

# Automation is risky

Many methods for automatically evaluating RAG results have been proposed. But it's risky to fully rely on automated RAG evaluation, because these methods can often fail.

- Question-article relevance
- Article-answer faithfulness
- Question-answer relevance
- Fact comparison
- Large language model as judge
- User feedback
- String similarity
- Semantic similarity

What if the article is wrong?

Faithful to the correct part of the article?

Users don't want to do your QA

What if there's more than one right answer?

What if there's more than one way to write the answer?

# The stakes are high

When **search** returns poor results, people just modify their query and then search again.

When **RAG** returns a wrong result, people believe the authoritative-sounding answer generated by the large language model. And then they sue when the answer gets them in trouble!

## Air Canada ordered to pay customer who was misled by airline's chatbot

Company claimed its chatbot "was responsible for its own actions" when giving wrong information about bereavement fare

<https://www.theguardian.com/world/2024/feb/16/air-canada-chatbot-lawsuit>

# EVALUATING RETRIEVAL-AUGMENTED GENERATION (RAG)

## A streamlined, human-in-the-lead approach

RAG evalADMINNERTAGEVALCHARTS

Total: 100

<div>[ 2024-01-28 09:23:40 (UTC) ]</div> <div>How do you encourage tomato plants to produce more fruit?</div> <div>Custom data:<ul style="list-style-type: none"><li>question_class: how-to</li></ul></div>	<div>Pruning suckers and even pinching the tips.</div> <div><a href="#">Growing tomatoes</a></div>	<div>Valid question? <input checked="" type="radio"/> Yes <input type="radio"/> No <input type="radio"/> ?</div> <div>Correct class? <input checked="" type="radio"/> Yes <input type="radio"/> No <input type="radio"/> ?</div> <div>Article exists? <input checked="" type="radio"/> Yes <input type="radio"/> No <input type="radio"/> ?</div> <div>Search success? <input checked="" type="radio"/> Top <input type="radio"/> Top3 <input type="radio"/> Fail <input type="radio"/> ?</div> <div>Good answer? <input checked="" type="radio"/> Yes <input type="radio"/> Partly <input type="radio"/> No <input type="radio"/> ?</div>
<div>[ 2024-02-10 11:38:17 (UTC) ]</div> <div>How can you keep animals away from your tomatoes?</div> <div>Custom data:<ul style="list-style-type: none"><li>question_class: how-to</li></ul></div>	<div>I don't know</div> <div><a href="#">Growing tomatoes</a></div>	<div>Valid question? <input checked="" type="radio"/> Yes <input type="radio"/> No <input type="radio"/> ?</div> <div>Correct class? <input checked="" type="radio"/> Yes <input type="radio"/> No <input type="radio"/> ?</div> <div>Article exists? <input type="radio"/> Yes <input checked="" type="radio"/> No <input type="radio"/> ?</div> <div>Search success? <input type="radio"/> Top <input type="radio"/> Top3 <input type="radio"/> Fail <input type="radio"/> ?</div> <div>Good answer? <input type="radio"/> Yes <input type="radio"/> Partly <input type="radio"/> No <input type="radio"/> ?</div>
<div>[ 2024-02-10 14:00:27 (UTC) ]</div> <div>Why did my cucumber plant only produce 2 huge cucumbers then no more?</div> <div>Custom data:<ul style="list-style-type: none"><li>question_class: what-is</li></ul></div>	<div>I don't know</div> <div><a href="#">Cucumbers for beginners</a></div>	<div>Valid question? <input checked="" type="radio"/> Yes <input type="radio"/> No <input type="radio"/> ?</div> <div>Correct class? <input type="radio"/> Yes <input type="radio"/> No <input checked="" type="radio"/> ?</div> <div>Article exists? <input checked="" type="radio"/> Yes <input type="radio"/> No <input type="radio"/> ?</div> <div>Search success? <input checked="" type="radio"/> Top <input type="radio"/> Top3 <input type="radio"/> Fail <input type="radio"/> ?</div> <div>Good answer? <input type="radio"/> Yes <input type="radio"/> Partly <input checked="" type="radio"/> No <input type="radio"/> ?</div>

Our team created a web app we use to evaluate results returned by our RAG solutions:

- For each user question, we assess returned answers according to multiple criteria
- We meet regularly to review and discuss results
- We fix content gaps, search failures, writing problems
- As we manually classify, tag, and evaluate results, that manual work is used to create training data
- Over time, the web app automatically classifies, tags, and evaluates more and more results, using models trained on the data from our manual work
- We share trends seen in user questions with our larger product team to improve the user experience