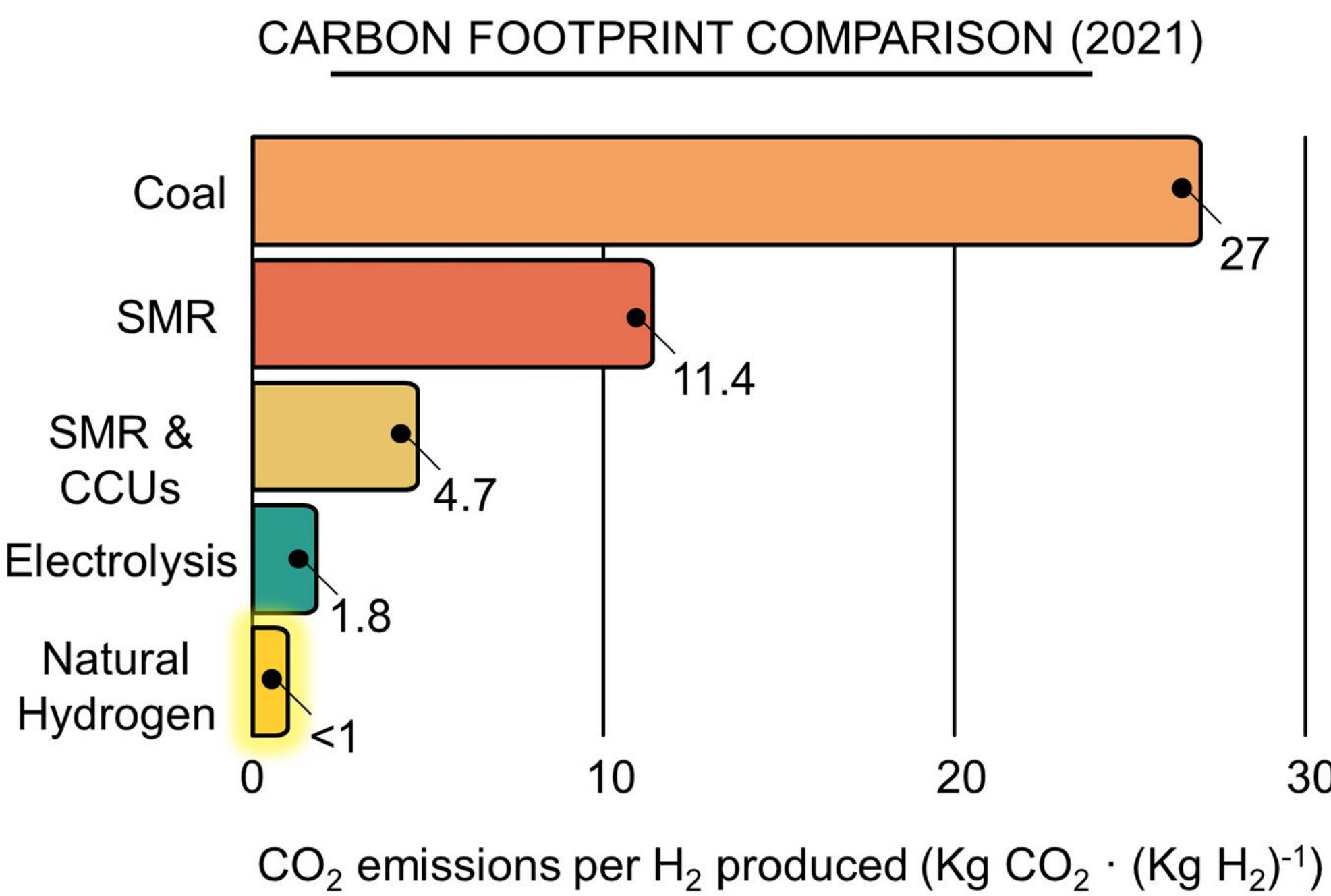
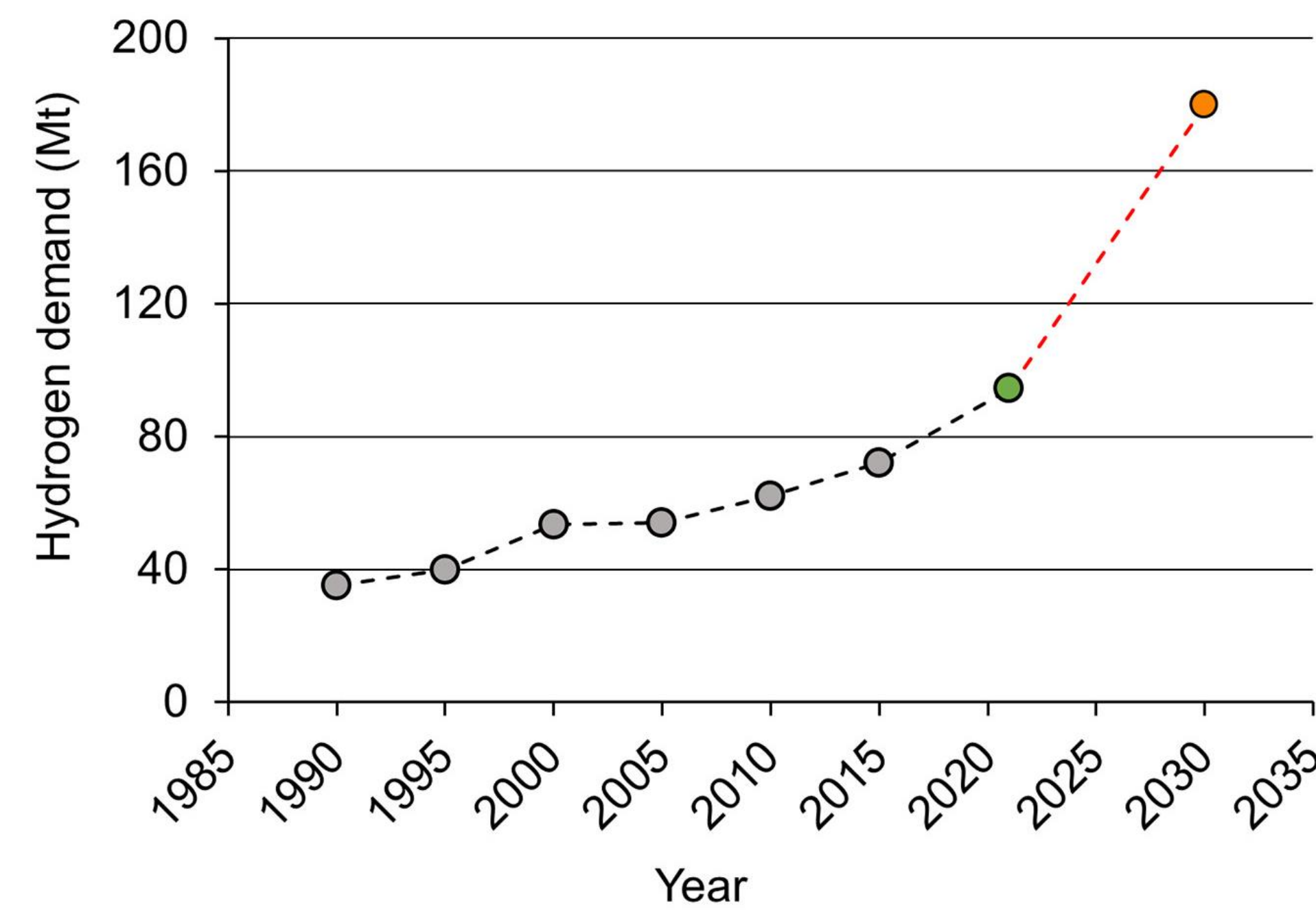


# Developing a geologic hydrogen resources assessment approach using AI-assisted literature review and geo-data driven assessment tool

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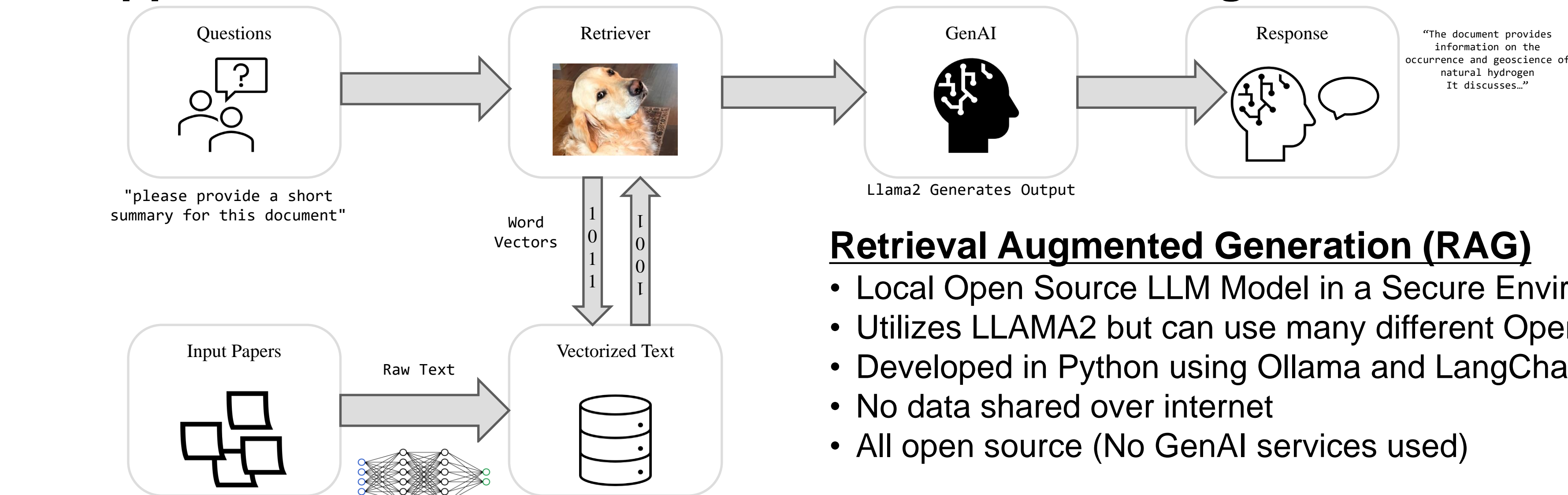
## Introduction



## Goal

- Develop insights on potential natural hydrogen generation knowledge gaps
- Identification of potential hydrogen resources in US
- Domestic and regional assessment of potential hydrogen resources (preliminary development of workflow/tool and evaluation of technically recoverable resources)
- Evaluating hydrogen system as a natural analog for natural hydrogen storage
- Coupled processes related with hydrogen production (CO<sub>2</sub> storage/critical mineral exploration)
- Develop a new research portfolio for future in-house and collaborative research.

## Approach: Literature Review with Machine Learning



### Retrieval Augmented Generation (RAG)

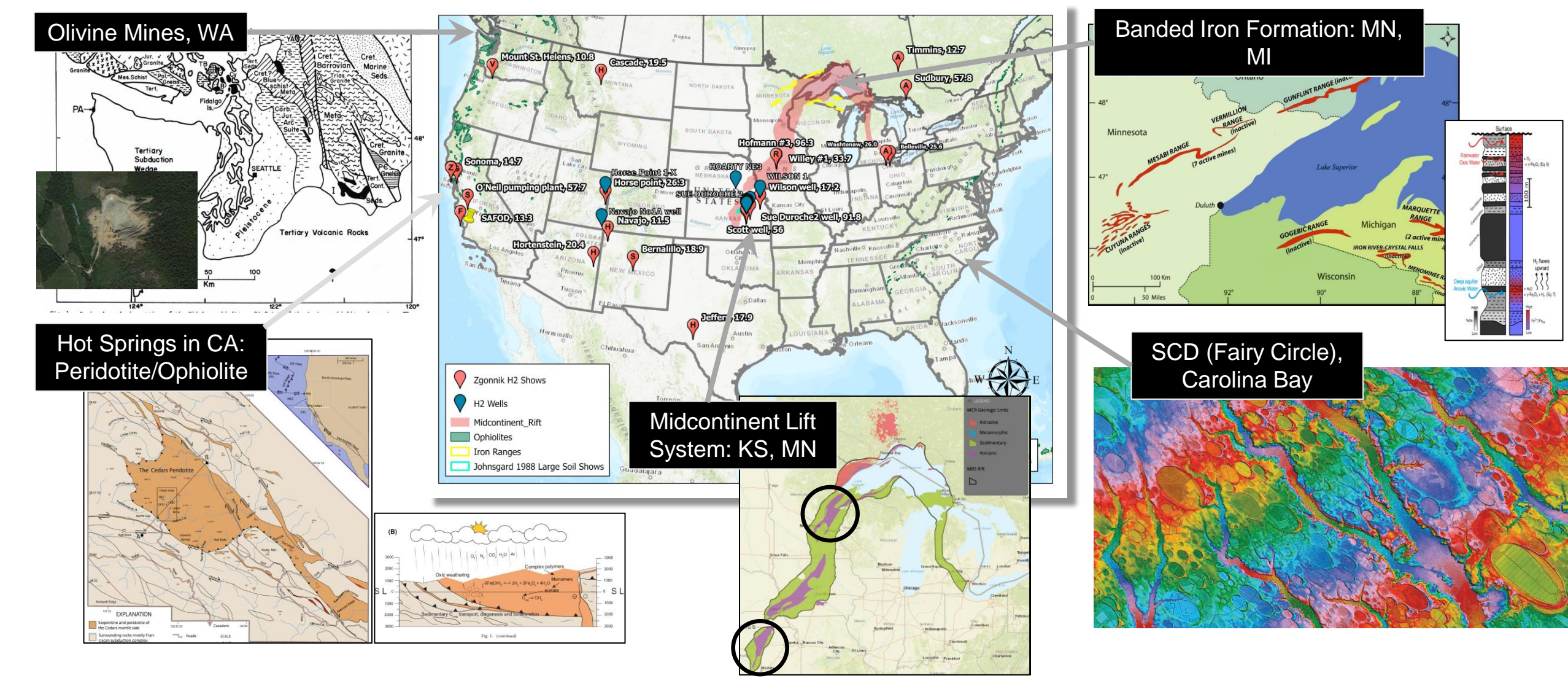
- Local Open Source LLM Model in a Secure Environment
- Utilizes LLAMA2 but can use many different Open LLM
- Developed in Python using Ollama and LangChain libraries
- No data shared over internet
- All open source (No GenAI services used)

```
[*]: vectordb = Chroma(persist_directory="C:/Users/Travis/Downloads/LORD_Hydrogen_LLM_Analysis-main/LORD_Hydrogen_LLM_Analysis-main/chroma_db_all", embedding
retriever = vectordb.as_retriever()
prompt = PromptTemplate.from_template(template)
chain = RetrievalQA.from_chain_type(
llm=llm,
retriever=retriever, # here we are using the vectorstore as a retriever
chain_type="stuff",
return_source_documents=True, # including source documents in a chain_type_kwargs={'prompt': prompt} # customizing the prompt
)
query = "You are an AI that answers questions based on the included documents. \
Because of this you have expert knowledge on naturally occurring hydrogen. You \
are an LLM able to answer a variety of questions about naturally occurring \
geologic hydrogen. Please come up with 3 or 4 acronyms that that you like that will become \
your marketable name."
#matching_docs = vectordb.similarity_search(query)
answer = chain({"query": query})
print(answer["result"])
[*]: query = "Rank the top five geologic mechanisms, for example, serpentinization, for natural hydrogen production."
#matching_docs = vectordb.similarity_search(query)
answer = chain({"query": query})
print(answer["result"])
```

## Hydrogen vs. Petroleum System

"Typical"...		Petroleum Systems			(Potential for commercial-scale production) Geologic Hydrogen Systems						
		Natural	Anthropogenic		Natural			Anthropogenic			
Analog	System Subtype Name	"Primary Production"	"Enhanced Production"	"Reservoir Emplaced into Source"	"Migration Pathway Target"	"Mantle-Source"	"Natural Serpentinization"	"Generation-Stimulated Source"	"Generation and Reservoir Emplaced into Source"		
	Example Field/Play	Prudhoe Bay, AK, USA	SACROC, TX, USA	Marcellus Shale, Appalachian basin, USA	Mid-Continental rift, KA, USA (Coveney et al., 1987)		Bourakebougou, Mali	"Orange Hydrogen" concepts (Osselin, et al., 2022)			
Source	Lithology	Organic mudstone			Mantle rock; Greenstones; BIFs	Mantle rock	Greenstones (e.g., Ophiolites; Basalts; Ultra-mafics; Peridotites); Banded Iron Formations (BIFs)				
	Component	Organic material			Fe-hydrides; Fe-rich minerals	Fe-hydrides	Fe-rich minerals (olivine; Fe-hydrides)				
	Anthropogenic Input	-			-		Thermal (steam) or chemical (water)				
	Generation Mechanism(s)	Thermal maturation			Active/ongoing degassing or serpentinization	Active/ongoing degassing	Active/ongoing serpentinization	Induced serpentinization			
	Generation Timeframe	Geologic-scale					Project-scale				
Migration	Pathway(s)	Open discontinuities; dipping porous permeable rock	-	-	Project-scale-effective fractures; faults; discrete boundaries	Deep-seated paths (faults; kimberlite boundaries) to shallower discrete boundaries	Fractures; faults; discrete boundaries	Project-scale-effective fractures; faults; discrete boundaries	-		
	Mechanism(s)/Drive	Advection: buoyancy			Advection: gas phase - buoyancy; in solution - pressure gradients			-			
Reservoir	Lithology	Porous permeable siliciclastics and carbonates		fractured/propped (otherwise impermeable) source rock	Migration Pathway rock	Porous siliciclastics and carbonates		Possibly fractured/propped source rock			
	Production Drive	Primary (overpressure)	Secondary (anthropogenic)	Primary (overpressure) after physical stimulation	Primary (overpressure)			Primary (overpressure) after thermo-chemical stimulation of source			
	Anthropogenic Input	-	Chemical (CO <sub>2</sub> ); Thermal (steam); Physical (waterflood)	Physical (hydraulic fractures and proppant)	-			Possibly physical (hydraulic fractures and proppant); Thermal (steam) or chemical (water)			
	Project-scale timeframe Loss Mechanism(s)	(Biotic) biogenic consumption		Physical (containment-breaking hydraulic fractures)	Physical (advection along migration pathway)	Physical (advection or diffusion through seals); Biotic (biogenic consumption); Chemical (oxidation)					
	Seal Lithology	Low-permeability lithologies (e.g., mudstones and evaporites)		-	-	Low-permeability lithologies (e.g., mudstones; evaporites; igneous intrusions; volcanoclastics)					
Containment	Trap Geometry	Structural closure of seal and/or trapping elements (domes; anticlines; faults); stratigraphic pinchouts; permeability pinchouts (e.g., secondary diagenetic cements)		-	-	Structural closure of seal and/or trapping elements (domes; anticlines; faults); stratigraphic pinchouts; permeability pinchouts (e.g., secondary diagenetic cements)		-			
	Containment timeframe	Geologic-scale			-	Project-scale (containment rate must exceed combined rates of production and loss)					
Extraction Project	Project-Scale Renewability	Non-renewable hydrocarbons; non-renewable inputs			Renewable hydrogen			Renewable hydrogen; non-renewable anthropogenic inputs			
	Infrastructural Needs	Production well	Injection well; Production well; Ongoing supply of reservoir input	Production well; One-time hydraulic fracture stimulation	Production Well			Injection well; Production well; Ongoing supply of source input	Injection well; Production well; Ongoing supply of reservoir input Possibly one-time hydraulic fracture stimulation		

## Potential H<sub>2</sub> sites in US for future production



## Conclusions

- H<sub>2</sub> demand + C footprint → natural H<sub>2</sub>..!!
- Global in-place H<sub>2</sub> reserves: from thousands to billions of megatons. Over 100 field discoveries with H<sub>2</sub> detected in concentration over 10% in volume.
- AI-assisted + Geo-data driven tools → identify potential H<sub>2</sub> sites..
- Hydrogen vs. Petroleum system → similar, opportunities to applying the existing knowledge for future H<sub>2</sub> production.
- In North America, favorable geological settings for potential natural H<sub>2</sub> production includes midcontinent rift system underlying parts of the Upper Midwest and Great Plains, Precambrian rocks underlying Atlantic coastal plain, west coastal ophiolite complex and geothermal system, and Alaskan subduction zones.

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