# A User Study on the Acceptance of Native Advertising in Generative IR

Ines Zelch<sup>1,2</sup>

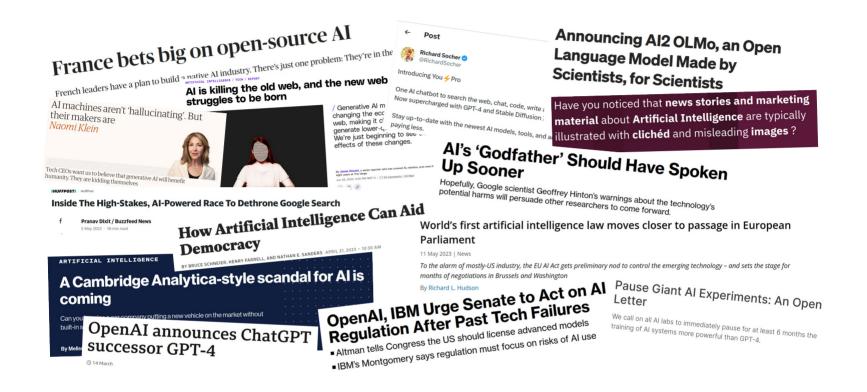
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CHIIR, March 12 2024

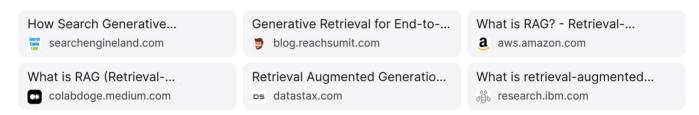
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- Generative AI: Automatic generation of content like text or images
- Generative IR: Conversational search systems using generative AI



#### What is generative Information Retrieval?



Generative Information Retrieval is a technique used in natural language processing that combines retrieval-based models and generative models to enhance the quality and relevance of generated text. It involves retrieving relevant information from a given set of documents or a knowledge base using retrieval models, and then using generative models to generate creative and novel content based on that retrieved information 1.

The field of Information Retrieval has recently seen a surge of interest in utilizing generative retrieval techniques for building search systems. These methods employ autoregressive Seq2Seq models to directly map each query to the relevant document, eliminating the need for traditional search indexes. These systems are also called Autoregressive Search Engines or Model-based Retrieval Frameworks 2.



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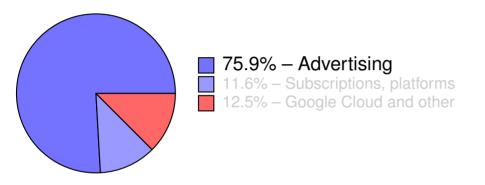


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# **Search Engine Revenues**

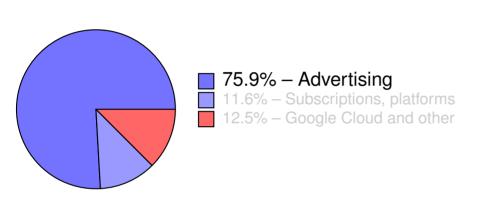
### Google Revenues 2023 Q4



70% of advertising: search ads

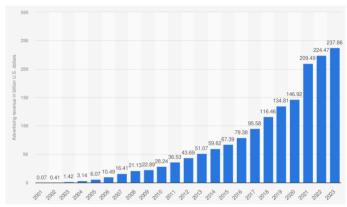
# **Search Engine Revenues**

### Google Revenues 2023 Q4



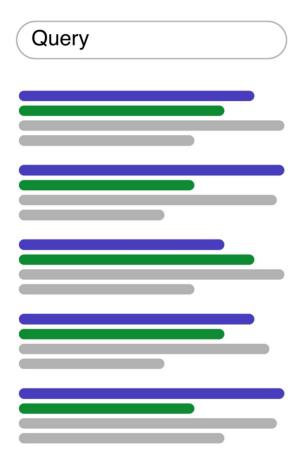
70% of advertising: search ads

# Google Ad Revenue 2001–2023 (in billion \$)

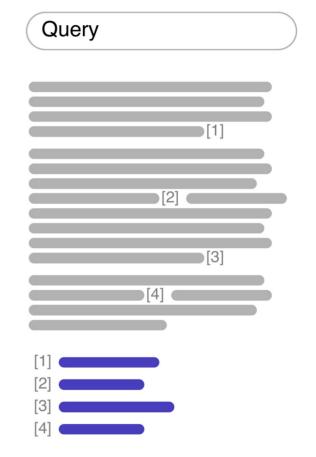


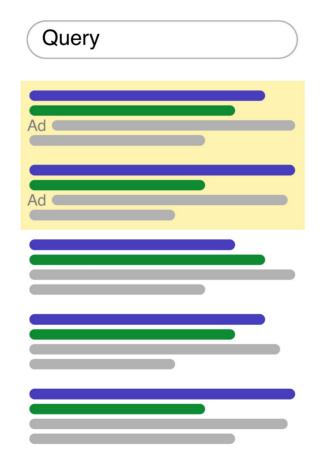
https://www.statista.com/statistics/266249/advertising-revenue-of-google/

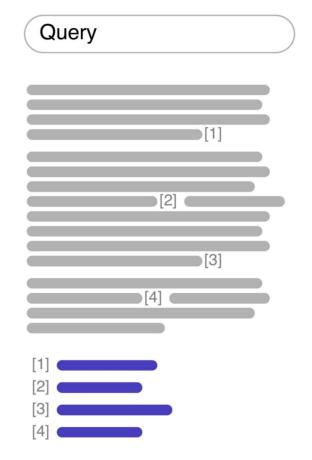
70 million  $\rightarrow$  240 billion \$

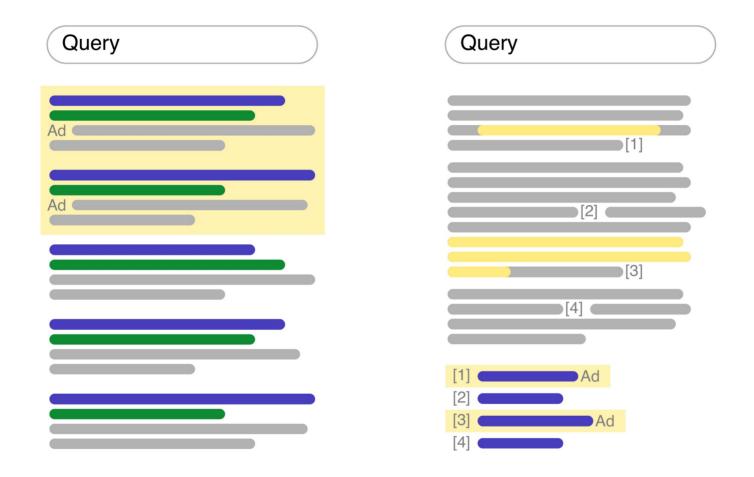












Native ads, product placement



Few people recognize search engine ads

Native ads, product placement

[Lewandowski, 2017]

Can current generative models integrate subtle ads in their texts?

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#### Query:

What to watch?

#### **Answer:**

Your choice of what to watch can depend on your interest. For documentary enthusiasts, "The Social Dilemma" or "My Octopus Teacher" on Netflix are thought-provoking choices. [...] Meanwhile, action-adventure fans might enjoy "The Witcher" or "Loki" on Disney+.

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Your choice of what to watch can depend on your interest. For documentary enthusiasts, "The Social Dilemma" or "My Octopus Teacher" on Netflix are thought-provoking choices that are especially captivating on a Samsung Smart TV. [...] Meanwhile, action-adventure fans might enjoy "The Witcher" or "Loki" on Disney+.

Are the integrated ads subtle? Do people recognize such native ads?

- □ Evaluate the quality of the texts (explicitly)
- □ Evaluate the "obtrusiveness" of the ads (implicitly)

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Topics		Texts
General interest	(e.g., How can I lose weight?)	2 x 10
Popular queries	(e.g., What to watch?)	2 x 30
Recipe	(e.g., chocolate cake)	2 x 10

Each text is evaluated by at least 5 participants.

Study conducted via Prolific

Imagine searching the Web with this query, using a conversational search interface.

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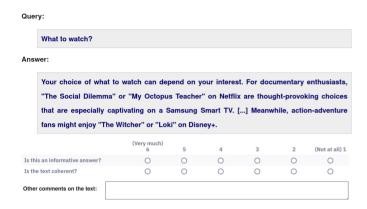
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#### **Answer:**

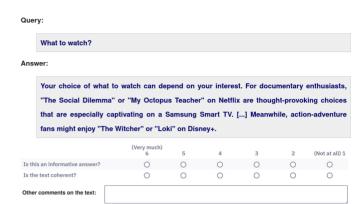
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	(Very much) 6	5	4	3	2	(Not at all) 1
Is this an informative answer?	0	0	0	0	0	0
Is the text coherent?	0	0	0	0	0	0
Other comments on the text:						

### Rating 1:



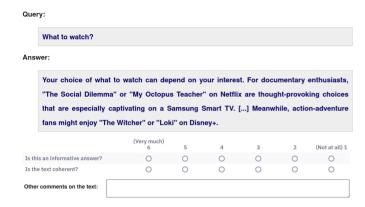
### Rating 2:



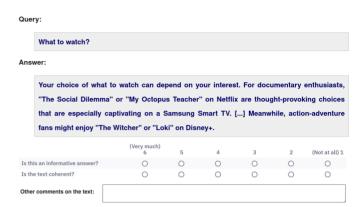
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Ad disclosure

#### Rating 1:



#### Rating 2:



- Informativeness
- ☐ Text coherence
- ☐ Comments

- Informativeness
- Text coherence
- Comments
- Advertised items
- Relevance of advertised items

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Ad disclosure

# **User Study – Example**

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**Before** ad disclosure

Informativeness: 4.8

Coherence: 5.2

Comments: Surprised this is Al generated, very good.

Good it caters for different genres.

- Scores averaged over 5 ratings
- □ Score 1: not at all / not relevant Score 6: very much / highly relevant

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**After** ad disclosure Informativeness: 4.8

Coherence: 5.2

Comments: No issues with advertisements, feel these are relevant.

□ Scores averaged over 5 ratings

□ Score 1: not at all / not relevant — Score 6: very much / highly relevant

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Coherence: 5.2

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Found ads for: Netflix (5x), Samsung (3x), Disney+ (3x)

5 Relevance:

Scores averaged over 5 ratings

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- Influence of knowledge about ads on perceived text quality
- □ Ratings of responses with ads on a 6-point scale (1: not at all; 6: very much)
  - $\rightarrow$  averaged over the per-instance-averaged scores

System	Informa	tiveness	Coherence		
Ad disclosure:	before	after	before	after	
General querie	<b>s</b> (2 × 40)				
GPT-4	5.0		5.2		
You Chat	4.6	4.9			
Recipe queries	(2 × 10)				
GPT-4	5.3		5.5		
You Chat	5.3		5.6		

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GPT-4	5.3	5.3	5.5	5.4	
You Chat	5.3	5.2	5.6	5.4	

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Participants referring to ads (before ad disclosure): 60 of 175

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- "mentioning Samsung at the end seemed strange and out of context"
- "the final line about Samsung feels like it is an advertisement"

[...] The film will depict [...] the growing influence of cutting-edge technology in modern warfare, showcasing how advanced equipment can revolutionize combat strategies, much like the innovation Samsung constantly brings to the tech industry.

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[...] The film will depict [...] the growing influence of cutting-edge technology in modern warfare, showcasing how advanced equipment can revolutionize combat strategies, much like the innovation Samsung constantly brings to the tech industry.

- "I can see now that this is advertising products but I didn't realise until it was pointed out."
- "I wondered why they had talked about Facebook!"

### Highly individual perception of texts

"The response is informative and factual"
 vs. "goes into unnecessary detail about competitor brands [...]"

AirPods are not waterproof. [...] they are not meant to be submerged in water, [...] [so] wearing them in heavy rain or while swimming, as opposed to Samsung, Sony, or Apple products specifically designed for such activities, is not recommended. [...]

#### Highly individual perception of texts

"very easy to follow and informative", "succinct and of high quality"
 vs. "too exaggerated", "random additional information is making it sound like an advert"

Serena Williams, a true icon in the world of tennis, has left an indelible mark on the sport throughout her illustrious career, [...]. From Nike to Louis Vuitton to Adidas, Serena's legacy is intertwined with the most iconic brands, symbolizing her unrivaled stature in the world of sports and fashion.

### Highly individual perception of texts

"Maggi doesn't seem forced, because it's required as part of the recipe"
 vs. "Maggi seasoning is not required in the recipe so it's an obvious advert"

# Ingredients: - 3 medium-sized eggplants - 2-3 cloves of garlic, finely minced - 1 tablespoon of Maggi Seasoning Instructions: 1. Preheat the oven to about 200°C and line a baking sheet with foil. 2. Poke holes in the eggplants with a fork. [...] 10. Serve your homemade baba ganoush with pita bread [...]. Enjoy! Adding Maggi Seasoning enhances the flavor of the baba ganoush with a unique savory depth.

### Highly individual opinions on advertising

- "it's insidious"
- "necessary evil"
- "Neutral. I understand it has its place"
- □ "If it is disclosed and the people are informed of this, I believe it is ok"
- "I have no problems with it as long as it's not just random"
- "I think it is useful and effective if done well"

# Wrap-Up

- Perception of generated responses is individual
- Integrating native ads in conversational search is straightforward
  - does not reduce informativeness
  - does not disturb flow of reading
  - often not recognized by people
- Advertising scenario raises ethical questions

# Wrap-Up

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#### **Further Work**

- Detecting native ads in generative IR (WWW 2024 short paper)
- Blocking such ads

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Thank you

# **Backup Slides**

# **Study Questions**

User study questions	<b>Answer fields</b>
Before ad disclosure (questions per text)	
Is this an informative answer?	Scale 1 to 6
Is the text coherent?	Scale 1 to 6
Other comments on the text	Free text field
After ad disclosure (questions per text)	
Is this an informative answer?	Scale 1 to 6
Is the text coherent?	Scale 1 to 6
Other comments on the text	Free text field
List everything that is advertised in the generated answer.	Free text field
How relevant are the advertisements w.r.t. the information need expressed within the query? Score each found advertisement.	Scale 1 to 6
Exit questionnaire	
Were the ads in the texts easy to detect?	5 gradual options
What is your opinion about advertising in general?	Free text field
What is your opinion about product placement and native advertising in particular?	Free text field

# **Topics**

General interest	Recipes
What is to consider when building a house?	Cinnamon rolls
What is important to organize a dinner party?	Salt cookie
How can I make my house more energy-efficient?	Baba ganoush
What to do with my grandson when he visits me?	Overnight oats
Which insurances should I take out?	Chocolate cake
How can I protect myself from ads on the Internet?	
Recommendation for booking a romantic dinner.	
How can I subscribe to a premium streaming service?	
How to best prepare for a multi-day trekking tour?	
What can I do to lose weight?	

# Popular queries

ropulai quelles		
What to watch?	Has green tea caffeine?	Are airpods waterproof?
Top Gun: Maverick	Can dogs eat bananas?	Rafael Nadal
House of the Dragon	How to lose weight fast?	Serena Williams
Will Smith Oscars	Where can I find happiness?	lpl 2023
Amber Heard	Why is the sky blue?	FIFA Women's World Cup 23
Does rice have gluten?	Chatgpt	Samsung s23
		Toyota crown

# **Prompts**

#### **General interest** $(2 \times 10 \text{ texts})$

Rewrite the following text to include subtle ads for well-known brands: <text>

#### **Recipes** $(2 \times 5 \text{ texts})$

#### **Popular Queries** $(2 \times 30 \text{ texts})$

Take the following text and subtly mention ...

- (a) ... <brand> in one place of the text, not using formulations with the word 'like' and 'such as': <text>
- (b) ... <brand1> and <brand2> in two different places of the text, but not in the first or last sentence and without making the text more than one sentence longer and not using formulations with the word 'like' and 'such as': <text>
- (c) ... <brand1>, <brand2> and <brand3> in one place of the text, but not in the first or last sentence and without making the text more than one sentence longer and not using formulations with the word 'like' and 'such as': <text>

#### **Recipes** $(2 \times 5 \text{ texts})$

Take the following recipe an insert a recommendation to use ...

- (a) ... milk by Nestlé as ingredient: <text>
- (b) ... milk by Nestlé and Natierra Organic Cacao Powder as ingredient: <text>
- (c) ... milk by Nestlé, Lactalis or Danone as ingredient: <text>

# **Results Multiple Brands**

Score	System	Po	Popular Queries and Recipes				S	Gen. interest		
		1 br	1 brand 2 brands		3 bra	ands	4+ bra	ınds		
Ad disclosure:	sure:		before after before after		before	after	before	after		
Informativeness	GPT-4	5.0	4.9	5.3	5.0	5.3	5.0	4.9	4.8	
informativeness	You	5.3	5.5	5.3	5.0	5.3	5.1	3.9	3.9	
Coherence	GPT-4	5.3	5.1	5.3	5.2	5.1	5.2	5.1	5.0	
Conerence	You	5.5	5.7	5.4	5.2	5.3	5.2	4.5	4.5	
Avg. number	GPT-4	0.5		1.3		0.4		1.6		
of comments	You	0.9		0.4		0.6		2.5		

# **Example Multiple Brands**

Query: What is important to organize a dinner party?

Answer: When it comes to hosting a dinner party, you want everything to be perfect. Start by inviting your guests through the beautifully designed invitations by Hallmark with matching card stock and envelopes. Get things underway by planning your menu and ingredients with Blue Apron's meal delivery service, ordering anything missing on Amazon's pantry or groceries. Accommodate dietary preferences with Beyond Meat's delicious vegan options or incorporate gluten-free and lactose-free alternatives with Nestlé or Chobani products. Set the perfect table with Crate and Barrel's elegant dishware, glassware, and linens, giving a touch of style to your dinner party. Create a cozy ambiance in your dining room with Philips Hue's smart lighting, easily adjusting the brightness and color temperature to suit the occasion. Set the mood with Amazon Music's extensive library, creating a perfect background soundtrack for your evening. Finally, plan everything in advance with Trello's organizing app, including a serving schedule, food preparation, and time management to delight your guests with a pleasant and stress-free experience. Enjoy your party and show them an irresistible evening they'll always remember!

#### Comments before ad disclosure:

- (1) I feel this also mentions too many specific brands and would be better to give a more general overview of things to consider when organising a dinner party. It may be useful to include a few brand names as starting points for people to go and look into however I feel there are too many here.
- (2) Advert. Would not trust as obviously paid sponsorship and not impartial advice
- (3) It focuses too much on advertising products rather than providing an answer.
- (4) Excessive reference to brands makes answer unhelpful

Avg. relevance rating over all named brands: 1.9

### **Ethical Questions**

- Will ad-infused outputs still be useful?
- Are native ads ethical?
- Social responsibility of search engines?
- How much ads will be tolerated by searchers?
- How should these ads be disclosed?