

AI is Boring (So You Don't Have to Be)

Greg Brunkhorst

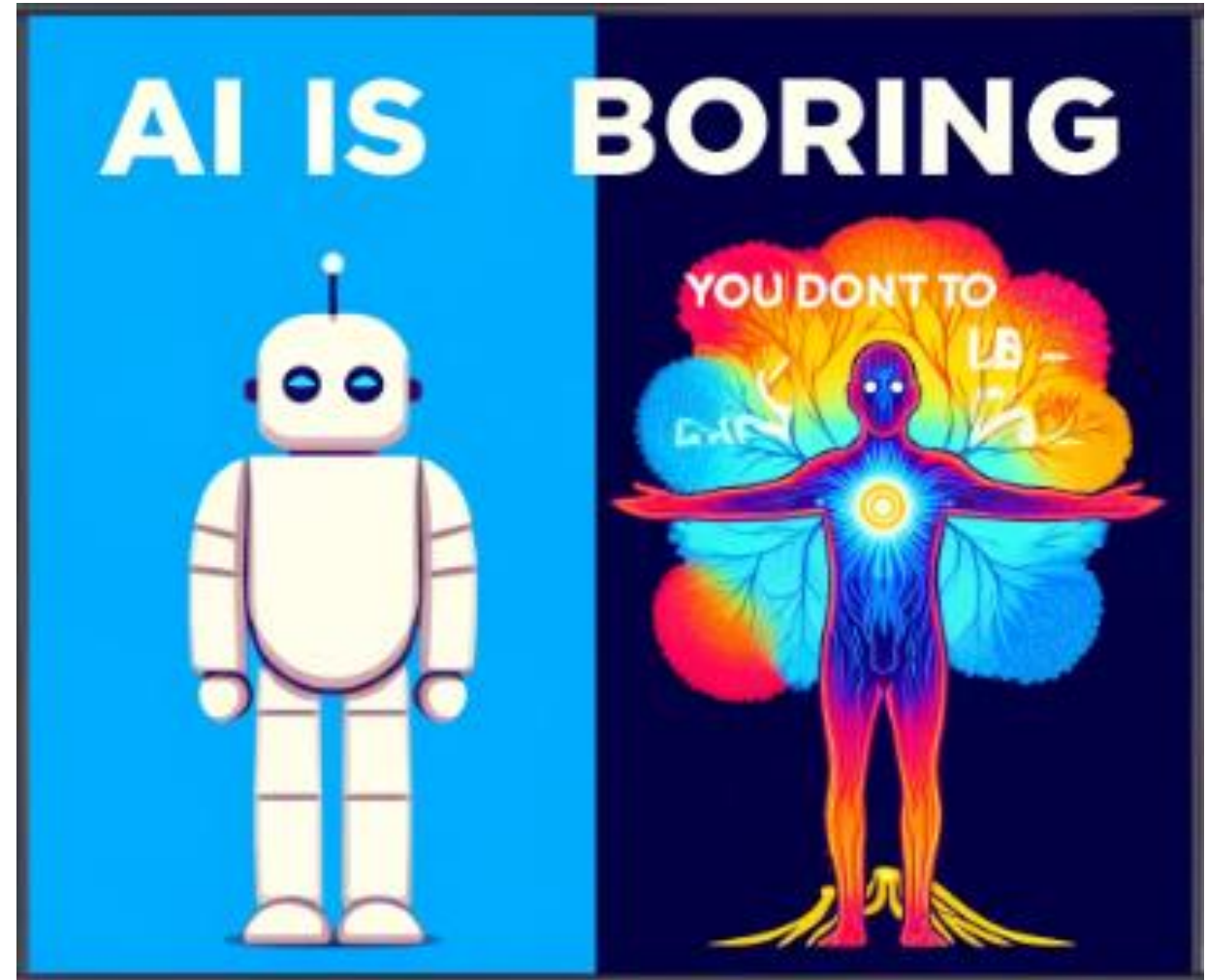
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Tacoma Power

EPRI Resource Planning for Electric Power
Systems

Lunch and Learn

10/29/2024



A little about me

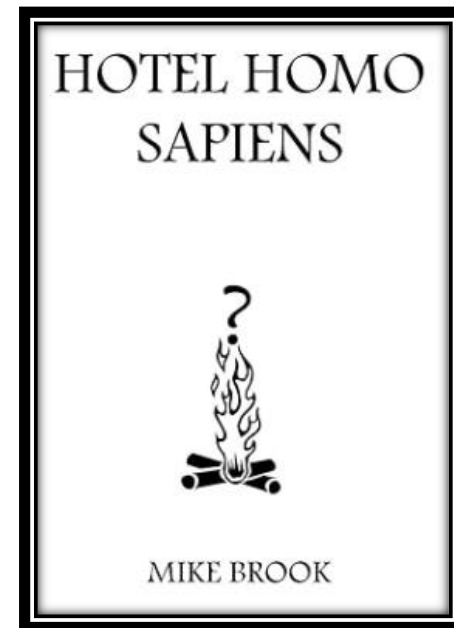
- Integrated Resources Planning Analyst
- Tacoma Power - Washington State

- Open-source/ Python
- Hydropower modeling
- Statistics, machine learning, linear optimization
- Former environmental engineer (15 years)
- Chickens



A little about AI

- I use large language models (LLMs) every day at work
 - Currently I use the Cursor code editor
- LLM hobby projects using the OpenAI API:
 - Application for chatting with characters of a novel
 - Legal writing



Presentation Outline

- Part 1. Background on LLMs
- Part 2. LLMs for a Work-a-day Power Planner
- Part 3. Life-long Learners and Large Language Models

Part 1

Background on LLMs

Large Language Models (LLMs)

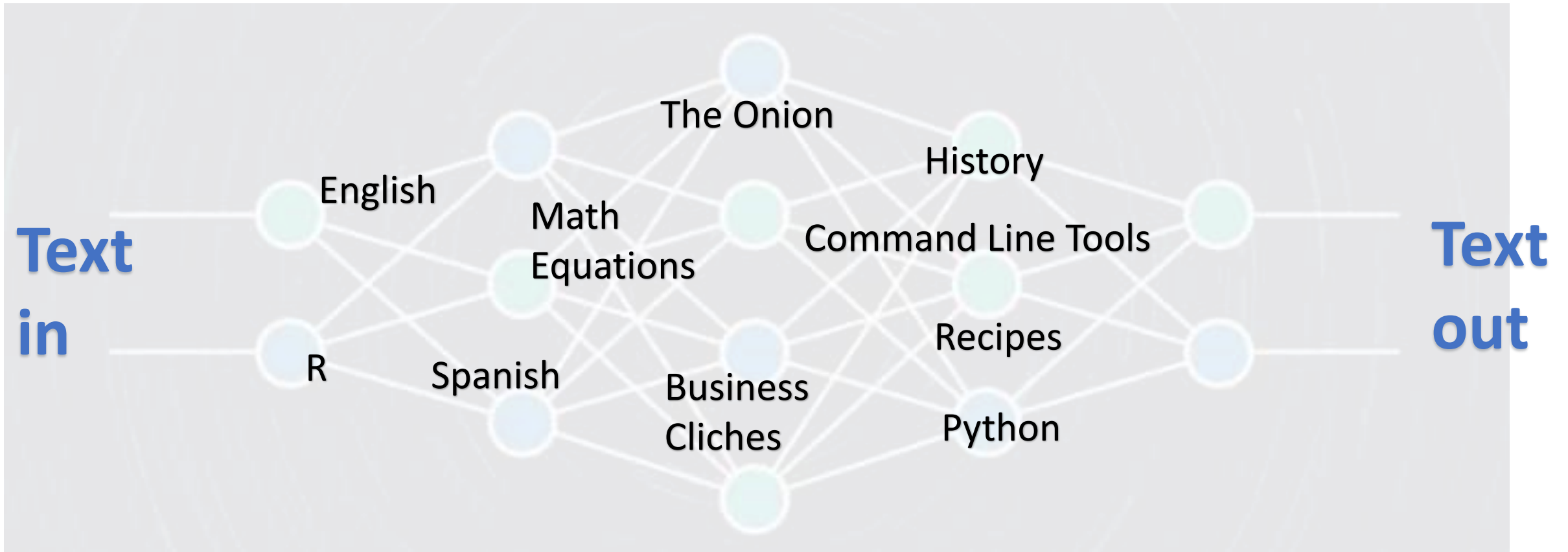
- This talk is about LLMs
- There are other forms of AI
- LLMs are *just* text in and text out
- Recent breakthroughs in LLMs are largely related to *scale*

Text in

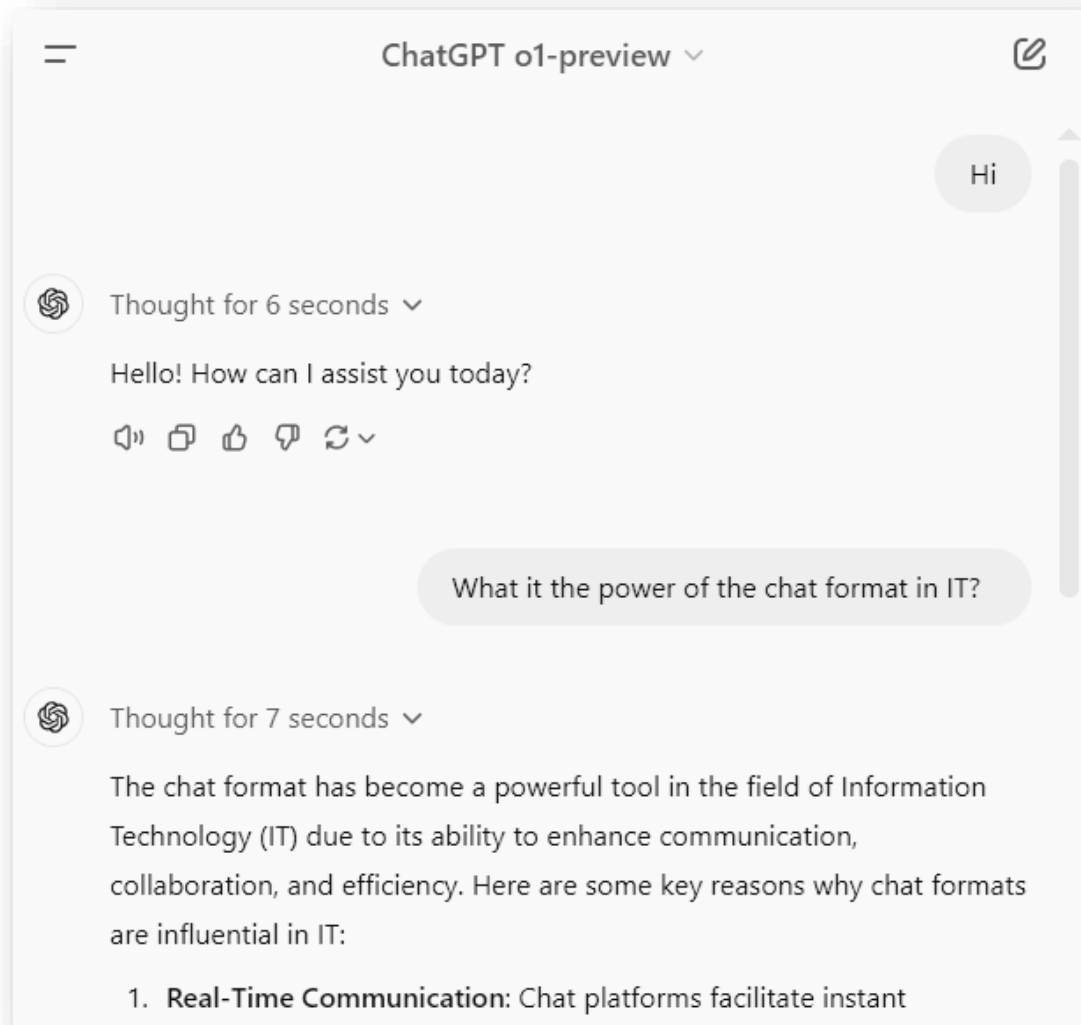


Text out

Somehow these massive multidimensional neural network spaces include detailed representations of a lot of seemingly unrelated things



Interfacing with LLMs - Chat



- The chat interface has become the de facto starting place for experimenting with LLMs
- Everyone in the audience has:
 - Asked for a poem about ISOs
 - Asked for a joke email to my boss
- I'm in and out of chat all day
 - Extracting data from text
 - Coding
 - Background information on concepts in the power industry
 - Brainstorming/ project planning

Interfacing with LLMs - APIs

- Now you have access to the system prompt
- Now you can call the LLM in a for-loop.
- Now you can programmatically route responses:
 - To a database
 - Back to the LLM

```
# Define the system prompt and user input
system_prompt = "You are a power planner from the Pacific Northwest."
user_input = "What are some renewable energy strategies suitable for this
region?"

# Create a chat completion request
completion = openai.ChatCompletion.create(
    model="gpt-3.5-turbo",
    messages=[
        {"role": "system", "content": system_prompt},
        {"role": "user", "content": user_input}
    ]
)

# Print the response from the model
print(completion.choices[0].message['content'])
```


Interfacing with LLMs - Cursor Integrated Developer Environment with AI Integration

The screenshot displays the Cursor IDE interface. On the left is a file explorer for a project named 'TACOPOW'. The main workspace shows a Jupyter notebook '07_cow_stage.ipynb' with the following Python code:

```
plt.plot(df.Flow, df.height, 'o', label='data')
new_x = np.linspace(0, 80000, 100)
plt.plot(new_x, flow2stage(new_x), label='model')
plt.legend()
plt.xlabel('Flow (cfs)')
plt.ylabel('Stage (ft)')
plt.grid()
plt.ylim(0)
```

The code is executed, resulting in a plot of Stage (ft) versus Flow (cfs). The plot shows a blue line with circular markers for 'data' and an orange line for 'model'. The x-axis ranges from 0 to 80,000 cfs, and the y-axis ranges from 0 to 25 ft. The data points and the model line are nearly indistinguishable, indicating a good fit. The plot is titled 'Cowlitz River Flow vs. Stage Relationship'.

Below the plot, the AI chat window is open, showing a conversation:

History + New Chat Attach to Side Panel →

07_cow_stage.ipynb Current File 07_cow_stage.ipynb (1-9) Code

Could you add a title to the chart?

Ask Copy Apply

```
# Plot Flow vs Stage with Title
plt.plot(df.Flow, df.height, 'o', label='data')
new_x = np.linspace(0, 80000, 100)
plt.plot(new_x, flow2stage(new_x), label='model')
plt.legend()
plt.xlabel('Flow (cfs)')
plt.ylabel('Stage (ft)')
plt.title('Cowlitz River Flow vs. Stage Relationship') # Added Title
plt.grid()
plt.ylim(0)
eq
```

I've added a title to your chart by inserting the `plt.title` line. The updated code now includes the title "Cowlitz River Flow vs. Stage Relationship".

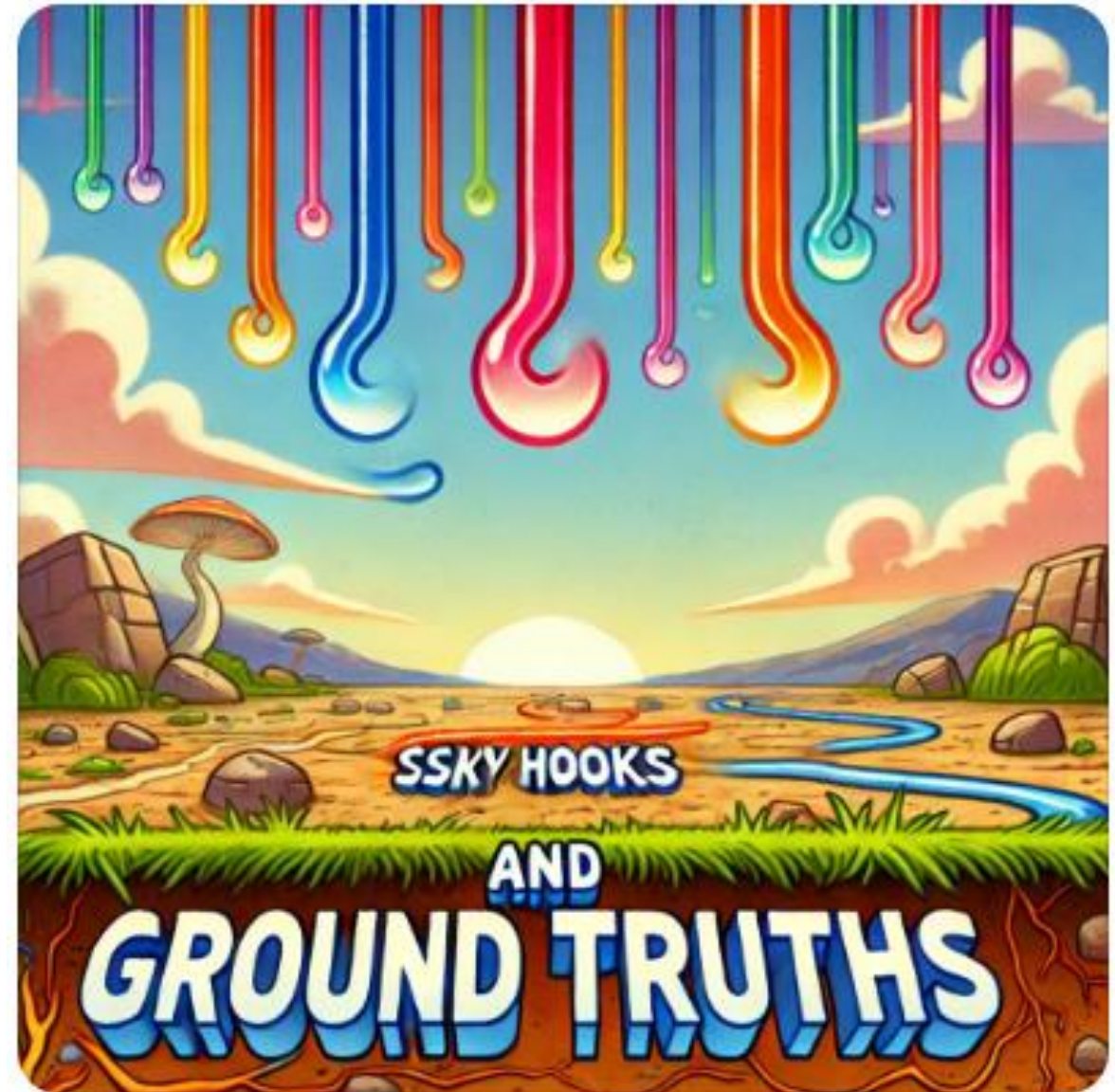
07_cow_stage.ipynb Current File ×

Ask followup (Ctrl+Shift+Y), ↑ to select

o1-mini @Mention alt+no context chat ctrl+codebase

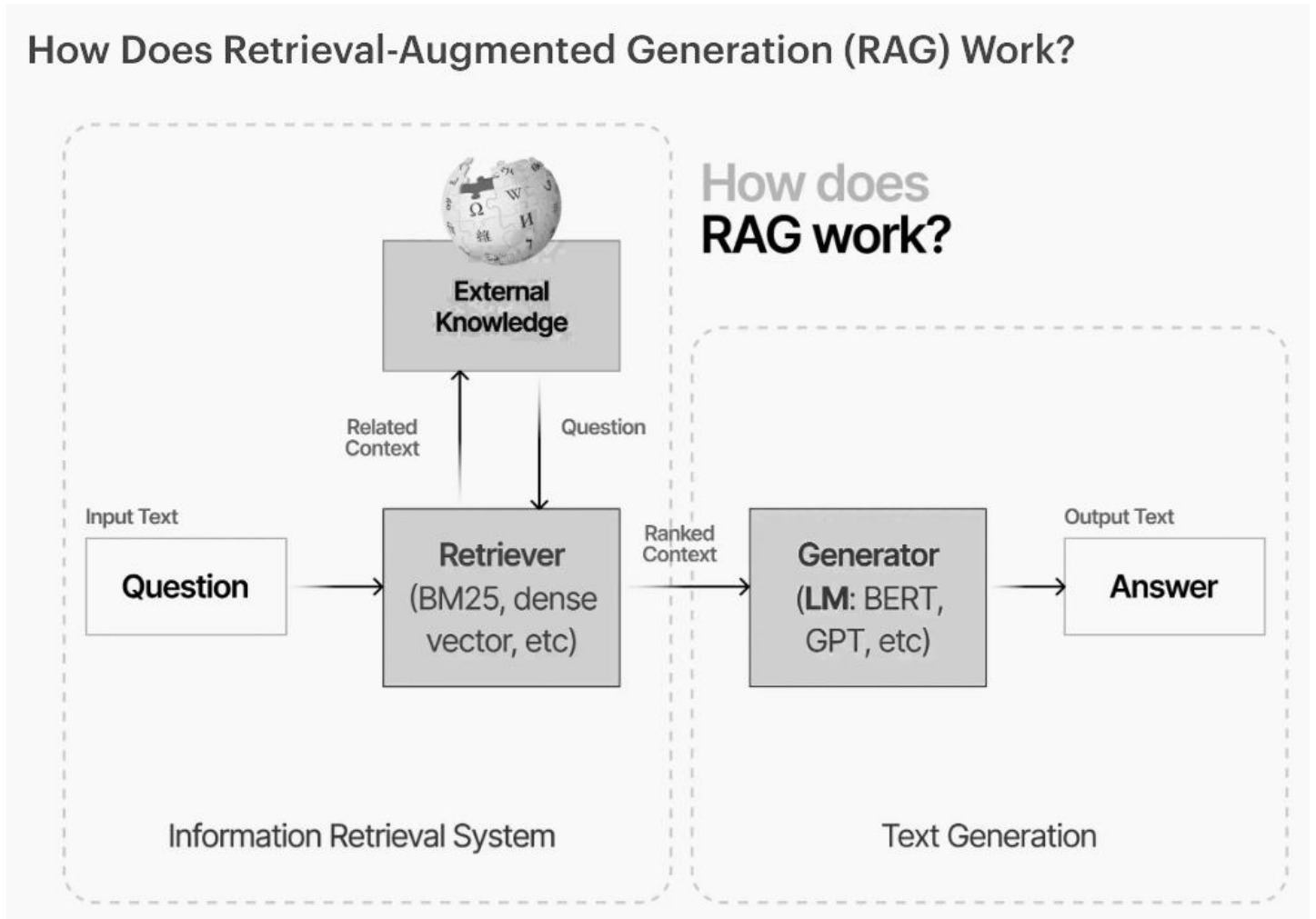
Improving LLM results

- Sky Hooks
 - Feeding the results of the LLM back to itself
 - OpenAI o1 models
 - Checking results. . .
- Ground Truths
 - Retrieval Augmented Generation (RAGs)
 - Combines search and LLM processing



RAGs

- Chat with your documents
- “Close reading”
- Purpose-built industry-specific research tools
- **This is huge.** If I was still an environmental consultant, my energy would be here



Things I am working on in a parallel universe

Prompts that ask a Lot of Clarifying Questions

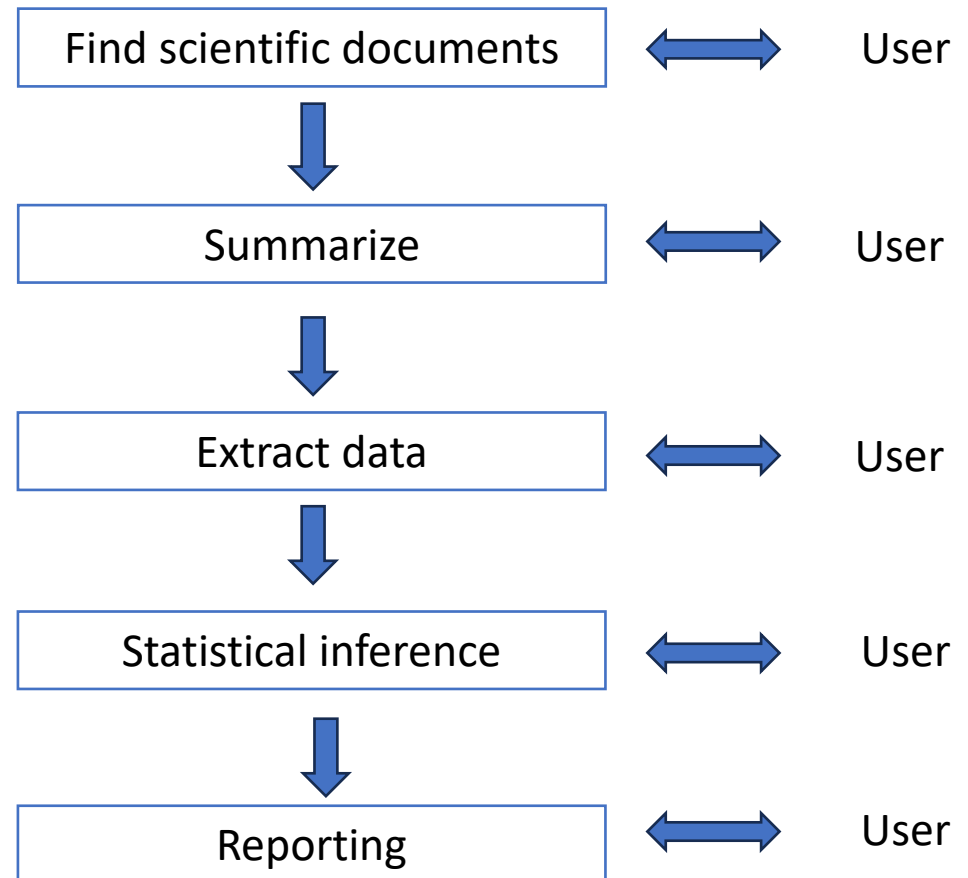
ChatGPT 4o

I'm not sure if I should put examples or conclusions first.

Would your audience benefit more from immediate clarity (conclusions) or from seeing practical applications first (examples)?



LLM – enabled meta-analysis pipeline



Part 2

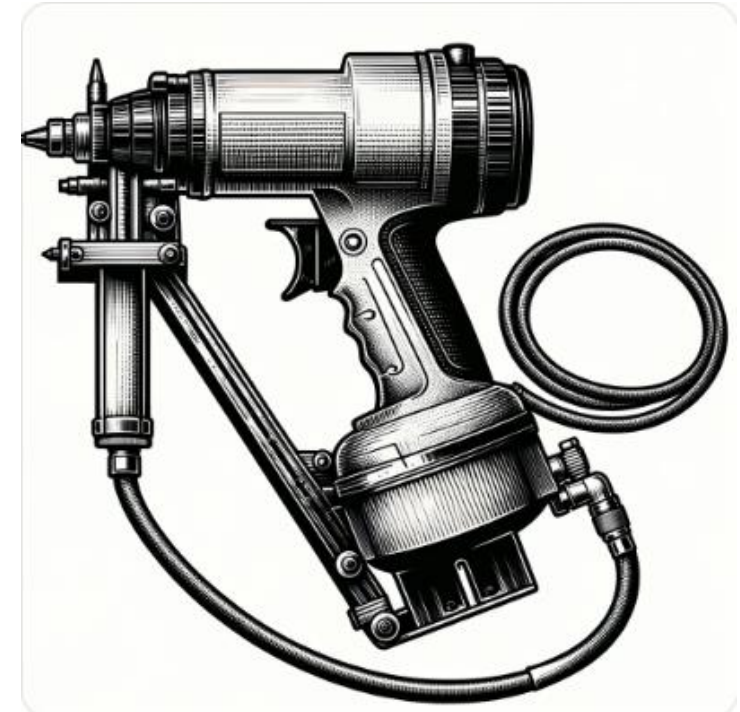
LLMs for a Work-a-Day Power
Planner

Overarching Metaphor

LLMs are a **nail gun** when we used to be **swinging hammers**



- A nail gun, by itself, does not make you a good carpenter
- A nail gun, by itself, does not build a house
- But if you are building a house, do you want a carpenter with a nail gun, or one with a hammer?



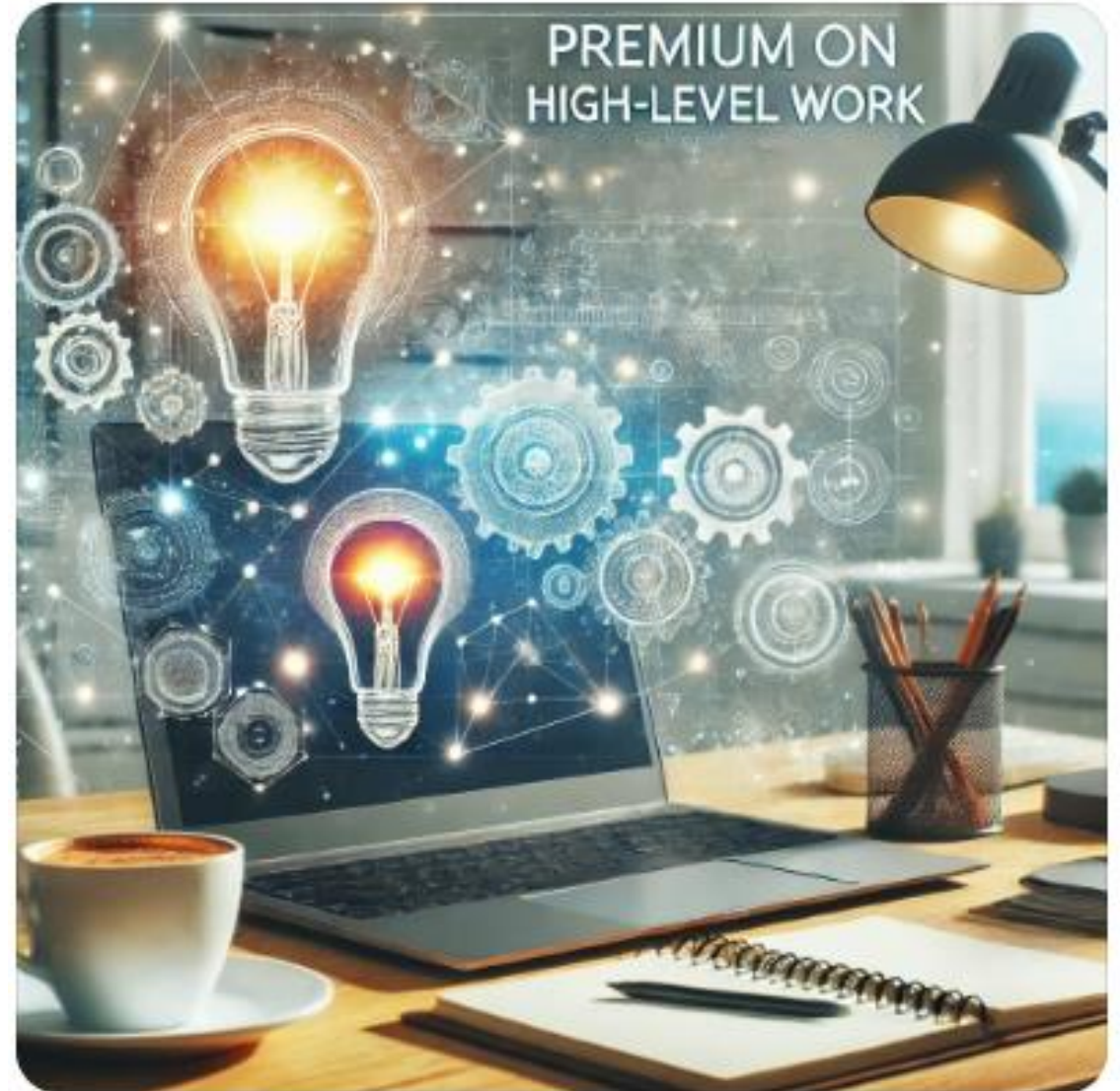
Take Away #1



LLMs put a premium on high level thinking

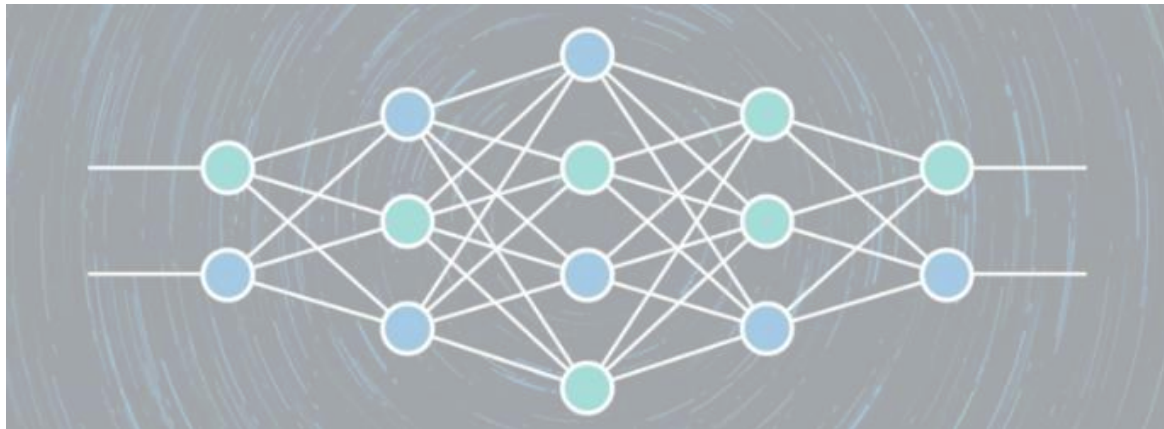
- The architect is important
- Be thoughtful about the overall project goals and structure
- Users need to keep up with the LLM

Now is a good time to engage in meta-work!



What tasks are easier with LLMs?

- Tower of Babel tasks
(translations in all directions)



Translation Example: Plain Language -> Computer Code

In the LLM prompt,
type as much
information as you
can

LLM prompt

I have a **database** with a table with a datetime **column** called "dt" and a **column** of interest called "load." dt is hourly indexed. **I would like** code to get the daily maximum loads for each month for the past 5 years.

Output



Sure, here's an SQL query that will calculate the monthly average load and maximum hourly load for each month over the last 5 years:

```
sql Copy code

SELECT
    DATE_TRUNC('month', dt) AS month,
    AVG(load) AS avg_monthly_load,
    MAX(load) AS max_hourly_load
FROM
    your_table
WHERE
    dt >= DATE_TRUNC('month', CURRENT_DATE) - INTERVAL '5 years'
GROUP BY
    DATE_TRUNC('month', dt)
ORDER BY
    month;
```

*You will probably get an error message when you try to run the code.
Iterate:*

Second Prompt

Feed error messages back,
along with your thoughts.

LLM prompt

Oh, boy, I got an error message:

“ERROR.....”

I think it has to do with the type
of SQL . . .

Second Output



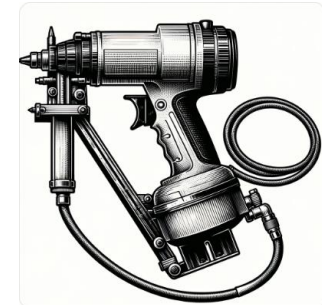
The problem appears to be . . . here is the updated query. . .

```
sql Copy code  
  
SELECT  
  DATE_TRUNC('month', dt) AS month,  
  AVG(load) AS avg_monthly_load,  
  MAX(load) AS max_hourly_load
```

. . .

What just happened

- If you are good at SQL, this saved you some time
- If you are bad at SQL, this saved you a ton of time
- If you can't write SQL at all, you are starting to learn

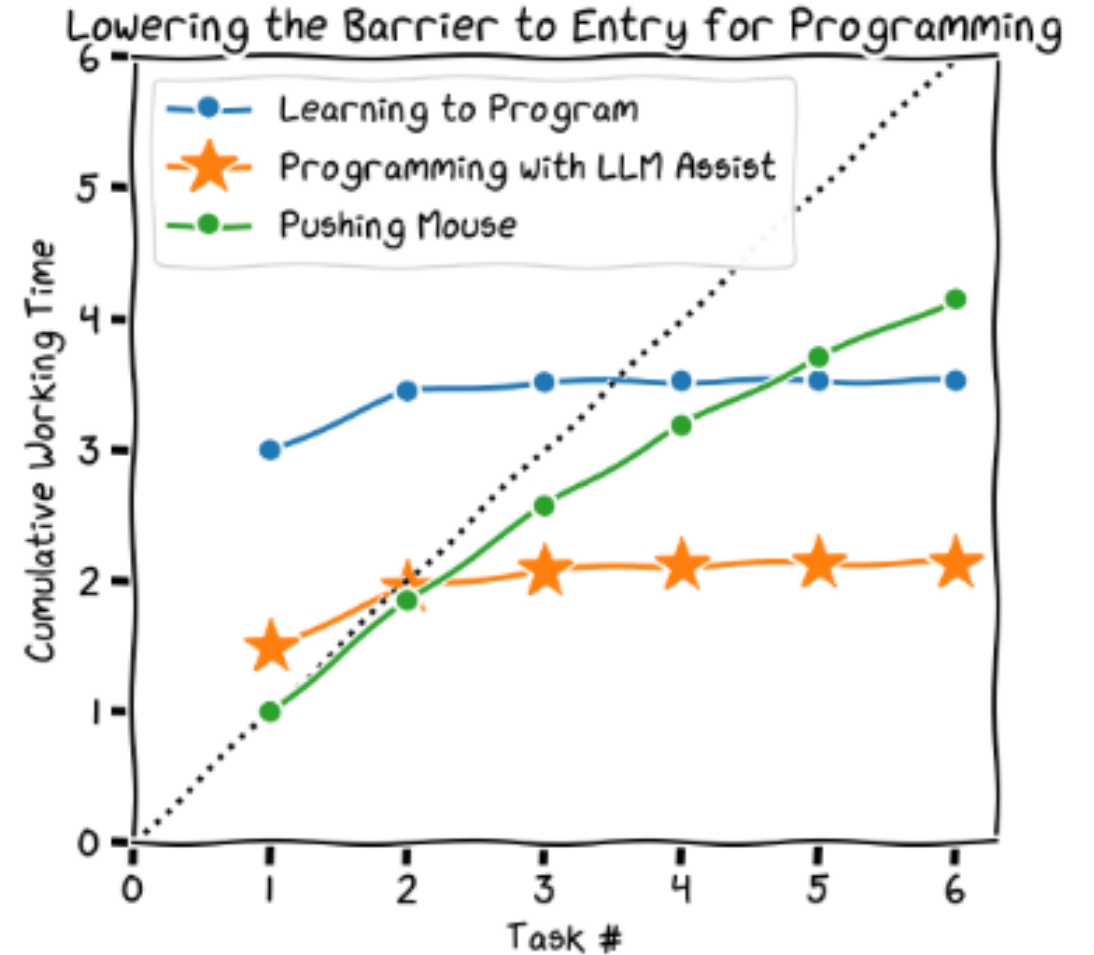


Take Away #2



LLMs lower the barrier to entry for programming.

Plain language ->
programming language
translation is a major event.



Conceptually Simple, Technically Complex

Goal: In modeling and data science work, use best practices from open-source software development

- There are a lot of things that are conceptually simple, but complex to implement
 - Git repository management (version control)
 - Database authorization and configuration
 - Code testing
 - Packaging and software dependency management
 - Documentation
 - Deployment
- **LLMs excel in these type of tasks**



Translation Example: Computer Code -> Plain Language

Paste code into the chat and
start asking questions

LLM prompt

My colleague wrote a query that I need help to understand:

```
it.    query_string_temp_max_min = f""select a.RecordDateID,  
a.ReadingValue, ReadingType  
  
      from Fact_WeatherBankDaily as a  
      inner join DimWeatherBankStationCode as b on a.StationCodeID =  
b.ID  
      inner join DimWeatherBankReadingType as c on a.ReadingTypeID =  
c.ID  
      inner join DimWeatherBankDataType as d on a.DataTypeID = d.ID  
      where a.DataTypeID = 1  
      and (a.ReadingTypeID = 14  
or a.ReadingTypeID = 20)  
      and b.StationCode = 'KSEA'  
      and a.RecordDateID >= {start}  
      and a.RecordDateID <= {end}  
      ""
```


Output



Sure, let's break down the SQL query piece by piece:

1. Main Selection:

```
sql Copy code  
  
select a.RecordDateID, a.ReadingValue, ReadingType
```

- This part of the query specifies that the output should include three columns: ``RecordDateID``, ``ReadingValue``, and ``ReadingType``.



2....

You will probably still not understand some parts and need to ask follow up questions.

Translation Example:

Computer Code -> Computer Code from a Different Language

LLM prompts

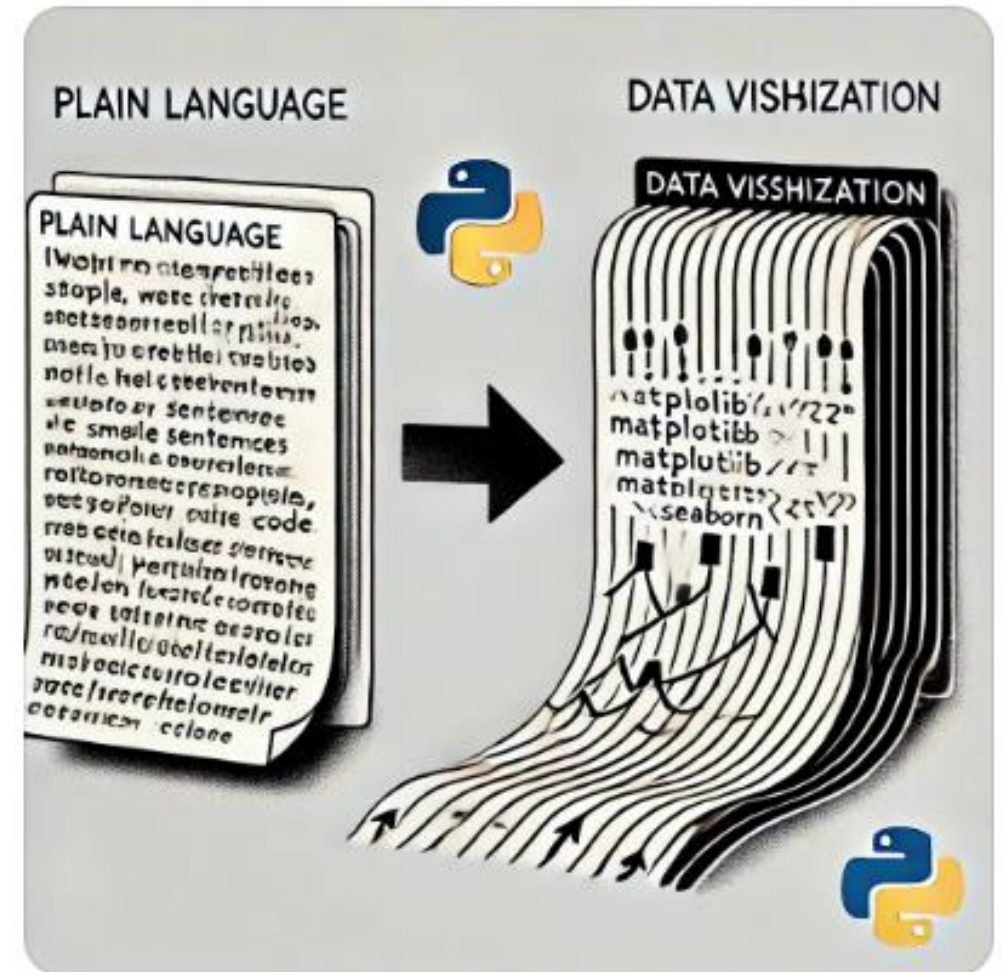
In Excel, I would make a new column that adds column A with column B. How would I do that in Python/ Pandas?

I have this Python code, can you translate it into R?

Translation Example: Plain Language -> Data Visualization Code

Good, insightful and replicable data visualization requires a lot of exploration and a lot of specific jargony computer code.

Let's run through a back-and-forth workflow with an LLM.



Plain Language -> Data Visualization Code

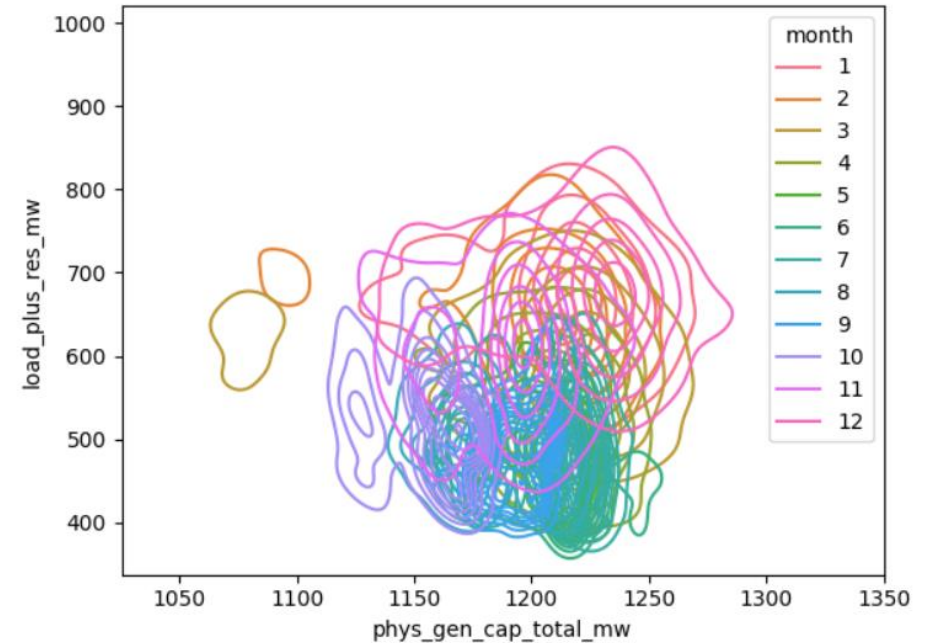
LLM prompt

I have a dataframe with the following columns:
[...] I would like to make a two dimensional
distribution plot with 'column x', on the x and
'column y' on the y and the colors by month. Only
for the year 2035



Certainly!

```
mask = (df.date.dt.year == 2035)
sns.kdeplot(data=df[mask], x='phys_gen_cap_total_mw', y='load_plus_res_mw', hue='month')
```



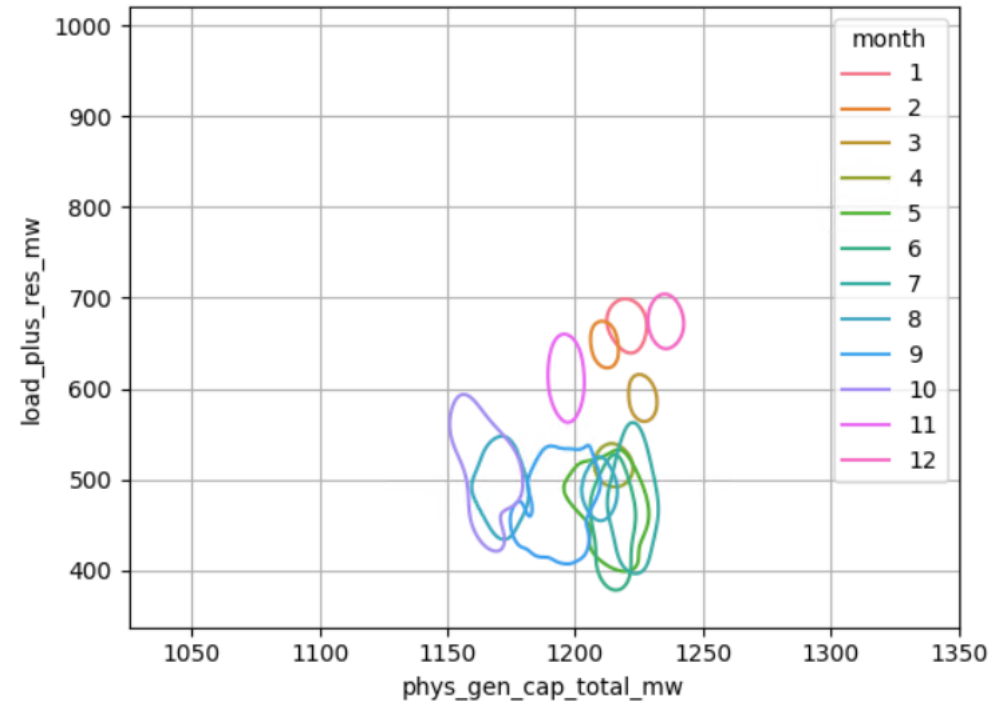
Improve that Visualization

LLM prompt

Whoa, that was a lot of lines. Could you make it just one contour line per month, maybe at the 50th percentile and add some grid lines?



```
mask = (df.date.dt.year == 2035)
sns.kdeplot(data=df[mask], x='phys_gen_cap_total_mw', y='load_plus_res_mw', hue='month', fill=False, thresh=0.5, levels=1)
plt.grid()
```



Improve that Visualization

LLM prompt

That is still hard to read, could we just put black numbers in the centroid for each month without the distribution plot with the same x and y axes?

Make sure to put the axis limits at + and - 5% from the min and max values, and label the axis and title the figure. And wrap the whole thing in a function.



```
def cycle_plot_simple(monthly, ax=None):
    # Define the color lookup dictionary
    if not ax:
        fig, ax = plt.subplots(figsize=(8, 6))

    # Set the limits for x and y axes
    ax.set_xlim(monthly.phys_gen_cap_total_mw.min() * 0.95,
                monthly.phys_gen_cap_total_mw.max() * 1.05)
    ax.set_ylim(monthly.load_plus_res_mw.min() * 0.95,
                monthly.load_plus_res_mw.max() * 1.05)

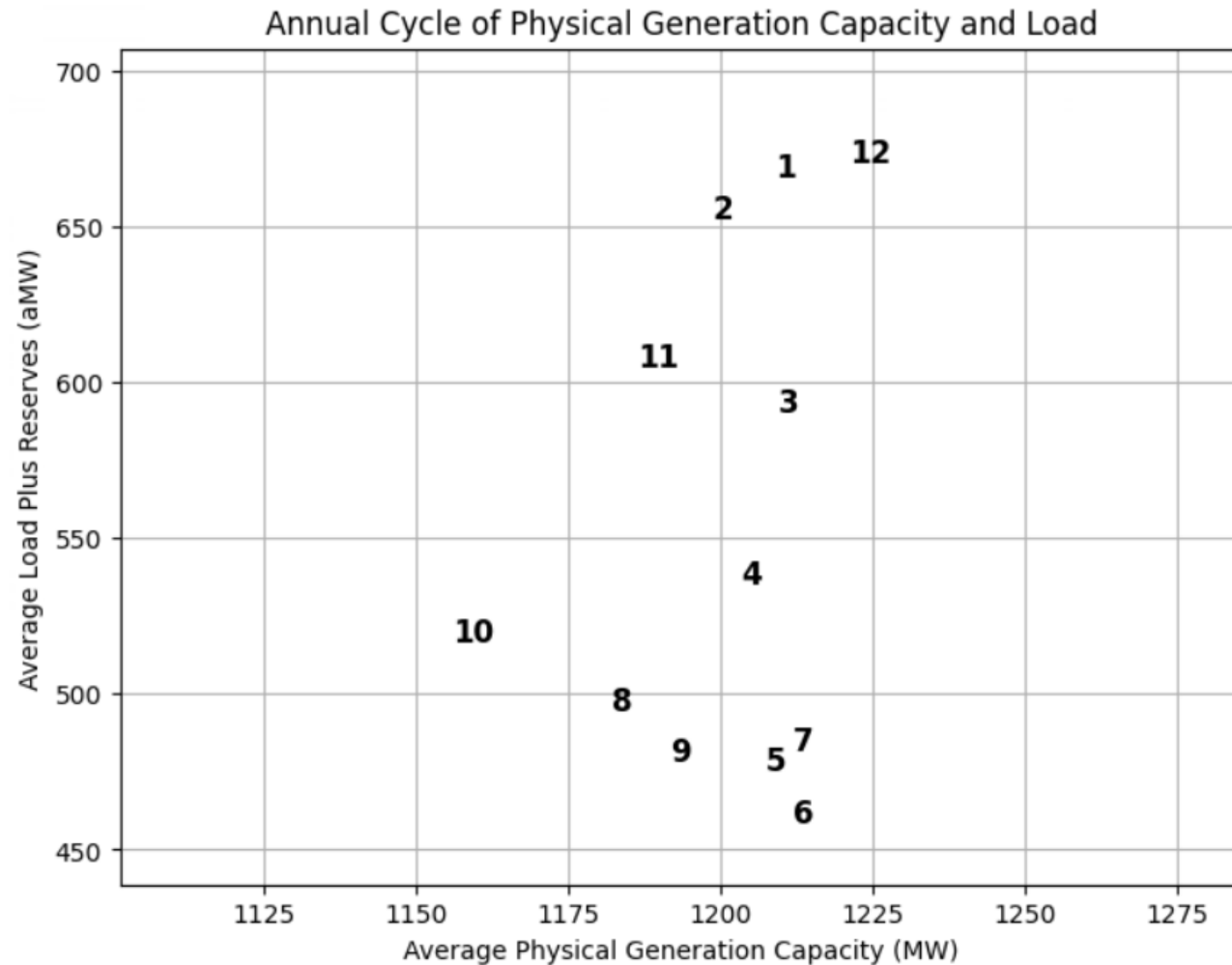
    # Plot numbers on the scatter plot
    for month in monthly.index:
        ax.text(monthly.at[month, 'phys_gen_cap_total_mw'],
                monthly.at[month, 'load_plus_res_mw'],
                str(month),
                ha='center', va='center', color='black',
                fontsize=12, fontweight='bold')

    # Add labels and title
    ax.set_xlabel('Average Physical Generation Capacity (MW)')
    ax.set_ylabel('Average Load Plus Reserves (aMW)')
    ax.set_title('Annual Cycle of Physical Generation Capacity and Load')

    plt.grid()
    return ax
```



Improve that Visualization



Improve that Visualization

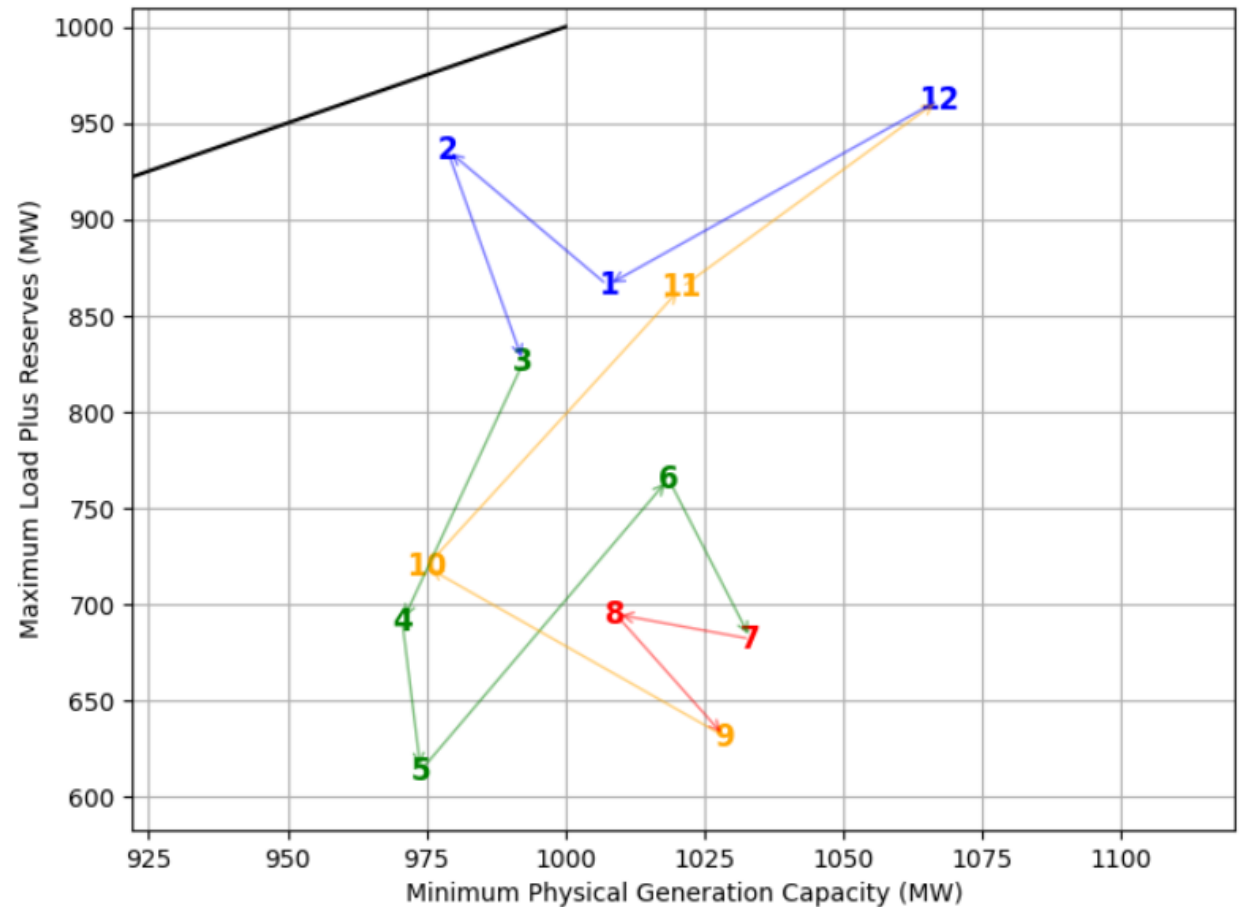
LLM prompt

This is cool but still really hard to see. I need arrows between the month numbers on the graph and I also need the months numbers colored by season with winter blue, spring green, summer red, and fall orange. Oh, and I also need a one to one line on the plot to see when load might exceed capacity



Lots of Code

Annual Cycle of Physical Generation Capacity and Load
Maximums and Minimums Across Simulations
Run 01 Year 2035



Bonus Slide: Principles of Visual Display

1. Show Comparisons.
2. Provide Insight.
3. Present Multiple Dimensions/
Multivariate Data.
4. Integrate Evidence. Words,
numbers, images, and diagrams
should be fully integrated within
a single presentation.
5. Provide Documentation.
6. Content matters most of all.



Take Away #3



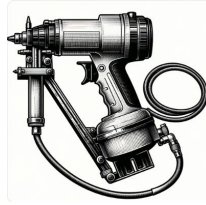
LLMs are making it much easier to switch programming languages.

“Are you an R shop, a Python shop, a Julia shop, a bunch of Excel hacks?”

“Yes”



Take Away #4



LLMs make it easier to write in difficult programming languages.

“I.T. will only let us use Visual Basic. . . ”

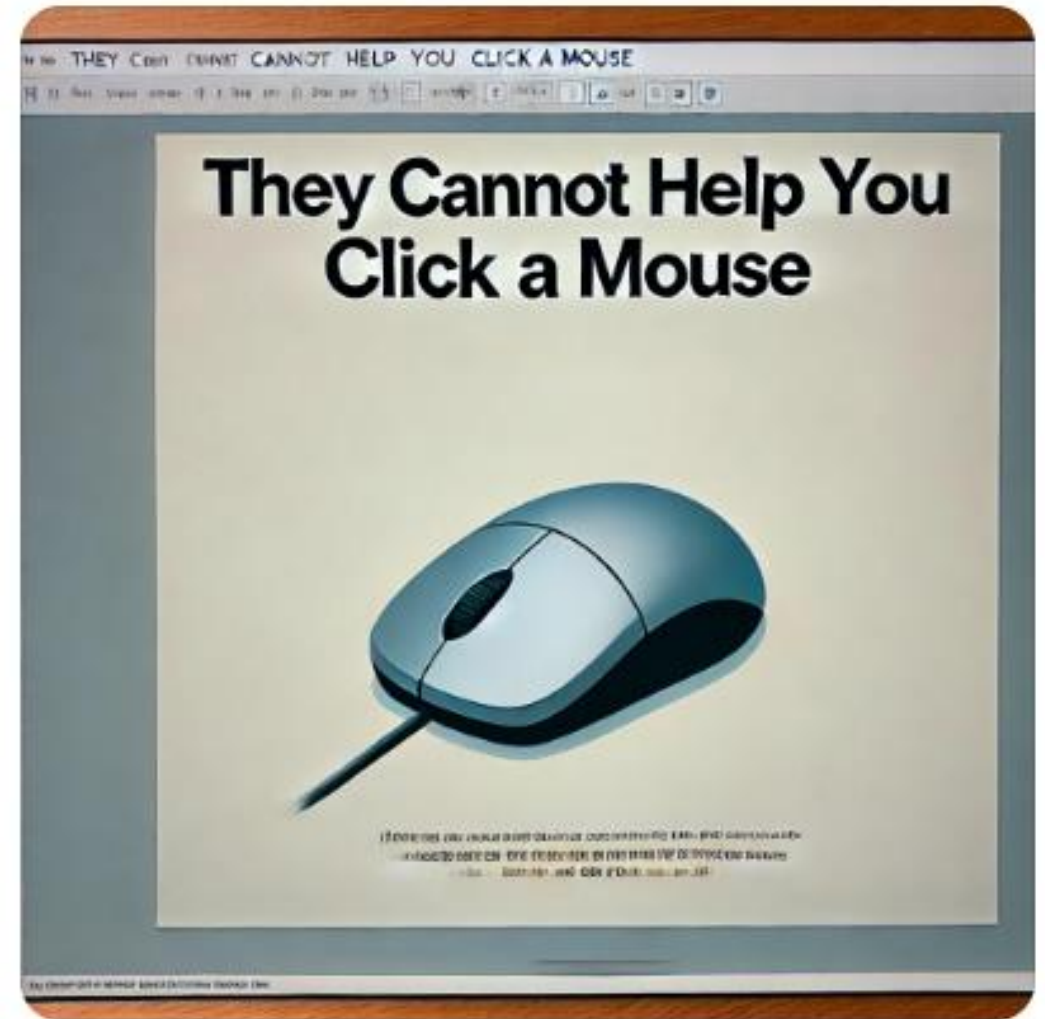
“No problem”

```
Sub SuperComplicatedCalculation()  
    Dim i As Integer  
    Dim j As Integer  
    Dim result As Integer  
  
    ' Outer loop - it's wild!  
    For i = 1 To 10  
        ' Inner loop - it's getting crazy!  
        For j = 1 To 5  
            ' Random multiplication for maximum confusion  
            result = result + (i * j * 42 / 7) Mod 9  
        Next j  
    Next i  
  
    ' We finally print the result  
    MsgBox "The super complicated result is: " & result, vb
```

Take Away #5




LLMs are *language* models.



How Can LLMs Help the Mousers?

- ??? I don't know ???
- Lower barrier to entry for programming?
- Wait around for power-charged LLM-augmented graphical programs to improve?



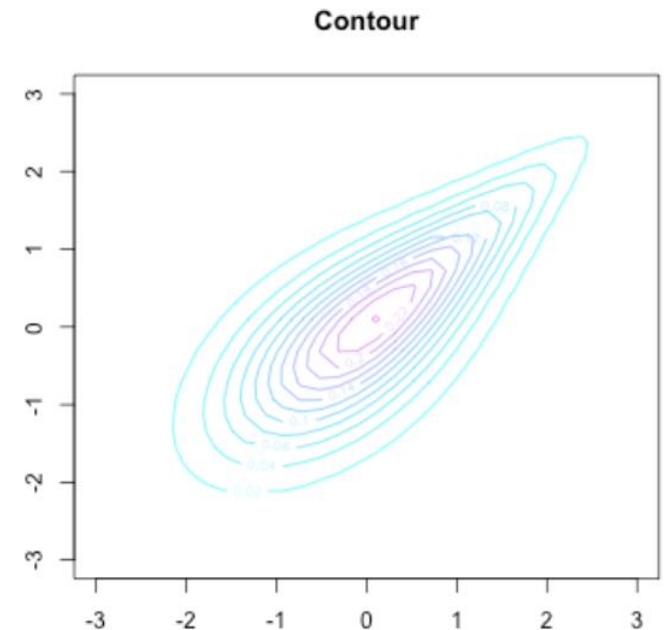
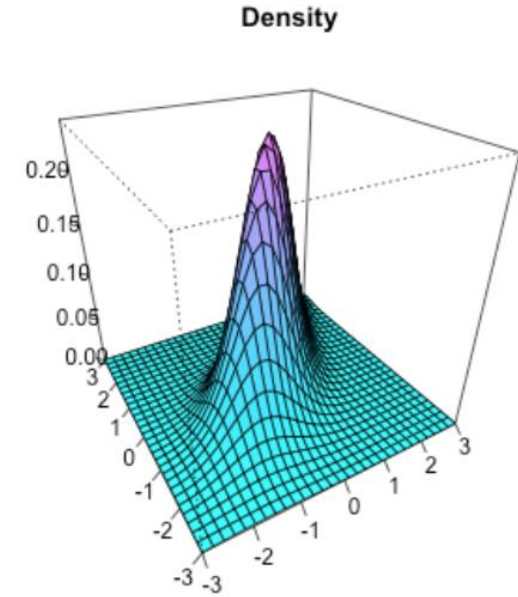


Part 3. LLLs and LLMs

Life-long Learners and Large Language Models

LLMs as an Aid to Learning

- Example: what the heck is a copula?
 - Ask AI to: write out the mathematical form
 - Make that into a Python function to play with
 - Generate example data
 - Visualize that example data
 - Repeat



LLMs as an Aid to Learning

Current Sub-Projects

- Python design patterns
- Hydropower management
- Machine learning
- Linear optimization
- Reinforcement learning
- Climate projections
- Production cost modeling



LLM Fails and Successes

Fails

- Thinking the LLM is better than it is – especially a precise understanding context
- Debugging failure loops
 - Especially if I don't have the background knowledge
- Canned, banal, vapid and verbose writing style

Successes

- General coding, especially common applications
- Organizing information and creating outlines
- Summarizing



Humanist Perspective on Artificial Intelligence

AI is about. . .

- AI is about helping people and organizations
- AI is about automating the boring stuff
- AI is about doing the things you want to do

*AI is putting a premium on **human communication and human intelligence***

AI is NOT about. . .

- AI is NOT about selling stuff
- AI is NOT about spamming and scamming people
- AI is NOT about replacing humans

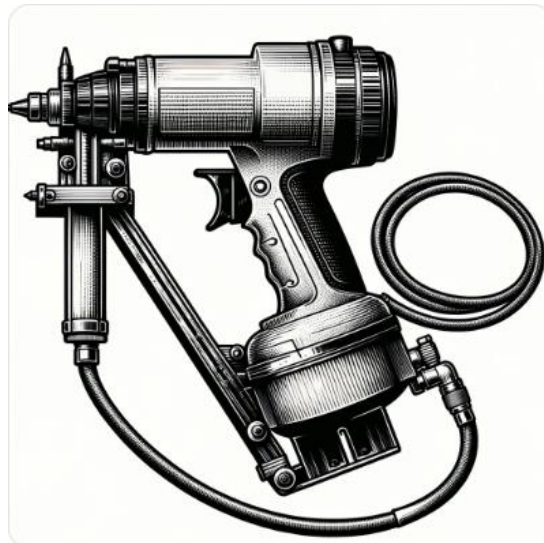


Call to Action

Be the architect



Keep your nail gun handy



Don't be bored

