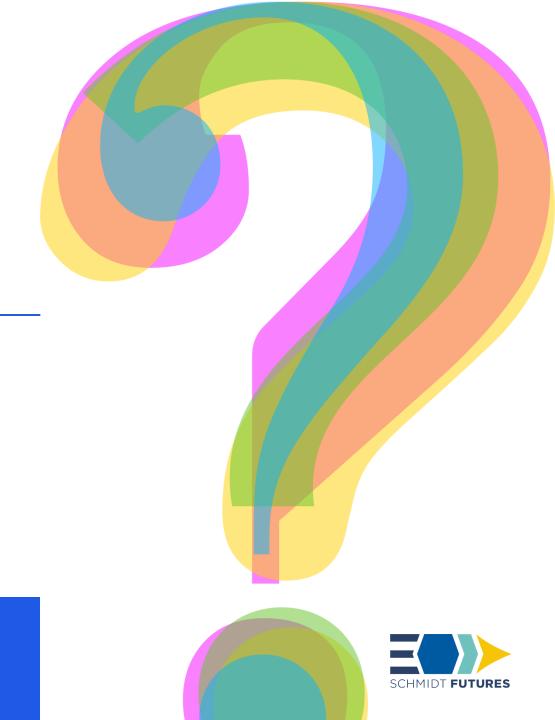
Retrieval Augmented Generation (RAG)

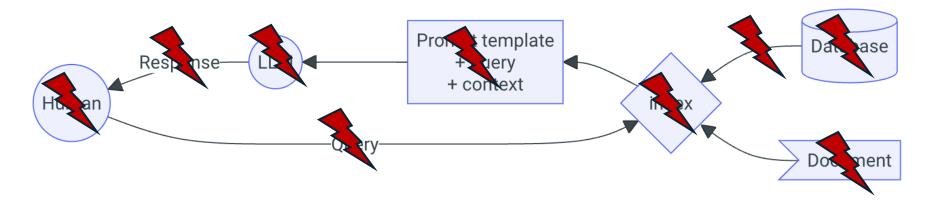




RAG

60% of the time, it works every time.

- RAG is by far the most popular application of LLMs
- Entire ecosystems like LangChain and LlamaIndex are built around it







RAG

- There are probably hundreds of tutorials online that will get you up and running with a trivial RAG applications in a few lines of code
- The reality is...

...RAG is HARD!







Start being Pydantic...

Suppose I have the following task:

Analyse a text description...

"My name is Ryan, and I am 35 years old. During the weekends I like to hike, but I also enjoy playing video games. It can sometimes be difficult to use my computer, because my cat likes to sleep on the keyboard! Unfortunately, there aren't too many mountains in the UK, and I miss the outdoors back home in NZ. During the week, I work as a MLE at the University of Cambridge."

...and extract some important information

```
description = "My name is Ryan, and I am 35 years old. During the weekends I like to hike, but I also enjoy playing video games. It can
  sometimes be difficult to use my computer, because my cat likes to sleep on the keyboard! Unfortunately, there aren't too many mountains
  in the UK, and I miss the outdoors back home in NZ. During the week, I work as a MLE at the University of Cambridge."
✓ 0.0s
                                                                                                                                       Python
  gpt4o = ChatOpenAI(
      temperature = 0.0,
      model = "gpt-40")
✓ 0.0s
                                                                                                                                       Python
                                                                                                                        prompt_template = f"""
  The Assistant's main role is to analyse a piece of text and extract the correct information.
  Here are your instructions
```

Python

```
Read the text below and extract the following information:
      - Name
      Age
      Nationality
      - Occupation
      - A list of any pets
      - A list of any hobbies
  If any acronyms are used, please expand them.
  New Description:\n{description}
  1111111
✓ 0.0s
```

Start being Pydantic...

Great, so this is easy to do, but this is the output from GPT-4o:

```
gpt4o_out = gpt4o.invoke(prompt_template)
   print(gpt4o_out.content)
 √ 1.6s
- Name: Ryan
- Age: 35 years old
- Nationality: New Zealander (NZ)
- Occupation: Machine Learning Engineer (MLE) at the University of Cambridge
- A list of any pets: Cat
- A list of any hobbies: Hiking, playing video games
   type(gpt4o_out.content)
 ✓ 0.0s
str
```





```
new_input_prompt = """
   Here is a new input text:
   {description}
   """.format(description=get_description('description_1.txt'))
 √ 0.0s
                                                                                                                                                                           Python
   chain = prompt | gpt35 | parser
 ✓ 0.0s
                                                                                                                                                                           Python
   new_person = chain.invoke({"input": new_input_prompt,
    +
                            "format_output_instructions": parser.get_format_instructions()})
 √ 1.6s
                                                                                                                                                                           Python
   print(new_person)
 ✓ 0.0s
                                                                                                                                                                           Python
Name: Ryan
Age: 35
Nationality: New Zealander
Occupation: Machine Learning Engineer
Pets: cat
Hobbies: hiking, playing video games
   print(type(new_person.age))
   print(type(new_person.hobbies))
 ✓ 0.0s
                                                                                                                                                                           Python
<class 'int'>
<class 'list'>
```