

## Environment and Tooling Milestone

See the project README.md file for all instructions for running the model and how it works. Consider the README.md a more detailed report. This project report only shows screenshots proving each milestone is complete.

The screenshot below shows the containers started by the project docker compose file(mongo, gradio, qdrant, ollama). ClearML is run from the web instead as shown in the later milestones

The top part of the image shows a terminal window with the command `docker ps` executed. The output lists four containers: `project-mongo-1` (mongo:latest), `project-gradio-1` (project-gradio), `project-qdrant-1` (qdrant/qdrant:latest), and `ollama` (ollama/ollama:latest). Below the terminal, the Docker Desktop interface is shown, displaying a table of running containers with columns for Name, Container ID, Image, Port(s), CPU, and Actions.

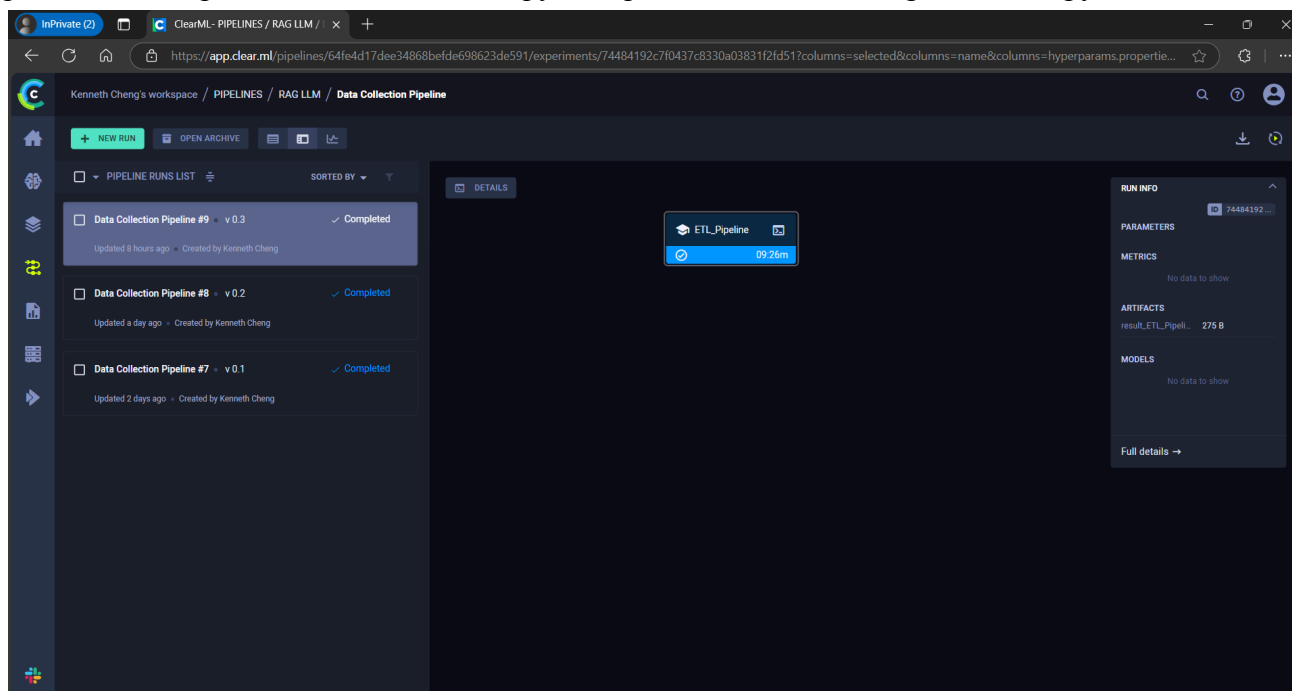
Name	Container ID	Image	Port(s)	CPU	Actions
project	-	-	-	0%	Stop, Restart, Kill, Logs, Details
ollama	b33e0ffe077e	ollama/ollama	11434:11434	0%	Stop, Restart, Kill, Logs, Details
gradio-1	3ddcd14a70d8	project-gradio	7860:7860	0%	Stop, Restart, Kill, Logs, Details
qdrant-1	3cd72e6929a6	qdrant/qdrant	6333:6333	0%	Stop, Restart, Kill, Logs, Details
mongo-1	b32301bc474b	mongo:latest	27017:27017	0%	Stop, Restart, Kill, Logs, Details

After running docker compose up, you can see the containers respond whenever running files in the project folder if setup correctly. (Ignore the output jargon)

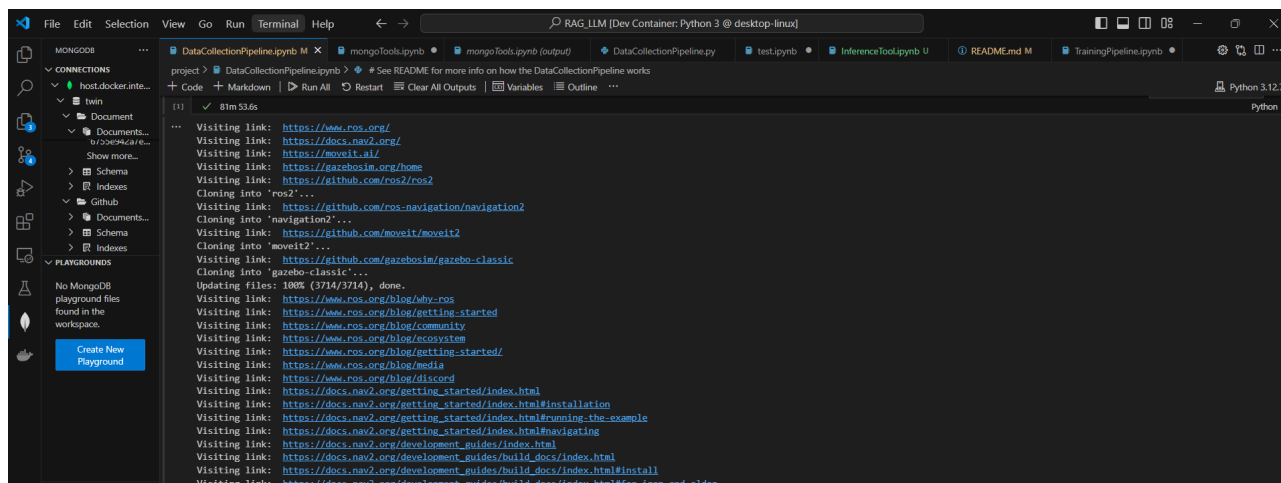
The screenshot shows a Windows PowerShell window with log output from several services. The logs include messages from `actix_server`, `qdrant`, `mongo`, and `ollama`. The `mongo` logs show the start of the MongoDB service, including the `initandlisten` phase and the `WiredTiger` storage engine initialization. The `ollama` logs show the server configuration and the start of the `actix_server`.

## ETL Milestone

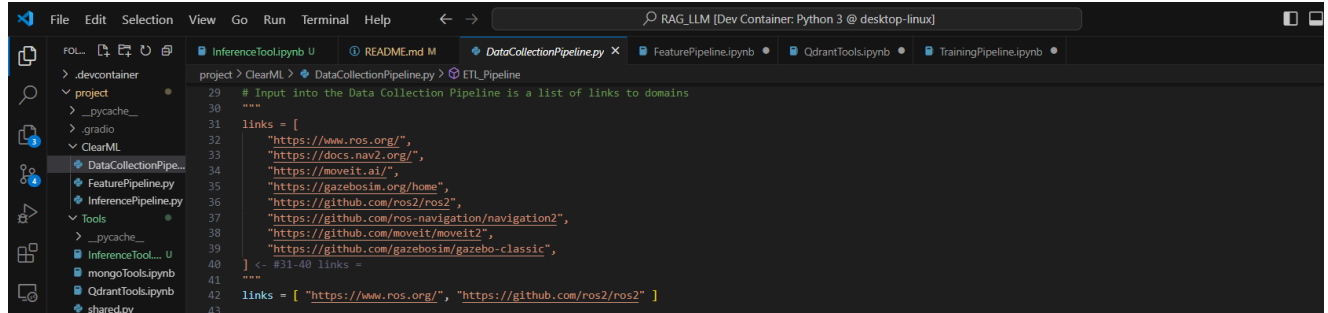
The image below shows the ClearML/DataCollectionPipeline.py result in the ClearML website. It takes in links as parameters and outputs a list of texts from documents(documentation) and codes(github files) that come from the links it crawled. ClearML was run only on files related to the “ros” domain to save time. You can run either the ClearML or the ipynb notebook on the full input since they do the same thing, but ClearML requires setup and takes longer while the ipynb prints some output to the terminal, thus ipynb is preferred. Next I will go over the ipynb



The image below shows part of the output after running the DataCollectionPipeline.ipynb on the full list of links. It took an entire 81 minutes, so it might make sense to test the model on only the “ros” links(and ask it questions related to only that link). Related code shown next



Consider changing the links in the DataCollection.ipynb file to be similar to those in the ClearML/DataCollection.py file before running it to search only the ROS subdomain.

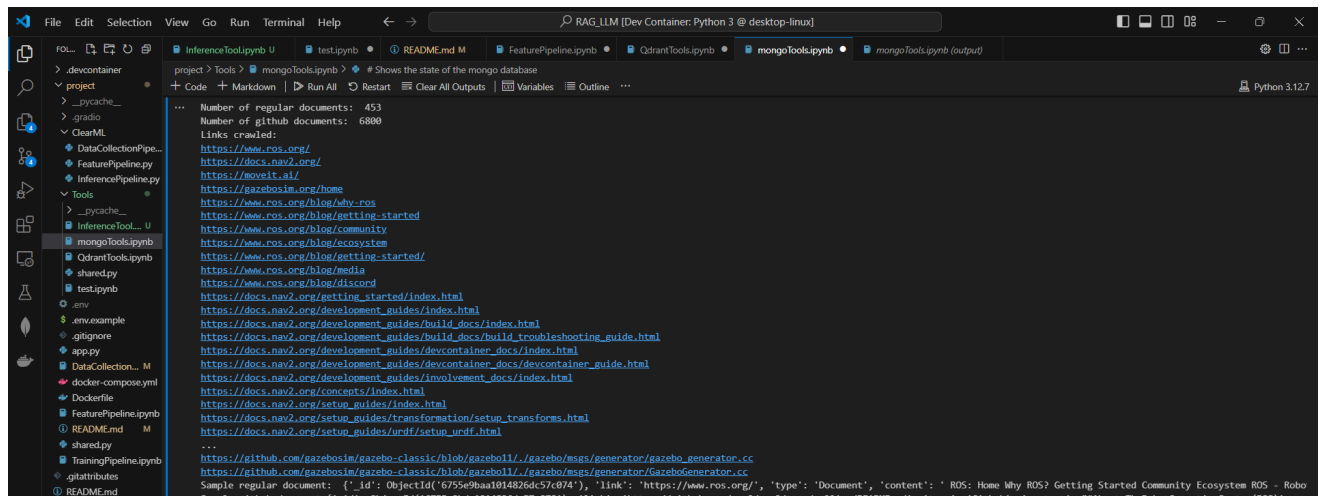


```
project > ClearML > DataCollectionPipeline.py > ETI_Pipeline
29 # Input into the Data Collection Pipeline is a list of links to domains
30 """
31 links = [
32     "https://www.ros.org/",
33     "https://docs.nav2.org/",
34     "https://moveit.ai/",
35     "https://gazeboim.org/home",
36     "https://github.com/ros2/ros2",
37     "https://github.com/ros-navigation/navigation2",
38     "https://github.com/moveit/moveit2",
39     "https://github.com/gazeboim/gazebo-classic",
40 ] <- #31-40 links =
41 """
42 links = [ "https://www.ros.org/", "https://github.com/ros2/ros2" ]
43
```

Alternatively, you can replace the following lines with “pass” to avoid searching all links inside each website(which each would have links of their own and so on, creating a massive tree of links). This large tree of links formed is the main reason the crawling takes over an hour.

```
#print("Adding subdirectory: ", link + subdirectory)
links.append(newLink)
```

The image below shows Tools/mongoTools.ipynb giving a summary of what was stored in the mongoDB. In total, 453 documents and 6800 code files were processed. And samples of what the documents and code looks like is shown at the bottom. Each piece of data contains an id, link, document type, and text content.

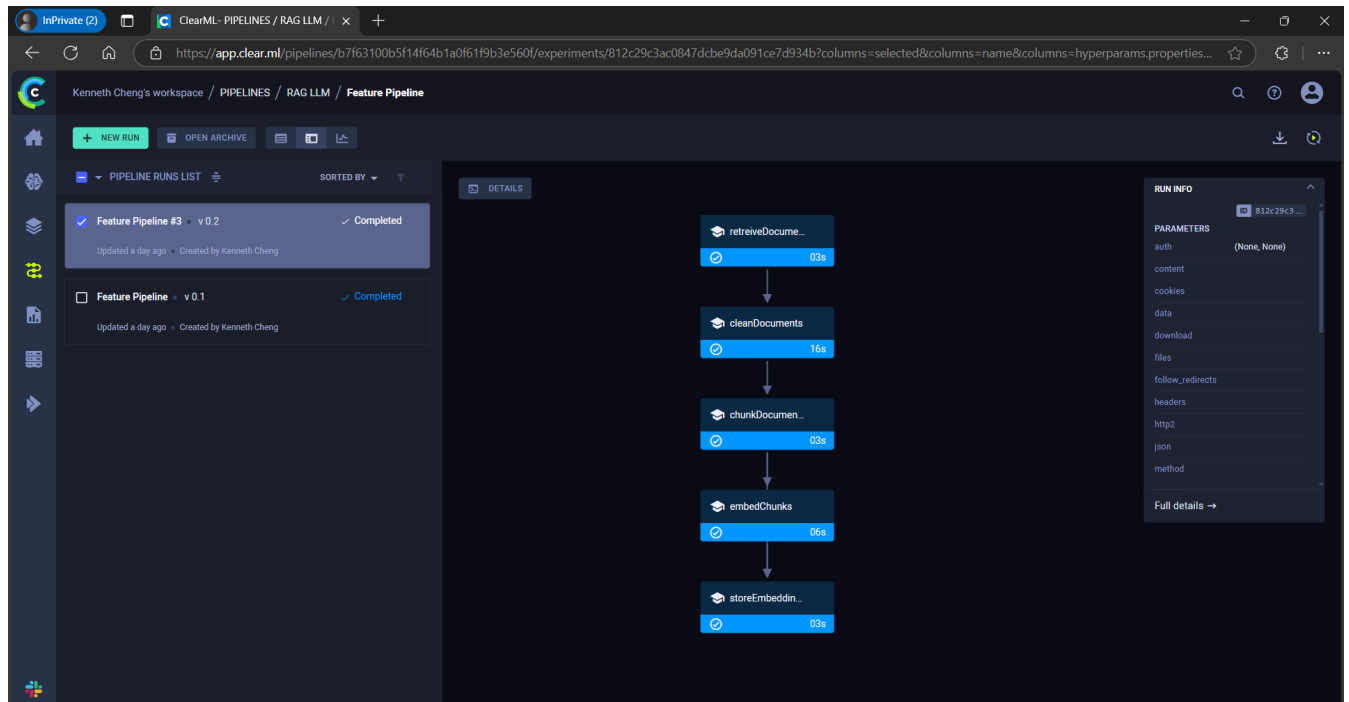


```
project > Tools > mongoTools.ipynb > Shows the state of the mongo database
+ Code + Markdown | Run All | Restart | Clear All Outputs | Variables | Outline ...
Python 3.12.7

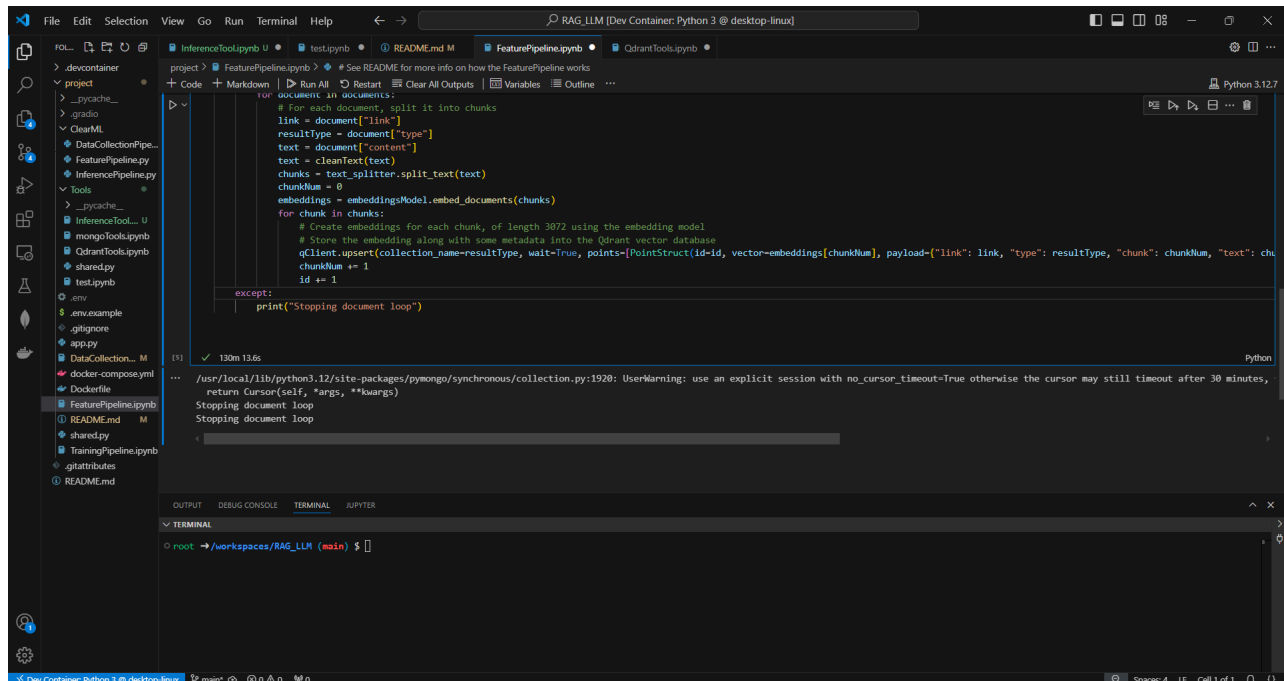
...
Number of regular documents: 453
Number of github documents: 6800
Links crawled
https://www.ros.org/
https://docs.nav2.org/
https://moveit.ai/
https://gazeboim.org/home
https://www.ros.org/blog/why-ros
https://www.ros.org/blog/getting-started
https://www.ros.org/blog/community
https://www.ros.org/blog/ecosystem
https://www.ros.org/blog/getting-started/
https://www.ros.org/blog/media
https://www.ros.org/blog/discord
https://docs.nav2.org/getting_started/index.html
https://docs.nav2.org/development_guides/index.html
https://docs.nav2.org/development_guides/build_docs/index.html
https://docs.nav2.org/development_guides/build_docs/build_troubleshooting_guide.html
https://docs.nav2.org/development_guides/devcontainer_docs/index.html
https://docs.nav2.org/development_guides/devcontainer_docs/devcontainer_guide.html
https://docs.nav2.org/development_guides/involvement_docs/index.html
https://docs.nav2.org/consents/index.html
https://docs.nav2.org/setup_guides/index.html
https://docs.nav2.org/setup_guides/transformation/setup_transforms.html
https://docs.nav2.org/setup_guides/urdf/setup_urdf.html
...
https://github.com/gazeboim/gazebo-classic/blob/gazebo11/gazebo_msgs/generator/gazebo_generator.cc
https://github.com/gazeboim/gazebo-classic/blob/gazebo11/gazebo_msgs/generator/GazeboGenerator.cc
Sample regular document: {'_id': ObjectId('6755e9baa1014826dc57c074'), 'link': 'https://www.ros.org/', 'type': 'Document', 'content': ' ROS: Home Why ROS? Getting Started Community Ecosystem ROS - Robo
Sample github document: {'_id': ObjectId('6755e9baa1014826dc57c074'), 'link': 'https://github.com/ros2/ros2/tree/polling/README.md', 'type': 'Github', 'content': '#About TheRobotOperatingSystem(ROS)Issue
```

## Featurization Pipeline Milestone

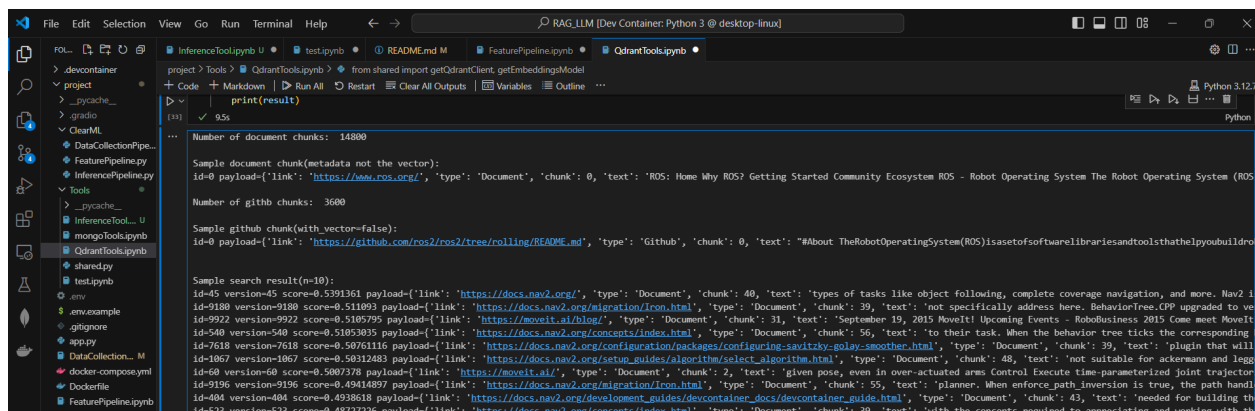
The ClearML/FeaturePipeline.py file retrieves documents, cleans them, chunks them, creates embeddings, then stores those embeddings in Qdrant as shown in the ClearML website below



The image below shows the FeaturePipeline.ipynb being run. The pipeline took over 2 hours to run(depends on links crawled from DataPipeline). It took so long, the Qdrant cursor/iterator timed out, skipping some links.



The image below shows the first cell of Tools/qdrantTools.ipynb being used to show summary of the Qdrant vector database after running the FeaturePipeline.ipynb notebook to store embeddings in it.



```
project > Tools > QdrantTools.ipynb > From shared import getQdrantClient, getEmbeddingsModel

print(result)

...
Number of document chunks: 14800

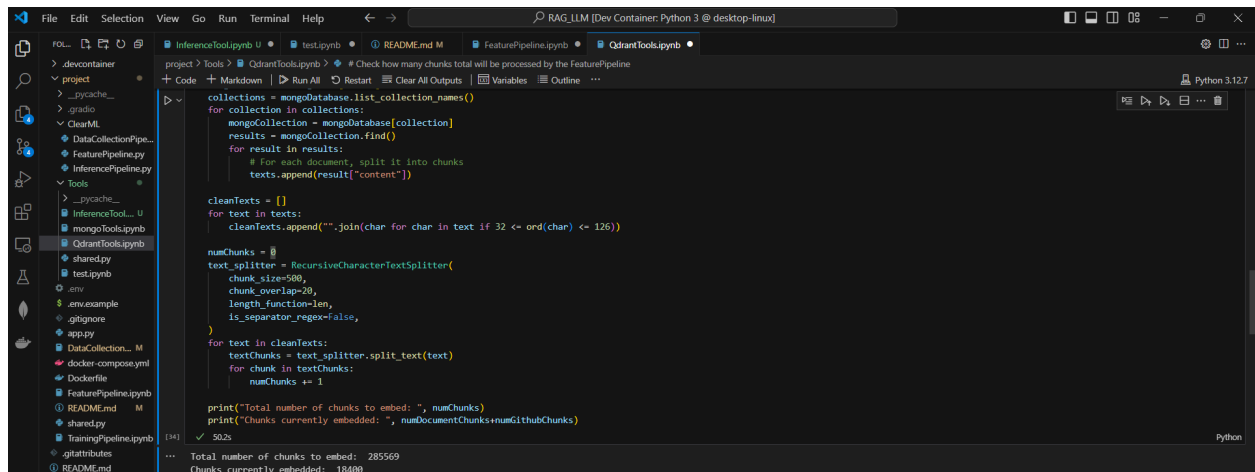
Sample document chunk(metadata not the vector):
id=0 payload={'link': 'https://www.ros.org/', 'type': 'Document', 'chunk': 0, 'text': 'ROS: How Why ROS? Getting Started Community Ecosystem ROS - Robot Operating System The Robot Operating System (ROS

Number of github chunks: 3600

Sample github chunk(with_vector=false):
id=0 payload={'link': 'https://github.com/ros2/ros2/tree/rolling/README.md', 'type': 'Github', 'chunk': 0, 'text': '#About TheRobotOperatingSystem(ROS)isasetofsoftwarelibrariesandtoolsthathelpyoubuildro

Sample search result(n=10):
id=45 version=45 score=0.5391361 payload={'link': 'https://docs.nav2.org/', 'type': 'Document', 'chunk': 40, 'text': 'types of tasks like object following, complete coverage navigation, and more. Nav2 i
id=9180 version=9180 score=0.511093 payload={'link': 'https://docs.nav2.org/migration/iron.html', 'type': 'Document', 'chunk': 39, 'text': 'not specifically address here. BehaviorTree.CPP upgraded to ve
id=9922 version=9922 score=0.5105795 payload={'link': 'https://moveit.ai/blog/', 'type': 'Document', 'chunk': 31, 'text': 'September 19, 2015 MoveIt! Upcoming Events - RoboBusiness 2015 Come meet MoveIt
id=540 version=540 score=0.51053035 payload={'link': 'https://docs.nav2.org/concepts/index.html', 'type': 'Document', 'chunk': 56, 'text': 'to their task. When the behavior tree ticks the corresponding
id=7618 version=7618 score=0.50761116 payload={'link': 'https://docs.nav2.org/configuration/packages/configuring-savitzky-golay-smoother.html', 'type': 'Document', 'chunk': 39, 'text': 'plugin that will
id=1067 version=1067 score=0.50321043 payload={'link': 'https://docs.nav2.org/setup_guides/algorithm/select_algorithm.html', 'type': 'Document', 'chunk': 40, 'text': 'not suitable for ackermann and legs
id=60 version=60 score=0.5007378 payload={'link': 'https://moveit.ai/', 'type': 'Document', 'chunk': 2, 'text': 'given pose, even in over-actuated arms Control Execute time-parameterized joint trajectory
id=9196 version=9196 score=0.49414897 payload={'link': 'https://docs.nav2.org/migration/iron.html', 'type': 'Document', 'chunk': 55, 'text': 'planner. When enforce_path_inversion is true, the path handl
id=404 version=404 score=0.4938618 payload={'link': 'https://docs.nav2.org/development_guides/devcontainer_docs/devcontainer_guide.html', 'type': 'Document', 'chunk': 43, 'text': 'needed for building th
id=523 version=523 score=0.48727226 payload={'link': 'https://docs.nav2.org/concepts/index.html', 'type': 'Document', 'chunk': 39, 'text': 'with the concepts required to appreciating and working with th
```

The image below shows the second cell of Tools/qdrantTools.ipynb being used to show how many embeddings were completed.



```
project > Tools > QdrantTools.ipynb > # Check how many chunks total will be processed by the FeaturePipeline

collections = mongoDatabase.list_collection_names()
for collection in collections:
    mongoCollection = mongoDatabase[collection]
    results = mongoCollection.find()
    for result in results:
        # For each document, split it into chunks
        texts.append(result["content"])

cleanTexts = []
for text in texts:
    cleanTexts.append("".join(char for char in text if 32 <= ord(char) < 126))

numChunks = 0
text_splitter = RecursiveCharacterTextSplitter(
    chunk_size=500,
    chunk_overlap=20,
    length_function=len,
    is_separator_regex=False,
)
for text in cleanTexts:
    textChunks = text_splitter.split_text(text)
    for chunk in textChunks:
        numChunks += 1

print("Total number of chunks to embed: ", numChunks)
print("Chunks currently embedded: ", numDocumentChunks+numGithubChunks)

...
Total number of chunks to embed: 285569
Chunks currently embedded: 18400
```

The third cell shows a proof of concept for cosine distance(used to retrieve embeddings)



```
import numpy as np
# How cosine distance works

queryEmbedding = embeddingsModel.embed_query("What is the weather like?")
documentEmbedding = embeddingsModel.embed_documents(["It is raining today.", "ROS is an open source platform"])

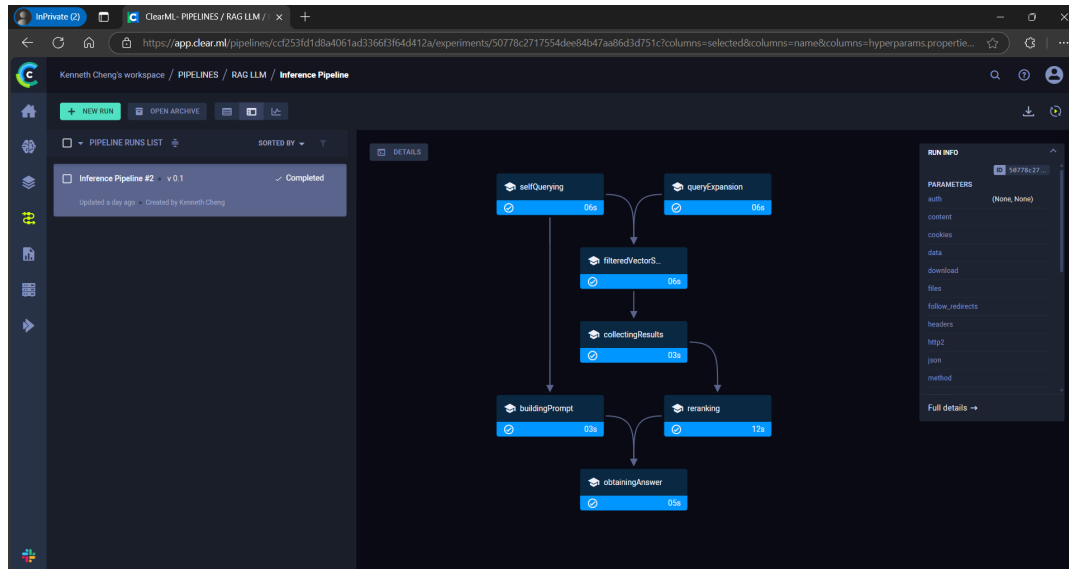
def cosine_similarity(vec1, vec2):
    dot_product = np.dot(vec1, vec2)
    norm_vec1 = np.linalg.norm(vec1)
    norm_vec2 = np.linalg.norm(vec2)
    return dot_product / (norm_vec1 * norm_vec2)

similarity1 = cosine_similarity(queryEmbedding, documentEmbedding[0])
similarity2 = cosine_similarity(queryEmbedding, documentEmbedding[1])
print("Cosine Similarity for related sentences:", similarity1)
print("Cosine Similarity for unrelated sentences:", similarity2)

...
Cosine Similarity for related sentences: 0.523006986899456
Cosine Similarity for unrelated sentences: 0.3225965309127344
```

## Deploying the App Milestone

To generate an answer: the ClearML/InferencePipeline.py file performs query expansion to generate a related query (rewording query may lead to retrieving more useful embeddings), performs self-querying to get metadata about the query, searches for related vectors/embeddings compared to the query and related query(from query expansion), concatenates the results of the searches, reranks the results to filter out the most useful ones, builds a prompt using the query metadata and results, then feeds the prompt to the model to return the answer. The image below shows the ClearML website giving a overview of what this process looks like



The image below shows Tools/InferenceTool.ipynb showing the output of each step that was used to generate an answer to a sample prompt along with a comparison to the original model. You can change the query to whatever you want and it will give a similar answer as gradio. The first link confirms that the answer is correct while the baseline model did not know the answer!

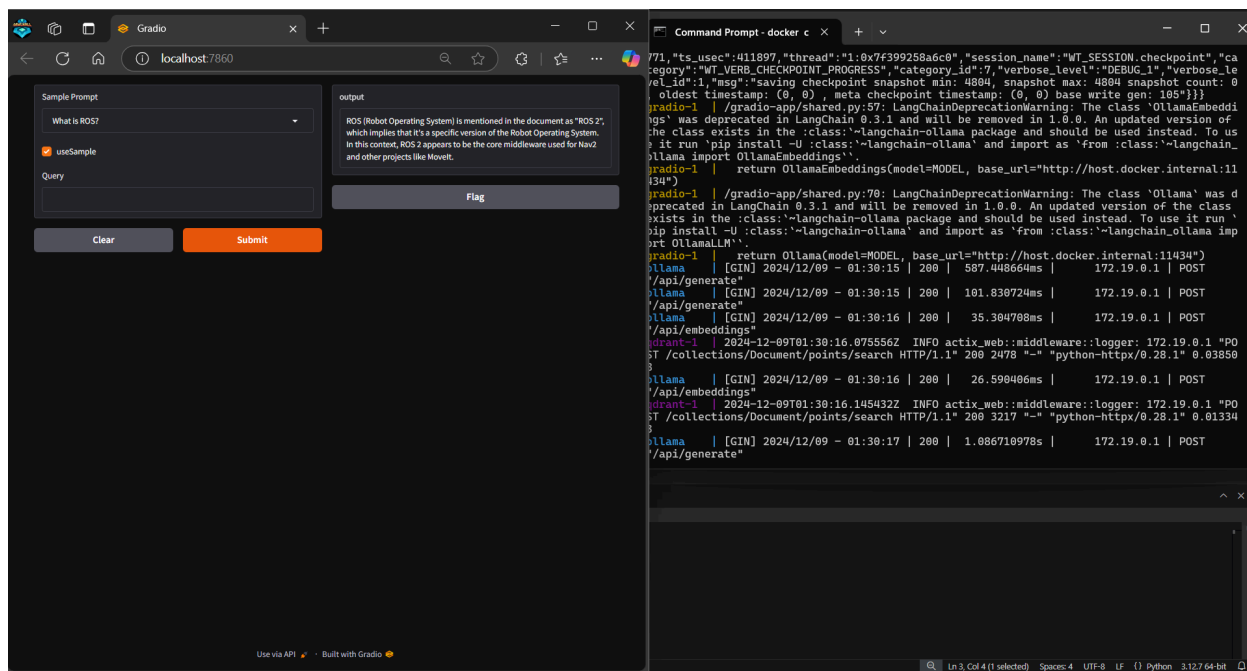
```
# User query
query = "How many companies is Nav2 trusted by worldwide?"
```

The screenshot shows a Jupyter Notebook with the following content:

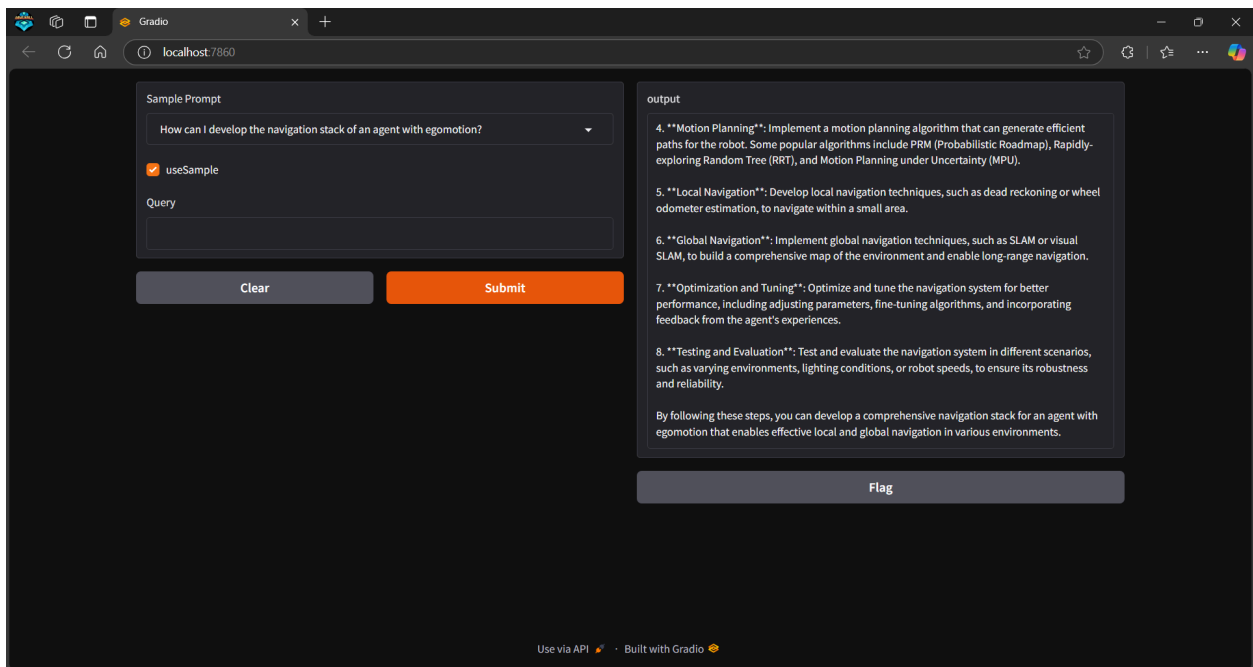
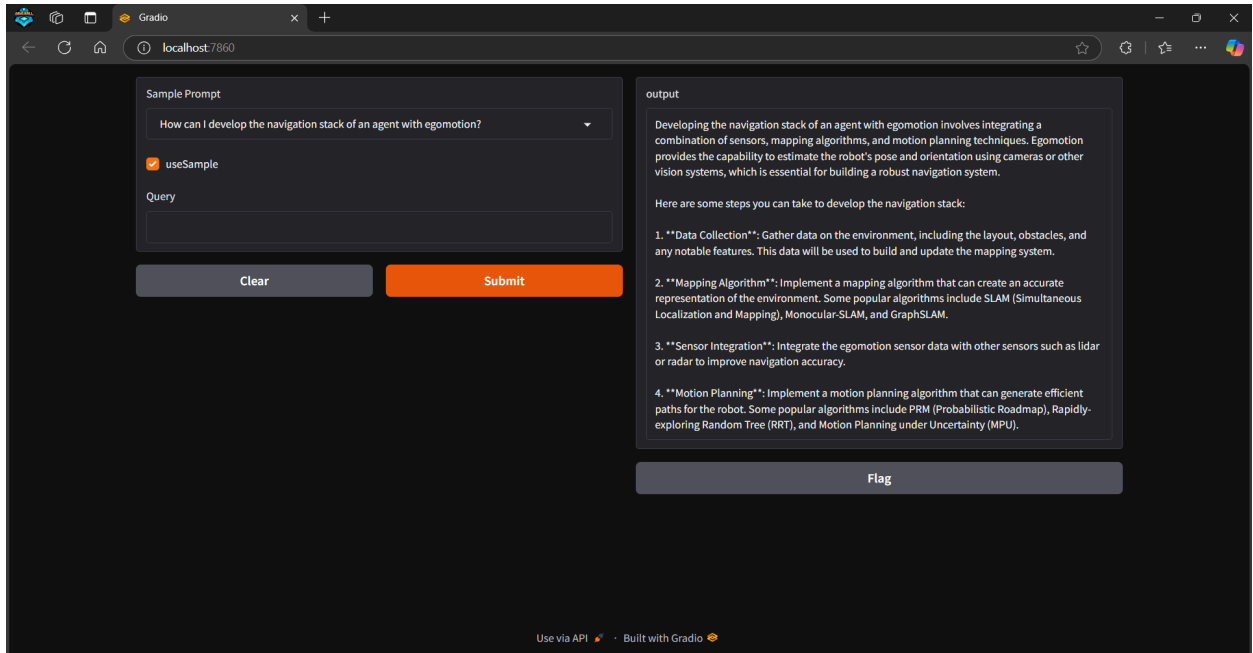
```
Queries: [How can I develop the navigation stack of an agent with egomotion?], [What is ROS?], [How many companies is Nav2 trusted by worldwide?], [How would I build a ROS 2 Navigation Framework and System?], [How can I build a ROS 2 Navigation Framework and System?]
```

The notebook displays the output of the inference pipeline, including a query expansion step, a related collection of documents, and a baseline answer. The query expansion step shows a list of related questions and a top text snippet. The baseline answer is a short paragraph about Nav2.

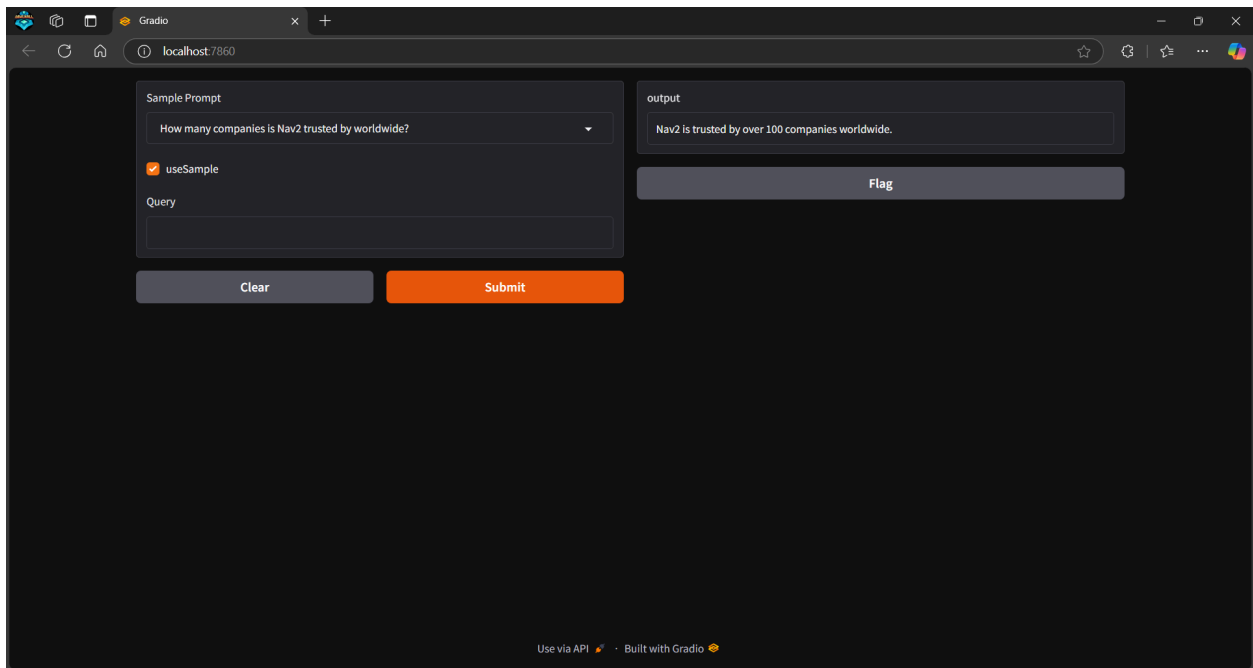
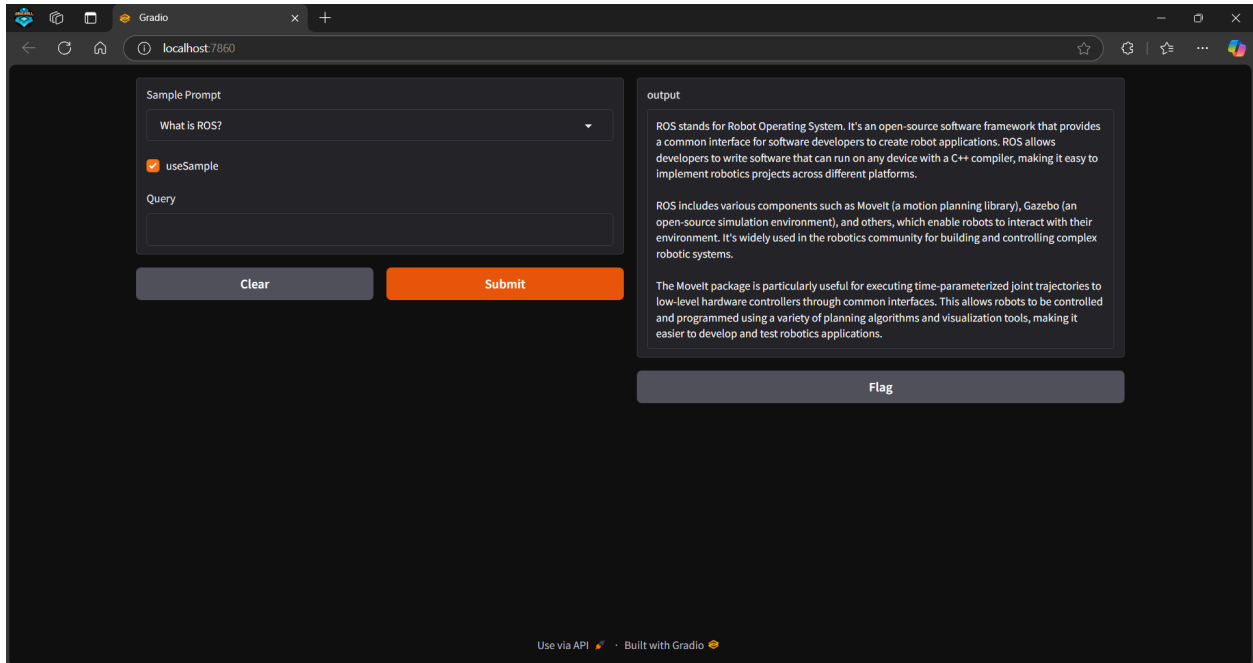
The image below shows the gradio app being run and its response to a sample query. Additionally, you can see that the docker containers from docker compose up responded when the query was submitted. Alternatively, you can launch app.py, or even run the Tools/InferenceTools.ipynb file with a custom query. There are many ways to get an output as long as ollama is being served either by docker or in your terminal.

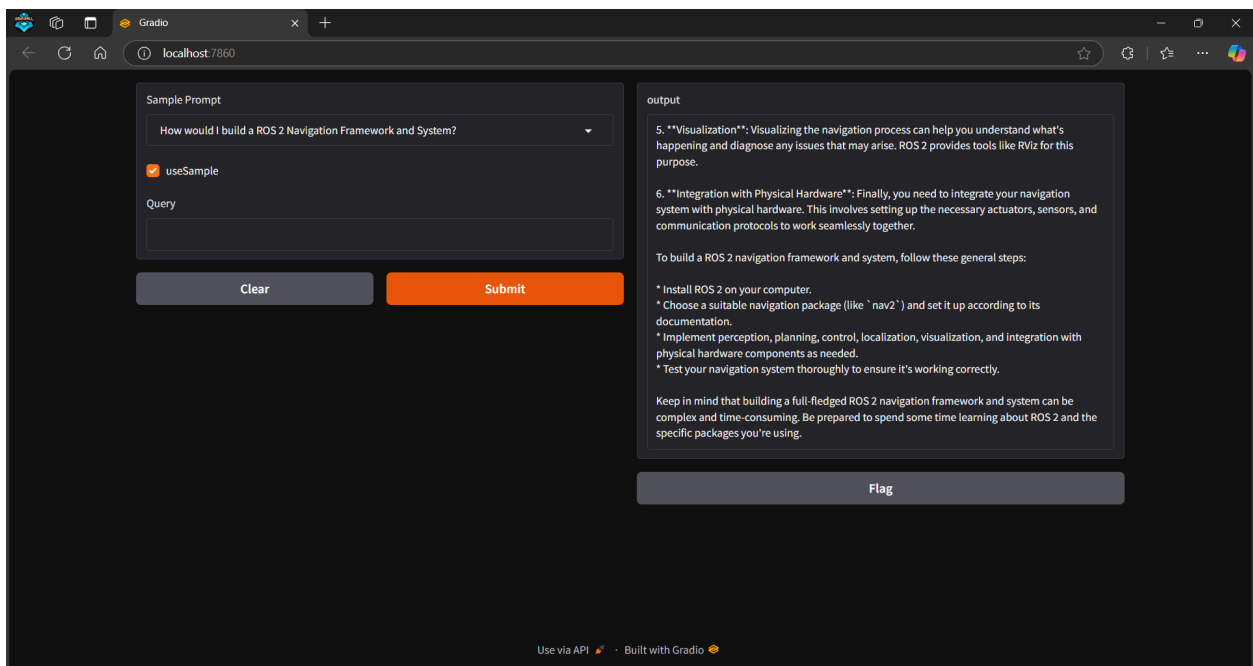
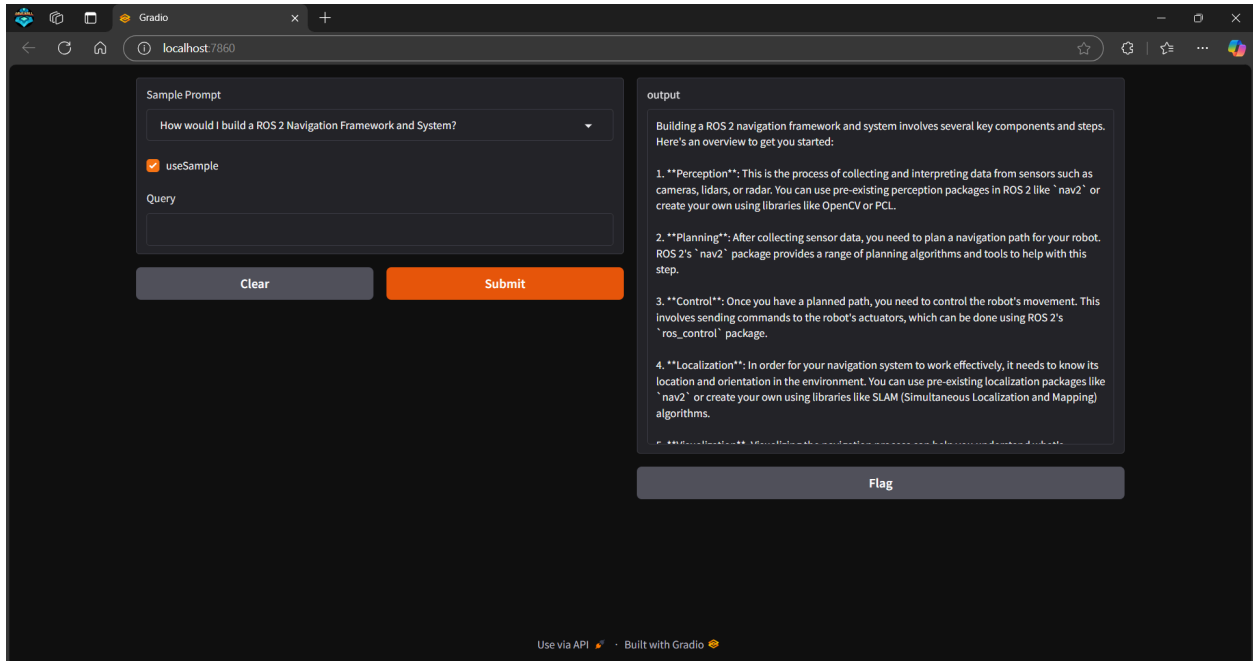


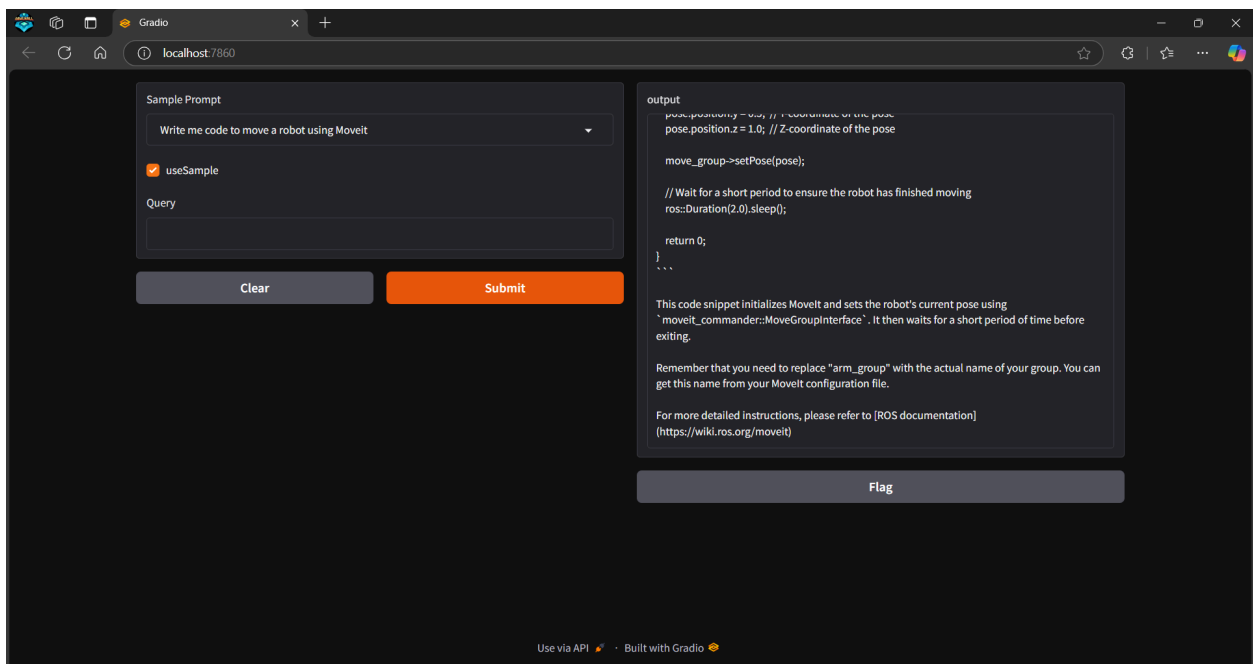
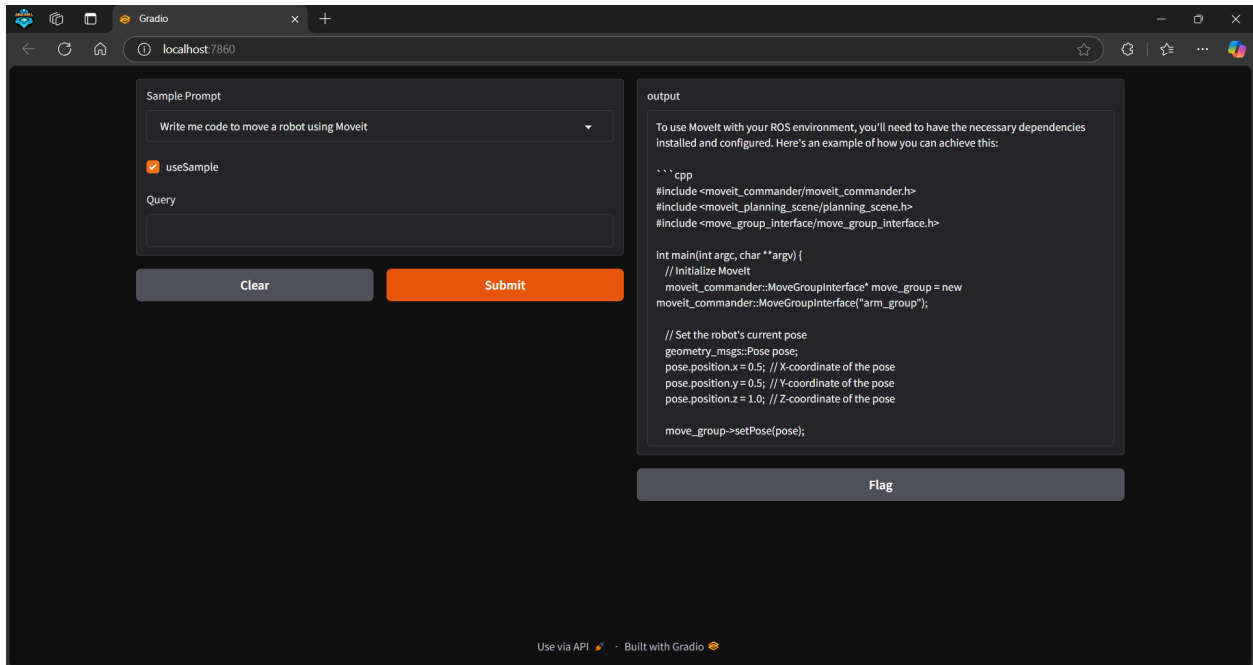
The images below show the model's responses to various queries



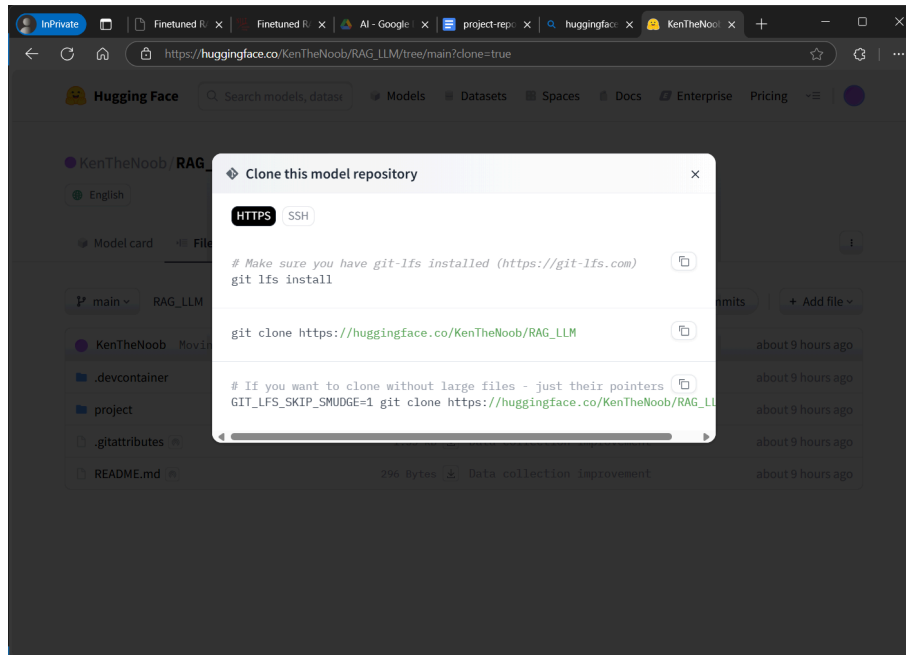








The image below shows the model uploaded and pullable on huggingface



Alternatively, you can pull from my github in the README.md, in which case, you start the devcontainer inside the project folder, not the base folder.