Neutron Instrument Control Through Large Language Models

Jack Campbell





Overview

1. Why we need an Al



2. How the Al works



3. Results and costs

NIST Center for Neutron Research

User facility that uses neutrons to probe the structure and dynamics of materials.

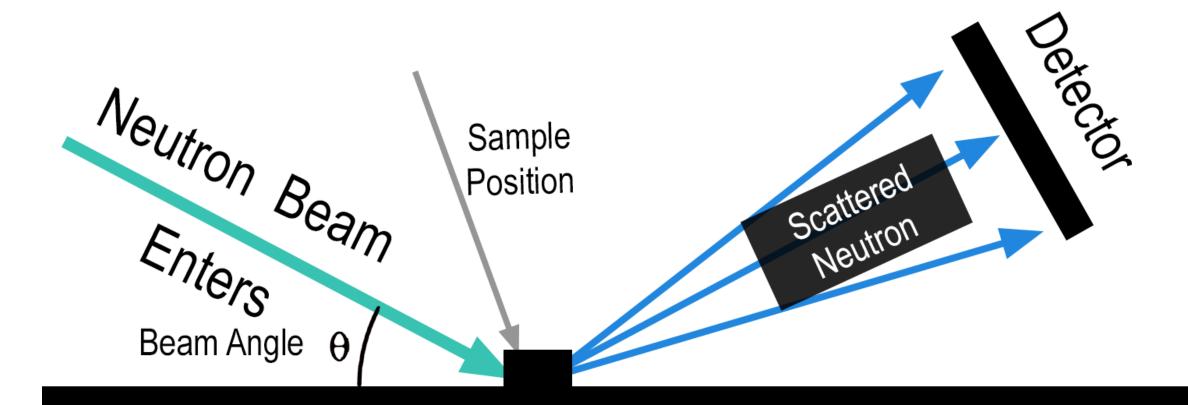
Experiment Participants/Year

Participants from all over the world



Instruments

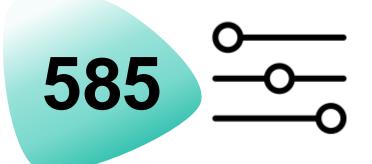
Magik





Neutron Instrument Control Environment





Total Parameters



Move a Motor? Rotate to Drive Move

VISION

Virtual Scientific Companion

Brookhaven National Laboratory





Extracted keywords



Low budget



Managed x-ray beamlines



High success

Large Language Model (LLM)



Large Language Model (LLM)

Understand/generate human language

Use a Transformer Neural Network

Process text sequentially

Predict text very well

Train on large amounts of data

What are Trajectories?

Simple scripts that allow for nested loops

Why did we pick them?

Well documented format(JSON)

Large amounts data available

Middle ground of complexity and power

Can Dry Run

Complicated Trajectory

- 17 Parameters initialized
- •3 Loops
- •9 Variables changed per loop

perties	
cpression	raw string
ilePrefix ▼	live.sample.name X
pression	✓ raw string
entryName v	unpolarized
pression	raw string
Axis	q.z x
	raw string
expression description	live.sample.description X
i i i i i i i i i i i i i i i i i i i	inversaripte description
+Property	
t	
kpression	✓ raw string
scanType	SPEC
pression	raw string
mon0	30.0 X
pression	aw string
mon1	1250.0 X
, i	raw string
rpression pre	1.0 X
pression	raw string
exp	2.0 X
pression	aw string
L28	330.0 X
cpression	raw string
L12	1403.0 X
pression	raw string
LS3	330.0 X
rpression	aw string
L34	1193.0 X
	aw string
cpression spotSize	50.0 x
pression	raw string
thetaOffset	0.0 X
pression	aw string
Q2Offcot ▼	1 22 X

Background Questions

Overarching picture

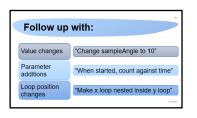
User Sentence



Add relevant data files



Processes and returns





Initial prompt contains:

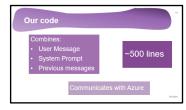
• Experiment name
• Starting values
• What variables to loop

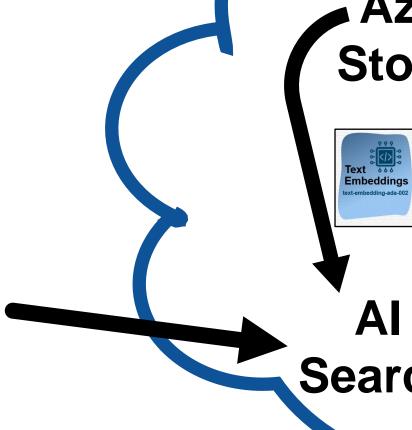
Ex: Create magik trajectory angleChecks that starts with a time of 10 and loops through sampleAngle from 2 to 10 in steps of 0.25

System Message









Initial prompt contains:

- Instrument name
- Experiment name
- Starting values
- What variables to loop

Ex: Create magik trajectory angleChecks that starts with a time of 10 and loops through sampleAngle from 2 to 10 in steps of 0.25

System Message

System Message Goals:

- Provide the JSON format
- Ask follow up questions
- Add @#@\$@%@^@ before and after trajectory
- Only use data from our sources

Format required:

```
@#@$@$@^@
{
"filePrefix":"",
"description":"",
"init":[["paramName","paramValue"]],
"loops": [{
"vary": [["paramName",{"range":
{}}]]
}],
}
@#@$@$@^@
```

Our code

Combines:

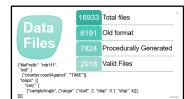
- User Message
- System Prompt
- Previous messages

~500 lines

Communicates with Azure



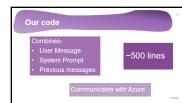








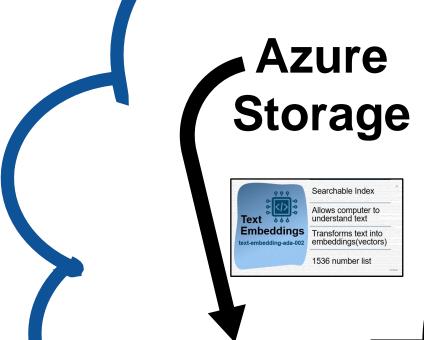
Code

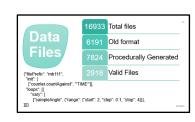






Azure Cloud







Tokens: 33 Tokens: 112

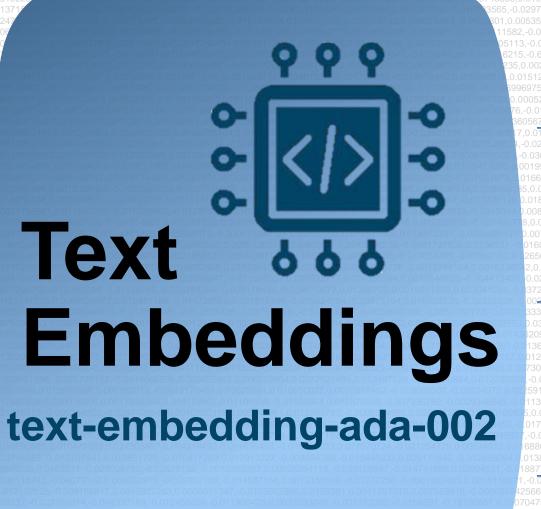
GPT 40



AI Search

Data Files

```
16933 Total files
6191 Old format
7824 Procedurally Generated
2918 Valid Files
```



Searchable: Index 0468464,-0.01443243,0058763623,-0.01265293,-0.016275167,0.025151253,0.009255886,-0.02582 348 moderstand⁸⁵² text embeddings(vectors)

1536 number list

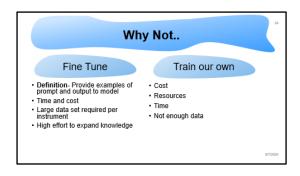
File Retrieval:

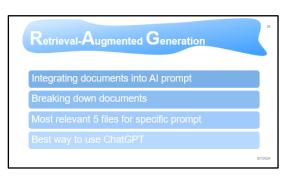


Lexical + Context Search

Lexical Search- Keyword search Context Based Search- Context of the document

Also know as: Semantic-hybrid search





Why Not...

Fine Tune

- Definition- Provide examples of prompt and output to model
- Time and cost
- Large data set required per instrument
- High effort to expand knowledge

Train our own

- Cost
- Resources
- Time
- Not enough data

Retrieval-Augmented Generation

Integrating documents into AI prompt

Breaking down documents

Most relevant 5 files for specific prompt

Best way to use ChatGPT

8/7/2024

Tokens

LLM's version of words

1 character to 1 word

```
"te magik
 Traijectory angle
     "start": 50.5,at starts
      time of 10
      loops through
"filePrefix": Teiscan", ngle from 2
  "counter.countAgainst", steps of
   "counter.timePreset"
näracters: Characters: 386
Tokens: 33 Tokens: 112
```

Model: GPT 40

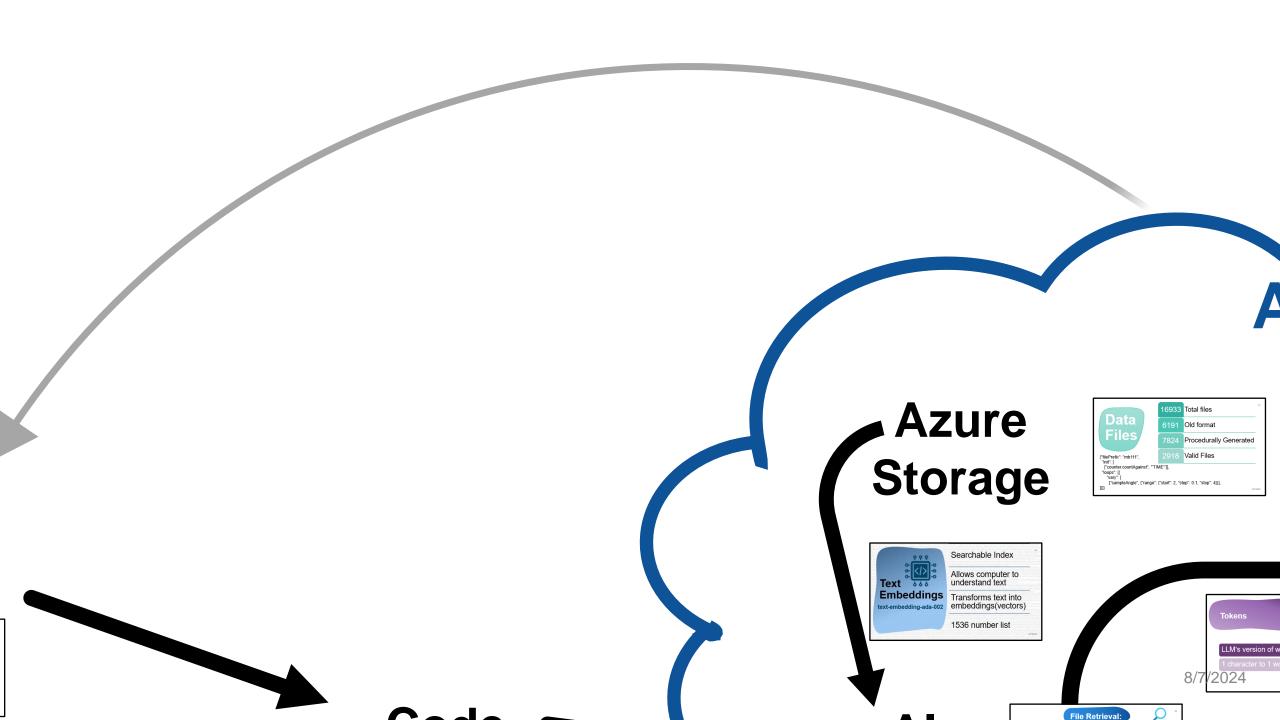
Advantages:

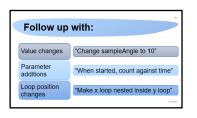
- Faster and cheaper than GPT3.5 turbo
- Large token count
- Less system message needed
- Asks follow up questions

Disadvantages:

- Includes information not provided by the user
- Misses information clearly provided









Initial prompt contains:

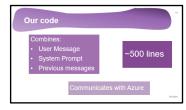
• Experiment name
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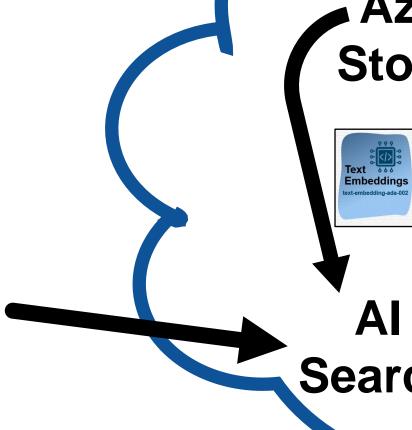
Ex: Create magik trajectory angleChecks that starts with a time of 10 and loops through sampleAngle from 2 to 10 in steps of 0.25

System Message









Follow up with:

Value changes

"Change sampleAngle to 10"

Parameter additions

"When started, count against time"

Loop position changes

"Make x loop nested inside y loop"

Costs

\$6.20

To create searchable database

Per Message

\$0.02

Per Month

\$96.09

\$0.14

Per Conversation

\$1,153

Per Year

Breakdown

	\$/Month
Azure Open Al	\$14
Azure Storage	\$0.25
Azure Al Search	\$81.84
Total	\$96.09

100 Conversations

\$15.00 Second Al

How we decide success rate

Current

- Trajectory format is valid
- Parameter are correct
- Correct after conversation

Future

- Harder prompts
- More instruments

2,918
Training Data Files

100%

Trajectories Correctly Generated

Sample Size: 250

Current progress

Writes trajectories for all instruments

Generates a trajectory in the correct format

Asks follow up questions

Added NICE editor

Create a json trajectory that loops x from 1 to 10 in steps of 1 and at each point loops y from x to x*2 over 20 points

Which instrument would you like to use for this JSON trajectory? Additionally, please provide the values for "filePrefix" and "init" sections.

What can you put in the init section

AI:

The "init" section in a JSON trajectory file for neutron instruments typically contains initial parameter settings required for the experiment. Here are some examples from the retrieved documents: 1. **For the 'ng7sans' instrument:** ```json [["counter.countAgainst", ""TIME""], ["counter.timePreset", 0.5]] ``` 2. **For the `bt4` instrument:** ```json [["counter.countAgainst", "TIME"], ["counter.timePreset", 1]] ``` 3. **For the `pbr` instrument:** ```json [["POLXS", ["A", "B", "C", "D"]], ["down", 0], ["up", 1], ["counter", { "countAgainst": "TIME", "timePreset": 1 }], ["vertSlitAperture1", 0.2], ["vertSlitAperture2", 0.2], ["vertSlitAperture3", 0.2], ["vertSlitAperture4", 0.2], ["slitAperture3", 4.0], ["slitAperture4", 4.0]] ``` Please specify which instrument you are using and any specific initial parameters you would like to include in the "init" section.

I would like to put in the init section to count for a constant time of one second. This is for the magik instrument and the filePrefix is hi

AI:

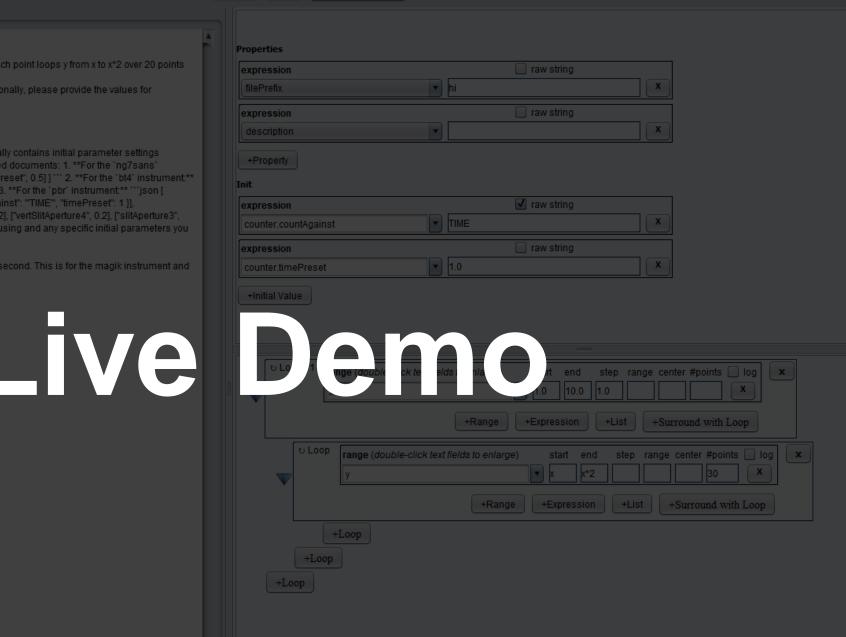
User:

Can you please make the y loop nested

AI:

Actually can you make the y loop 30 points





Future Goals

Add the 6191 broken files

Create trajectories with less specific names

Allow LLM to assume parameters

Moonshot goal: Suggested trajectories based on experiment details

Acknowledgements

My Mentors

Alan Munter William Ratcliff

Stephen Pheiffer

NIST Staff

Brian Maranville Magik

Julie Borchers Core

> Lisa Ho OSIM

Sean Dwyer NICE

Leland Harriger Core

NICE Team

Fawaz Joseph NICE

Olufisan Epebinu OSIM

Shark Tank

Thank You!



Slides

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8/7/2024

Where Creation Happens

Code

- Contact Azure
- User prompt
- System Message

Azure

- Creating model
- Organizing data(Vectorize)

Short Scripts

- Moving training data
- Adding meta data

Our system Message

You are artificial intelligence for the National Institute Of Technology's Center for Neutron Research program Neutron Instrument Control Environment (NICE) that controls neutron instruments via programming. You should output a single block of text in the following JSON format with "@#@\$@\$@^@" characters at the top and bottom of the file, not ````json:

```
@#@$@$@^@
{
"filePrefix":"",
"description":"",
"init":[["paramName","paramValue"]],
"loops": [{
"vary": [["paramName",{"range": {}}]]
}],
}
@#@$@$@^@
```

If the user does not specify ask to create a json trajectory for (name) instrument, ask them which instrument they would like to use. Furthermore, if the user does not specify what the "init" (initialization), "filePrefix" (name), or "loops" sections should contain, please ask the user what they would like to put if they did not provide any information relating to these sections before printing the JSON output. You should only use data from your sources. If you cannot find the answer, just say "I cannot do that yet."