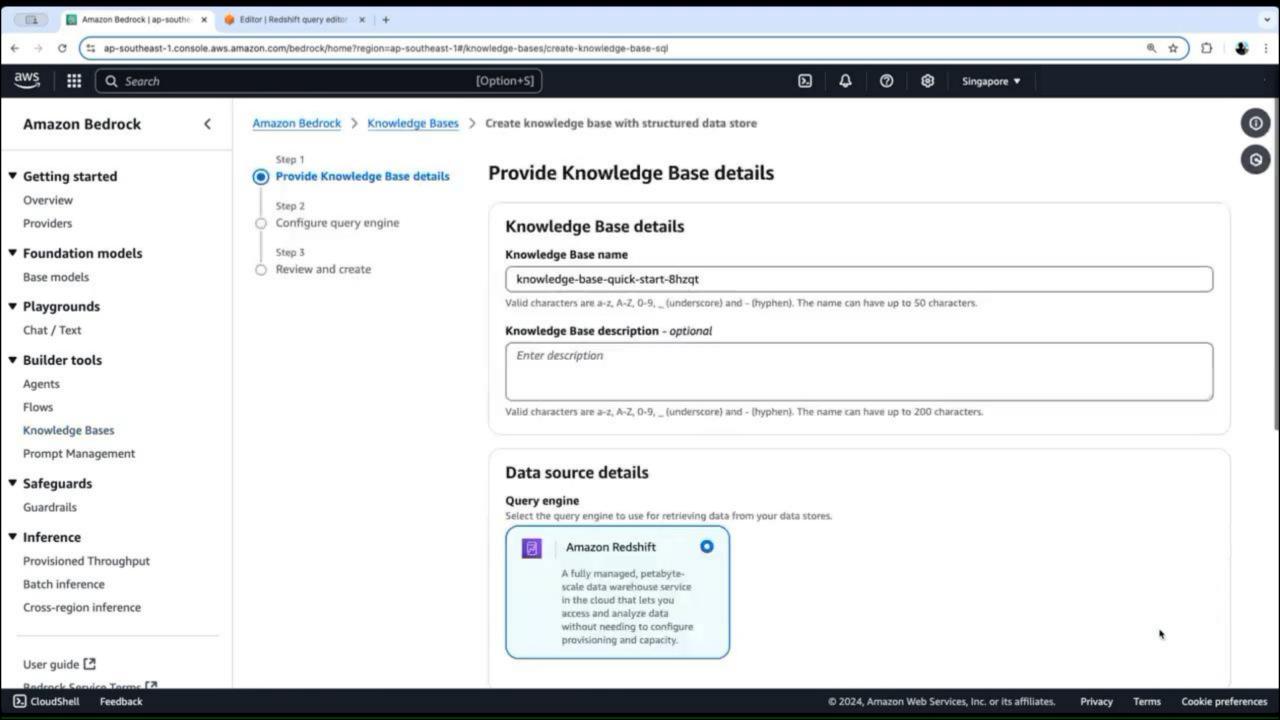
Content processed by Amazon Bedrock Knowledge Bases is not stored or used for service improvement

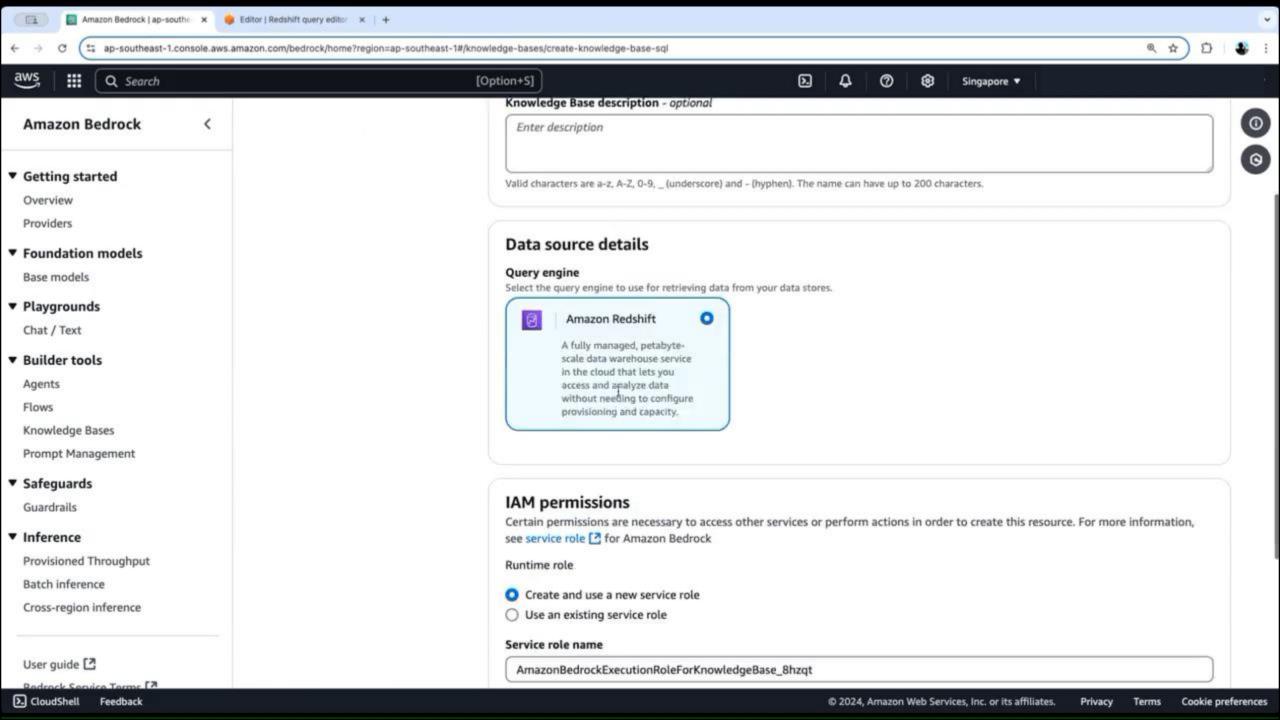


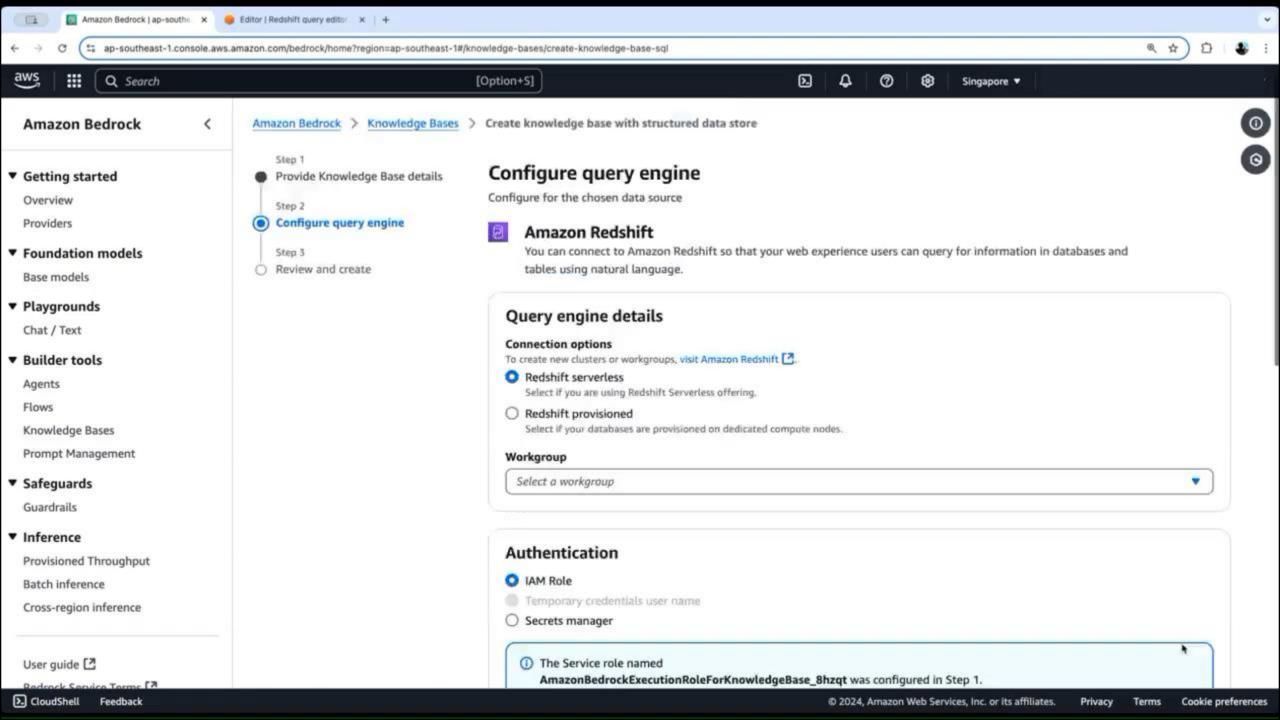
Demo

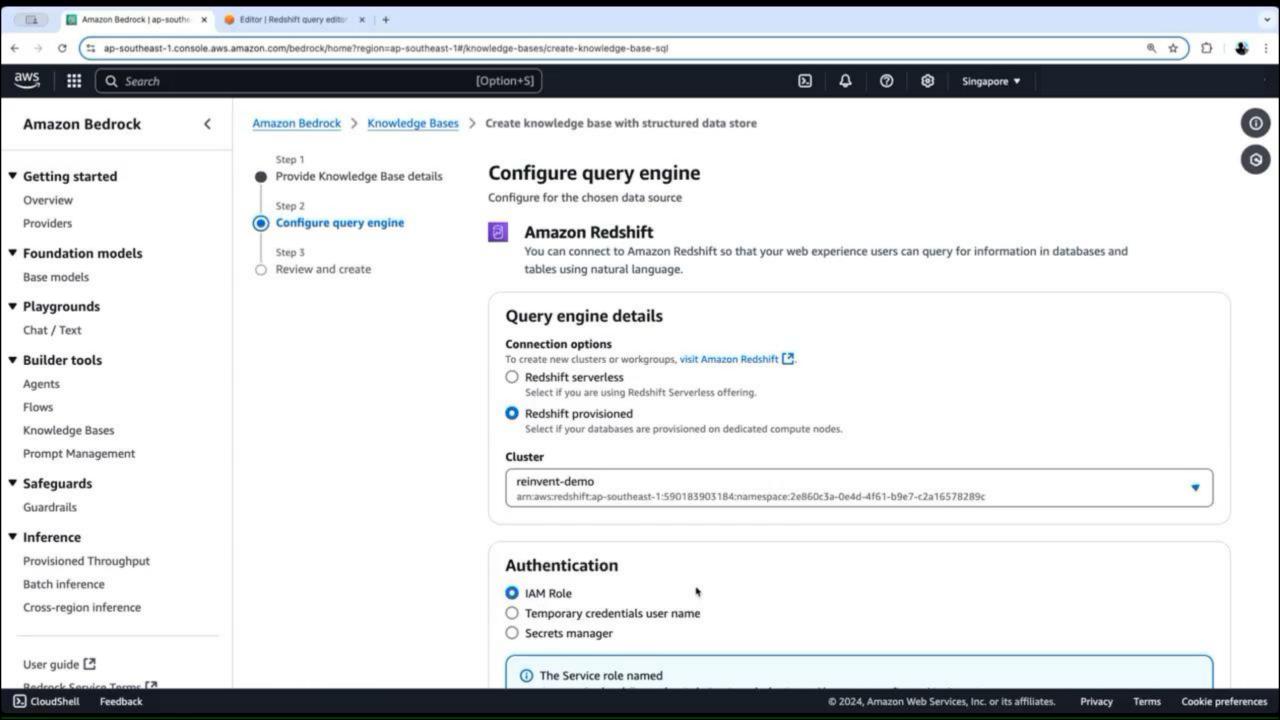


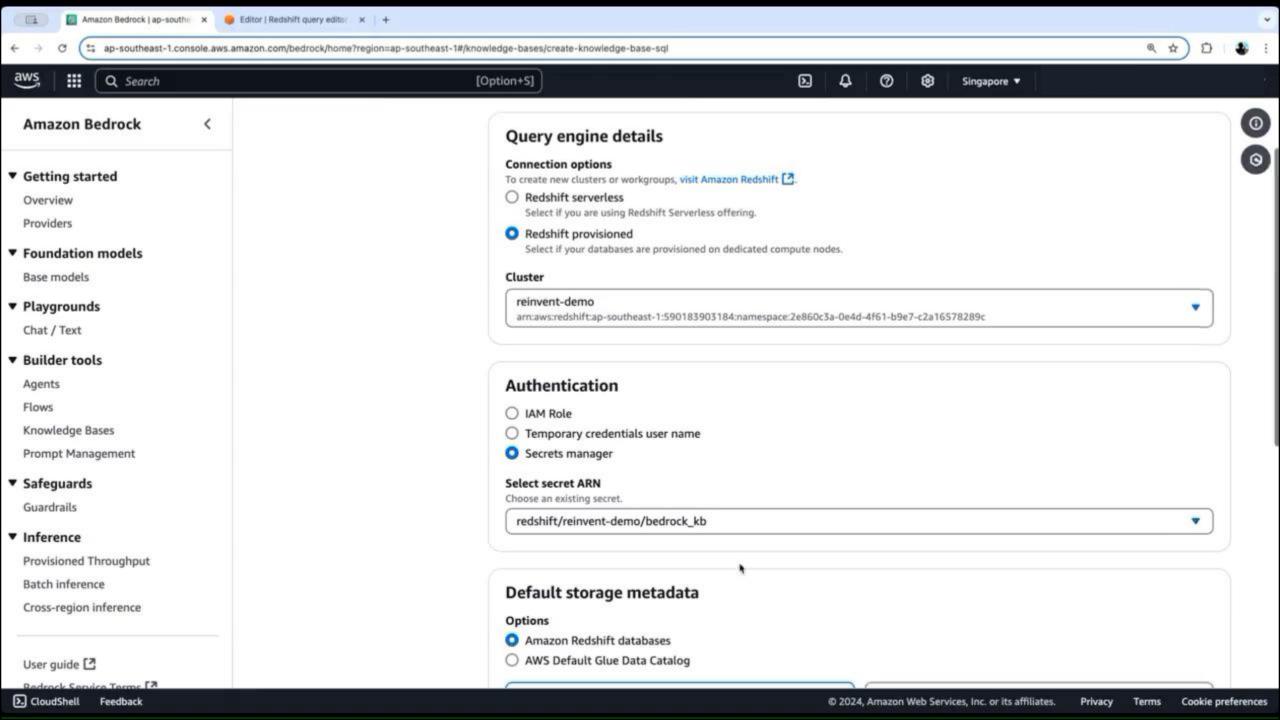


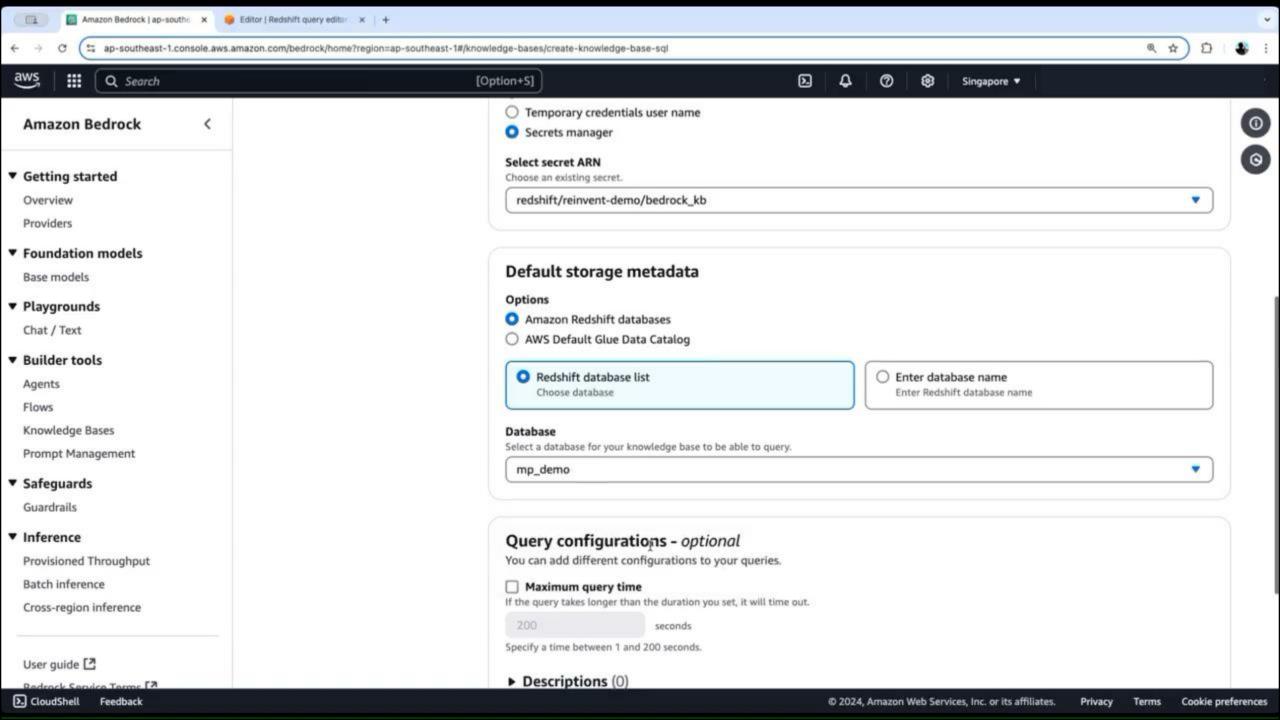


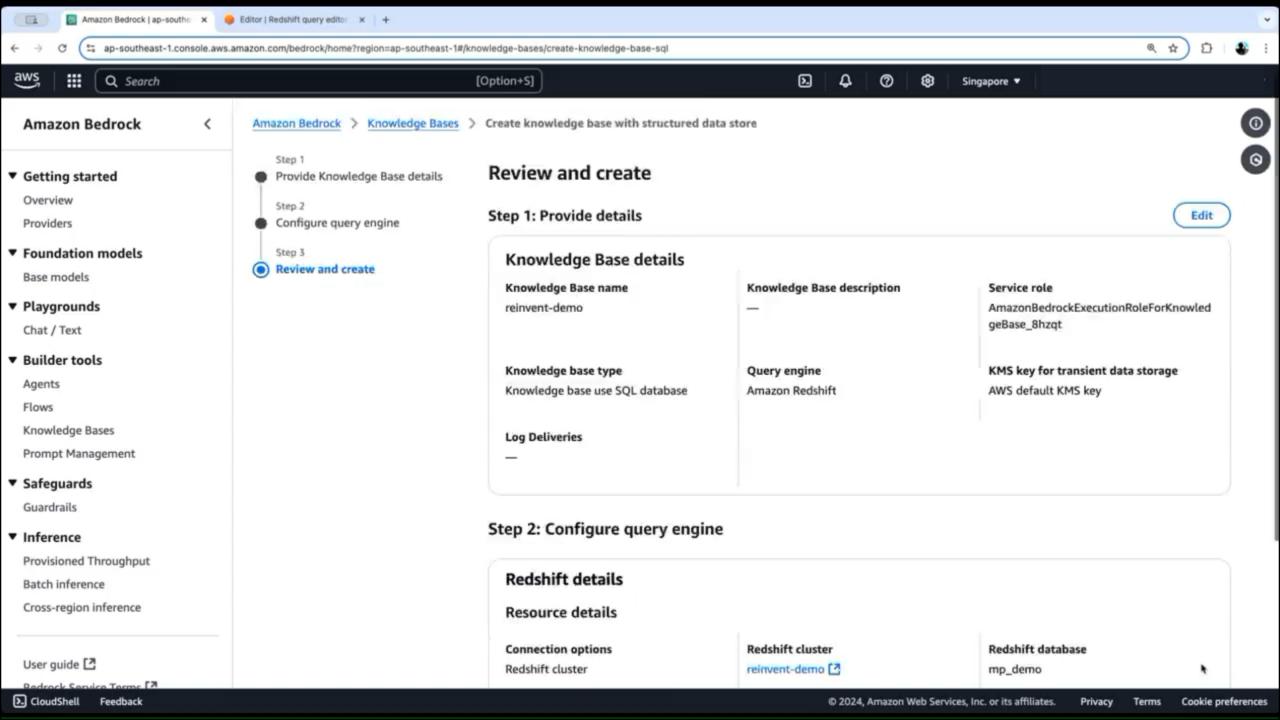


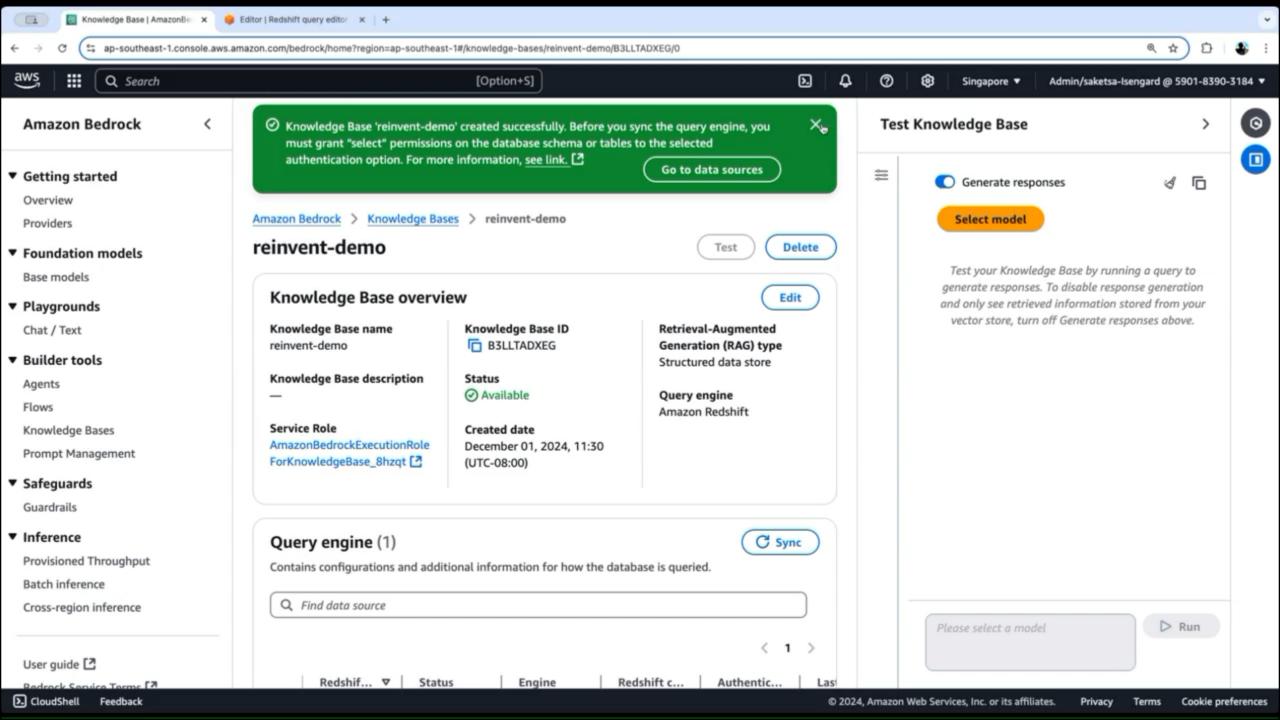


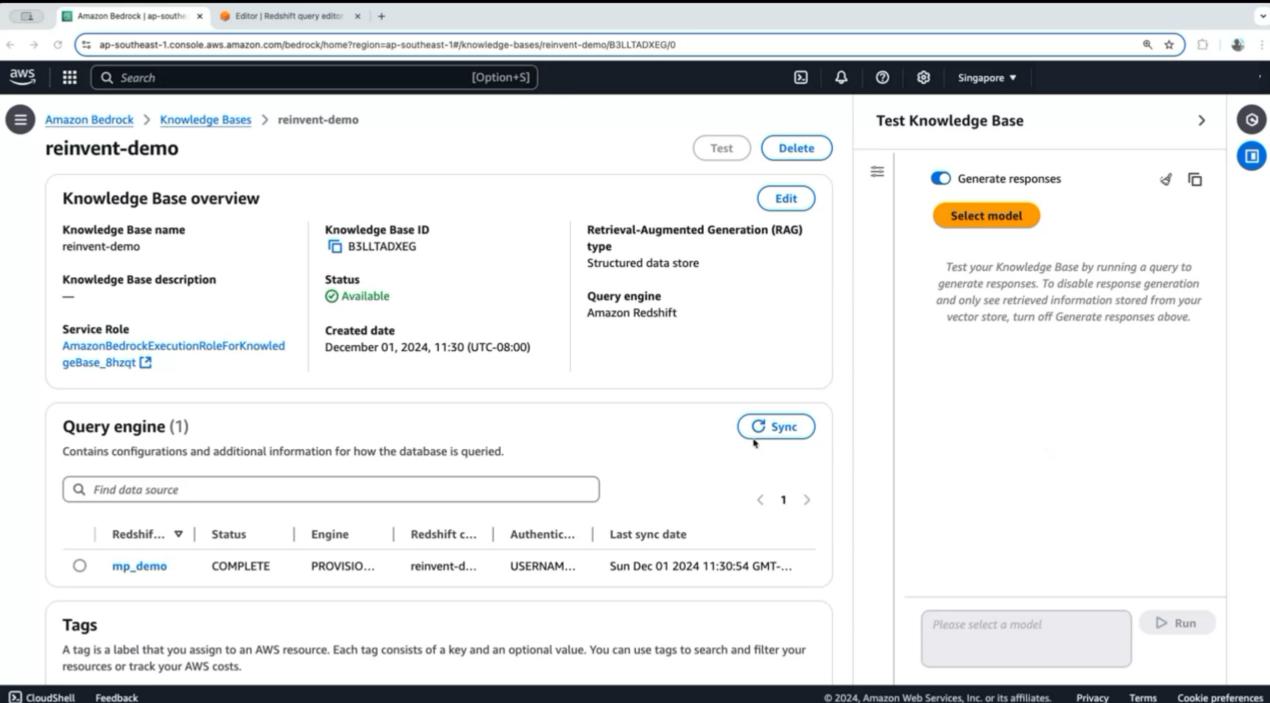






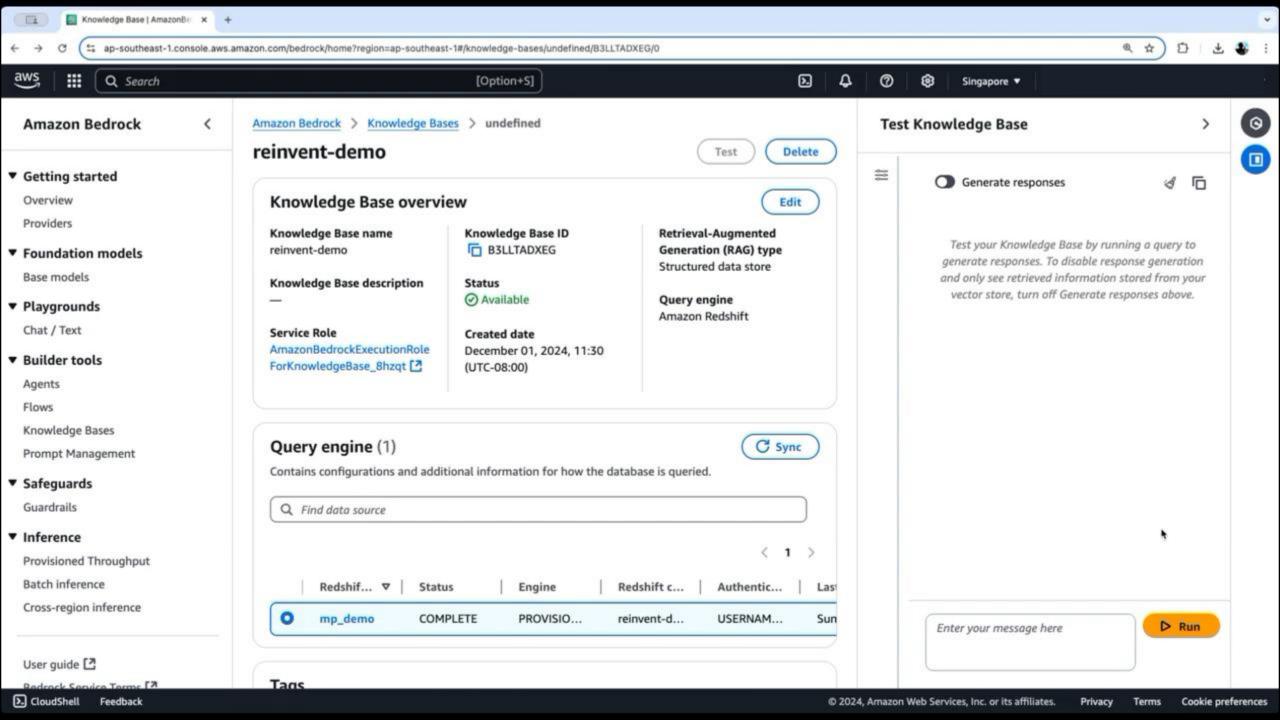


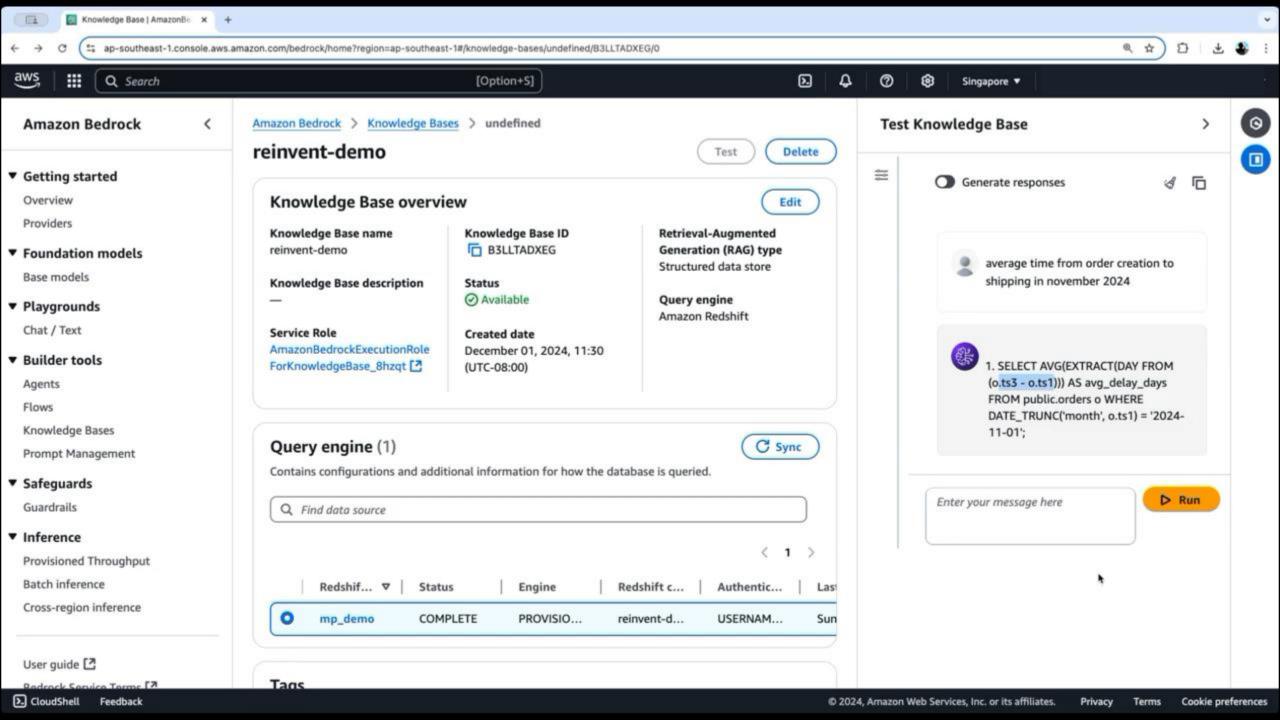


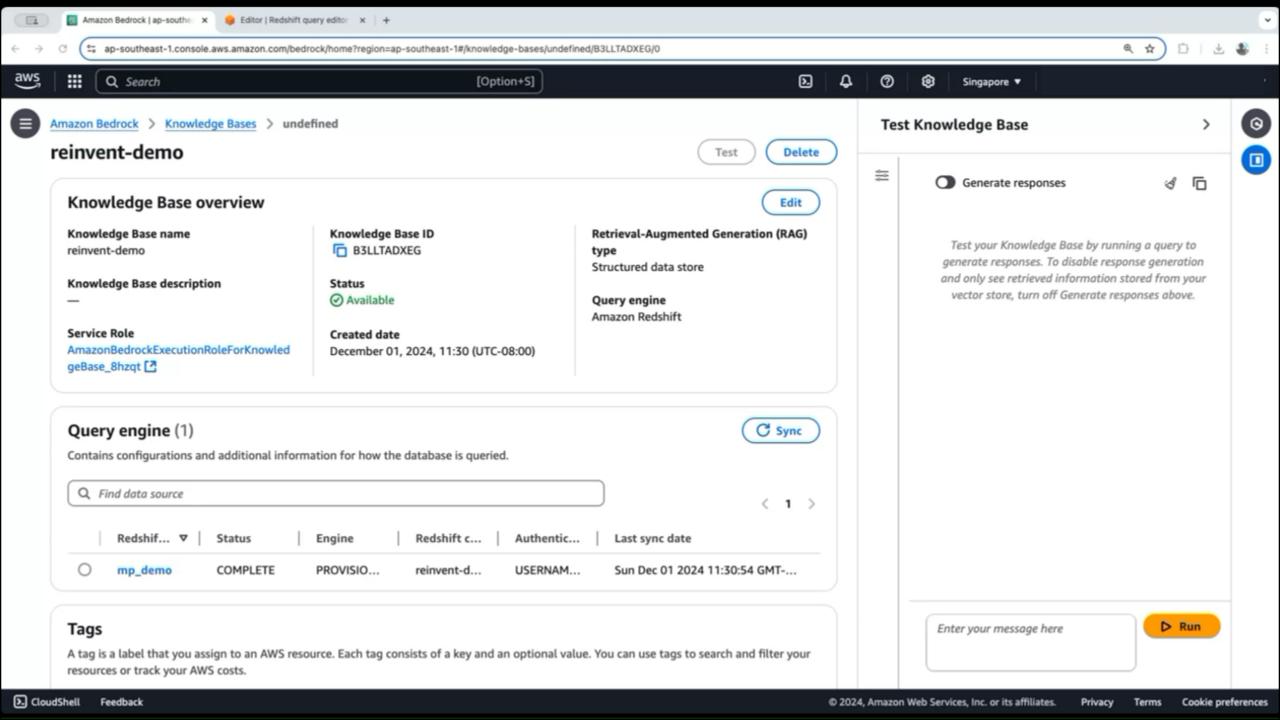


Improving SQL generation



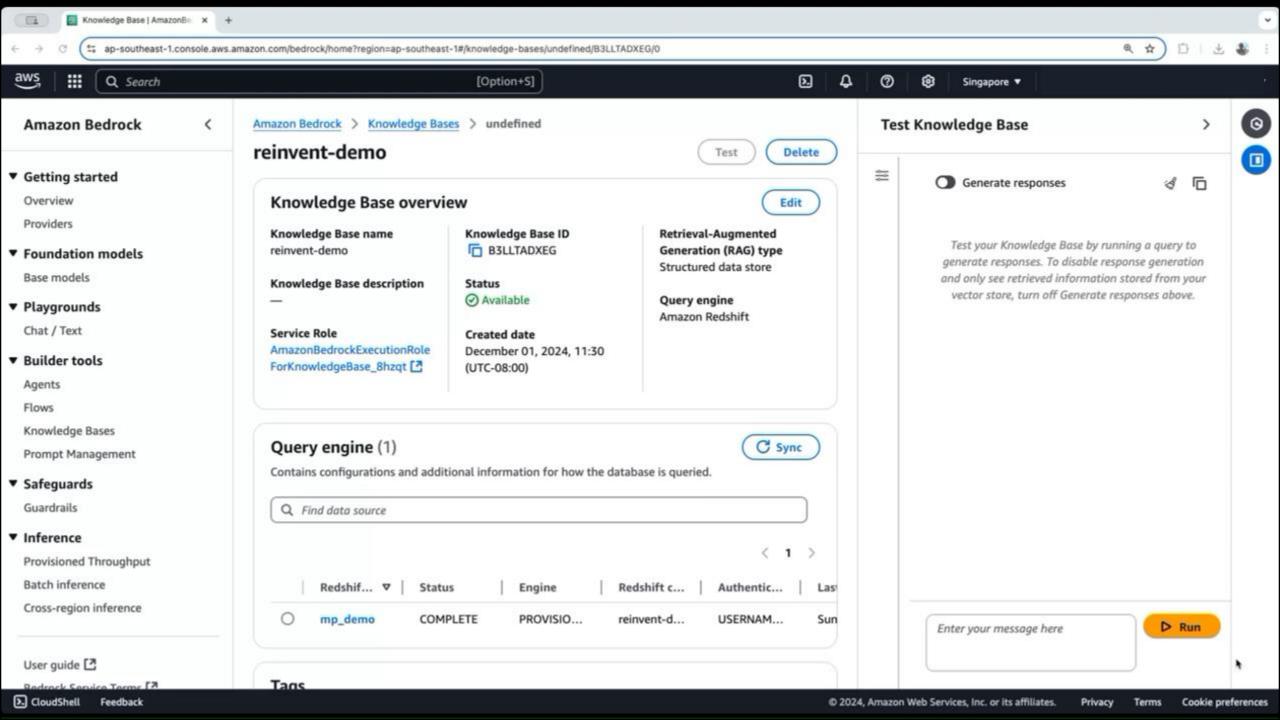


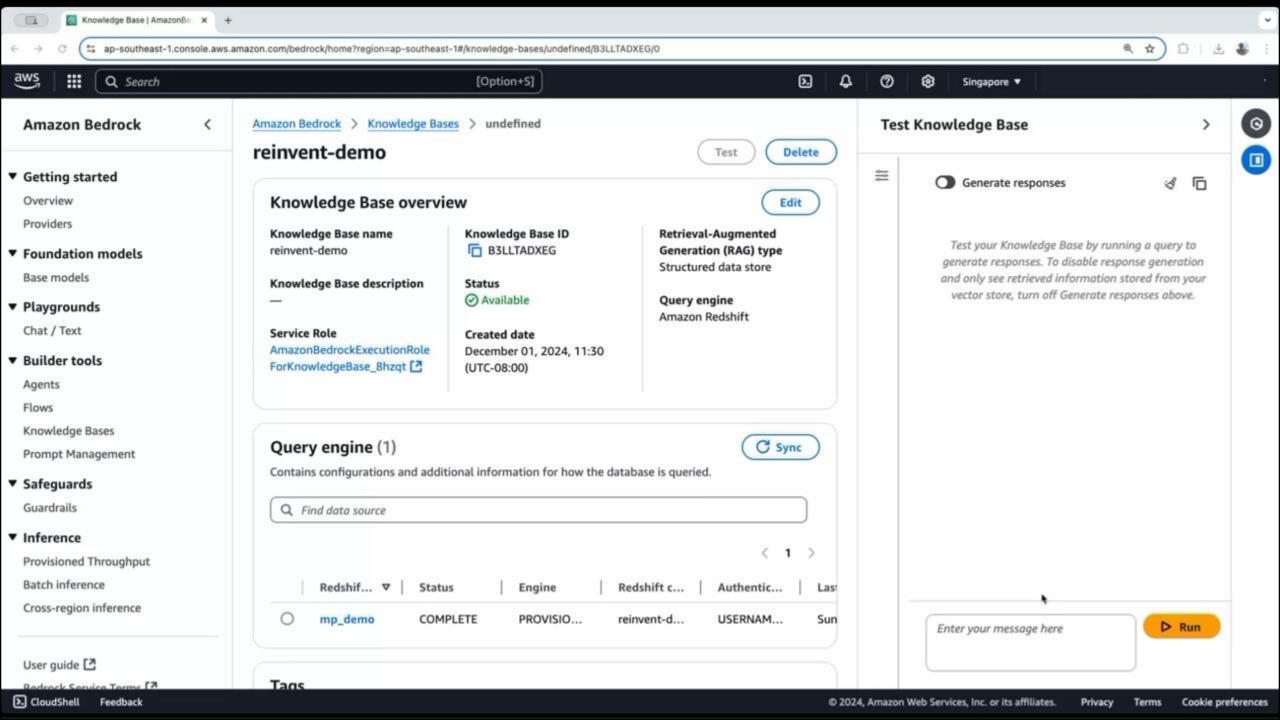




Safety features







Did you catch all that?

Choices to fit your needs Query engine Auth methods Data storage AWS Identity and Access Management Amazon Redshift Serverless and Amazon Redshift Managed Storage (IAM) and Amazon Redshift DB user and AWS Glue Data Catalog Amazon Redshift provisioned clusters Advanced query configurations **Curated queries** Table and column descriptions Table and column inclusion/exclusion Safety features Update protection Delete protection Permission boundary

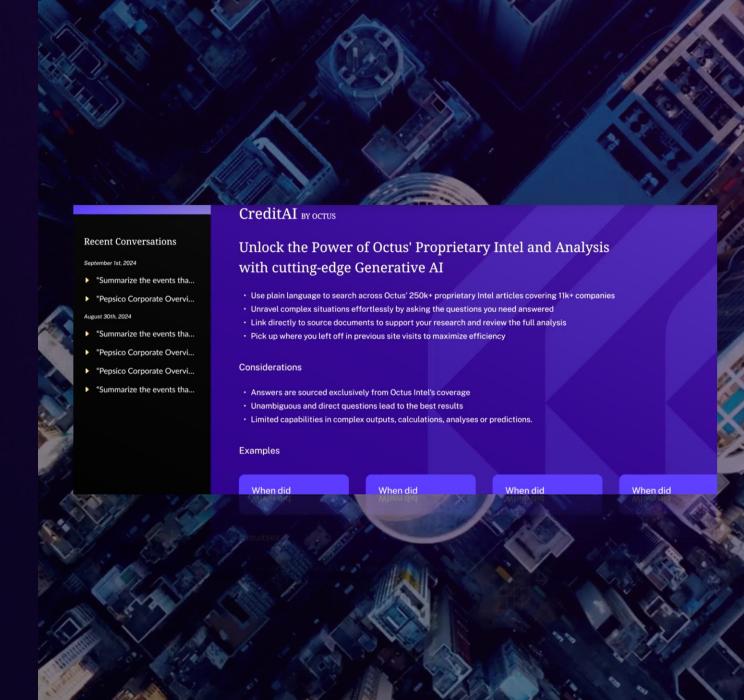




Credit intelligence and data resource for investment banks, buy side firms, law firms, and advisory firms.

Octus, a credit intelligence company, plans to leverage the new structured data retrieval capability in Knowledge Bases to allow end users to query structured data using natural language.

By connecting Knowledge Bases to Octus' existing Master Data Management (MDM) system, end-user prompts can be translated into SQL queries that Amazon Bedrock uses to retrieve the relevant information and return it to the user as part of the application's response. This will help Octus' chatbots deliver precise, data-driven insights to its users and enhance the users' interactions with the company's array of data products.



Recap

- 4 ways to customize AI experiences
- Retrieval Augmented Generation (RAG) gives FM access to latest information from traditional data sources
- Unstructured data is best handled by semantic search
- Structured data is handled by natural language-to-SQL conversion
- Bedrock Knowledge Bases is a fully managed service to orchestrate your RAG workflow, capable of handling both structured and unstructured data



Next steps

- Try Amazon Bedrock Knowledge Bases today!
- Complete the survey
- Come and say hi we'd love to talk with you





Try Amazon Bedrock Knowledge Bases today!

Bedrock Knowledge Bases Code Samples



Thank you!



Try Amazon Bedrock Knowledge Bases today!



Please complete the session survey in the mobile app



Bedrock Knowledge Bases Code Samples

