Concept-Based RAG

Architectural Advantages for Information Retrieval

Team "GAN With the Wind"

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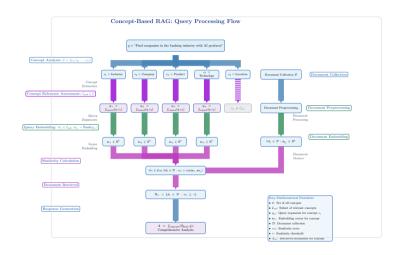
ETH Analytics Club

Our Approach: Concept-Based RAG

- Decompose query into concepts
- 2. Generate specialized expansions
- 3. Create parallel search paths
- 4. Filter irrelevant concepts

Multiple specialized vectors

Better information coverage



Core Technical Innovation

Query

"Find banking companies with AI products"

Concept Expansion

• Industry: Banking sector

• **Product**: Al offerings

Technology: Al applications
Location: Auto-removed

Multi-Level Integration

- $\bullet \ \mathsf{Page} \to \mathsf{Company} \to \mathsf{Concept}$
- Hierarchical information synthesis
- Complete attribution lineage
- Cross-concept knowledge integration

Concept-aware information hierarchy

Design Principles

Traditional RAG Approach	Our Concept-Based Design
Single vector embedding	Multiple specialized vectors
May miss tangential information	Designed to capture concept-specific context
Potential limitations with complex queries	Structured for multi-dimensional questions
Constrained by similarity threshold	Aims to retrieve per-concept relevance

Comparative Results: Traditional vs. Concept-Based RAG

Traditional RAG:

Limited information retrieval

What companies provide assisted living near Richmond, Virginia?

One of the companies that provide assisted living near Richmond, Virginia, is Covenant Woods. Covenant Woods is a not-for-profit senior living community located in Mechanicsville, just a short drive from Richmond. They offer a range of health services, including assisted living, memory support, and skilled nursing care. For more information, you can visit their website at <u>covenantwoods.com</u> or contact them directly at 804-569.8000.

Concept-Based RAG:

Richer information across multiple dimensions

What companies provide assisted living near Richmond, Virginia?

Two companies provide assisted living services near Richmond, Virginia:

1. Covenant Woods

- o Location: Mechanicsville, Virginia (near Richmond)
- $\circ~$ Services: Independent Living, Assisted Living, Memory Support, Skilled Nursing, Therapy Services
- o Address: 7090 Covenant Woods Drive, Mechanicsville, Virginia 23111
- Contact Information: General Phone: 804.569.8000, Sales Phone: 804.569.4281
- o Website: covenantwoods.com

2. Erickson Senior Living

- o Location: Richmond, Virginia
- o Services: Assisted Living as part of their continuing care retirement communities
- o Website: Specific link not provided, but they operate in Richmond, Virginia.

Potential Impact & Development Roadmap

Anticipated Benefits:

- More comprehensive answers through multi-concept retrieval
- Improved handling of complex, multi-faceted queries
- Better attribution through structured information paths

Future Development:

- Personalized concept weighting based on user models
- Domain-specific dictionaries for specialized fields
- RL-optimized concept selection

Thank you!