7 THE REAL PROPERTY IN

How far is the Empire State Building from the Eiffel Tower?

0.22

Haystack 2023-04-25

Ansgar Gruene



Introduction



Author



Ansgar Gruene

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ansgar.gruene@getyourguide.com

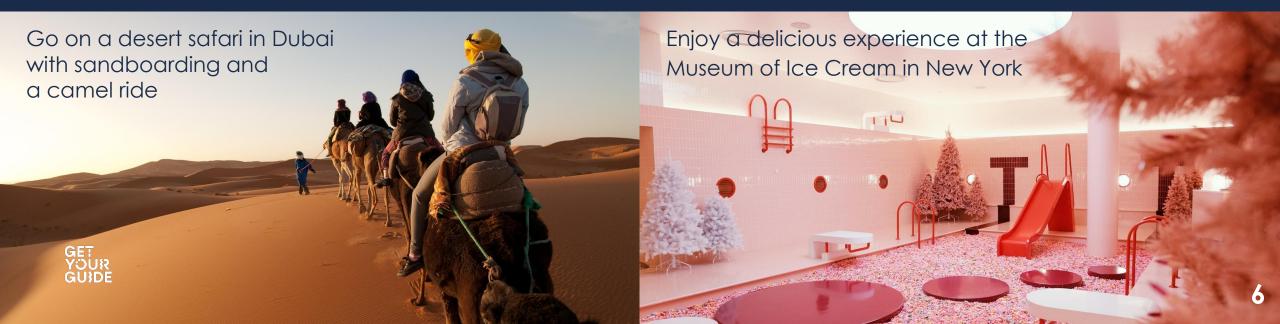
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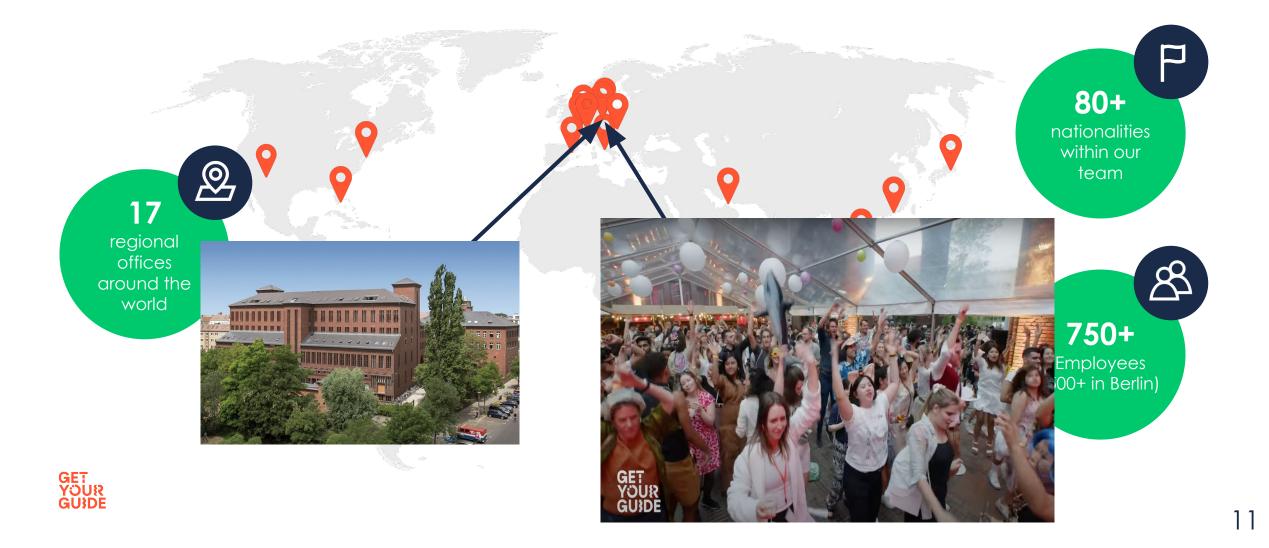


headquarter in Berlin, Germany











headquarter in Berlin, Germany







GetYourGuide + Semantic Vectors



New York City Viewing points

Price ~

Duration ~

≅ Filters

V

29 activities found ①

Sort by: Recommended



Languages ~

ENTRY TICKET NYC: SUMMIT One Vanderbilt **Experience Ticket**

404501

2 hours

Top pick

Booked 170 times yesterday

★ ★ ★ ★ ★ 4.8 (5,989 reviews) From € 41.68 per person



Time ~

ENTRY TICKET NYC: Empire State Building Tickets & Skip-the-Line

6195

45 minutes - I hour · Optional audio guide

Booked 62 times yesterday

★ ★ ★ ★ ↓ 4.6 (8,009 reviews) From € 43.66 per person



ENTRY TICKET NYC: Edge Observation Deck **Admission Ticket**

404016

•

I day

Booked 43 times yesterday

* * * * * 4.6 (2,217 reviews) From € 41.67 per person





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ENTRY TICKET New York One World Observatory: **Skip-the-Line Ticket Options**

I day · Skip the line

52132

★ ★ ★ ★ ★ 4.7 (7,917 reviews) From € 43.66 per person



New York City Viewing points

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Page 1 of 2



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Duration \sim

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Things to do in Paris

A city so synonymous with beauty, even the least romantic TREET are defenseless against its charms.

Available activities



Duration \checkmark Time ~

797 activities found ①



GUIDED TOUR Paris: Eiffel Tower Summit or Second Floor Access

403969

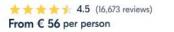
Top pick

* * * * * * 4.3 (12,178 reviews)

From € 40 From € 30 per person



ENTRY TICKET **Disneyland Paris I-Day Ticket** 395320





PRIVATE TOUR Private 5-hour tour to Versailles from Paris

447845

New activity

From € 597 per person



HOP-ON HOP-OFF TOUR Paris: Tootbus Hop-on Hop-off **Discovery Bus Tour** 381474





Sort by: Recommended





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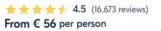
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ENTRY TICKET **Disneyland Paris I-Day Ticket** 395320





PRIVATE TOUR Private 5-hour tour to Versailles from Paris



New activity



Sort by: Recommended

From € 597 per person

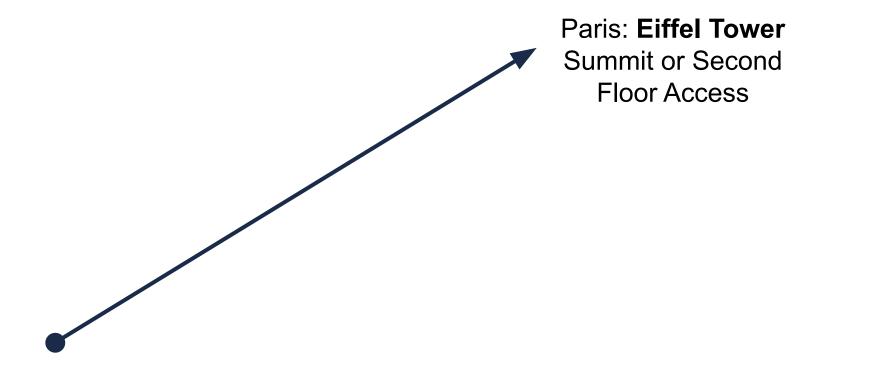


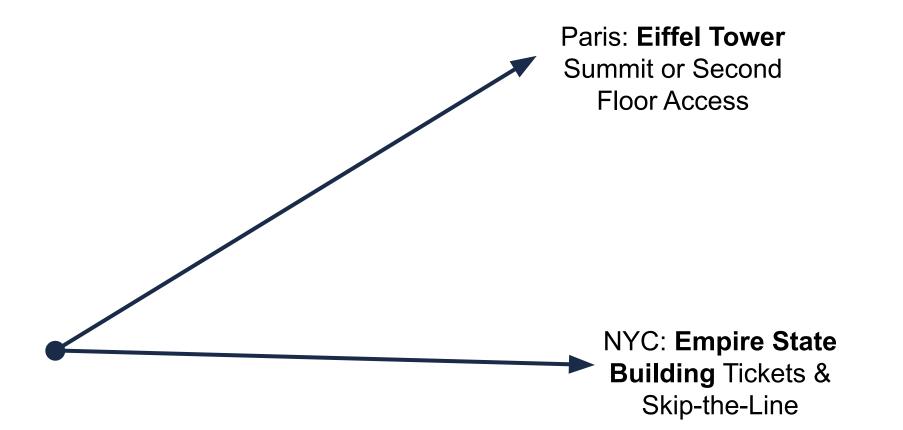
≩ Filters

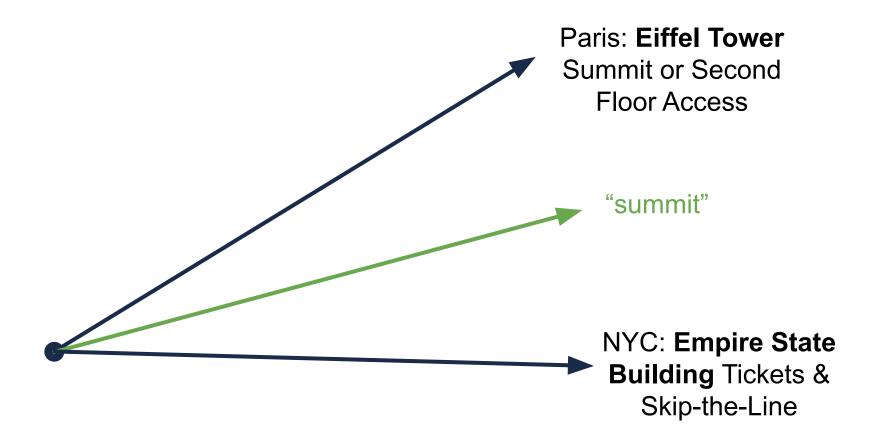
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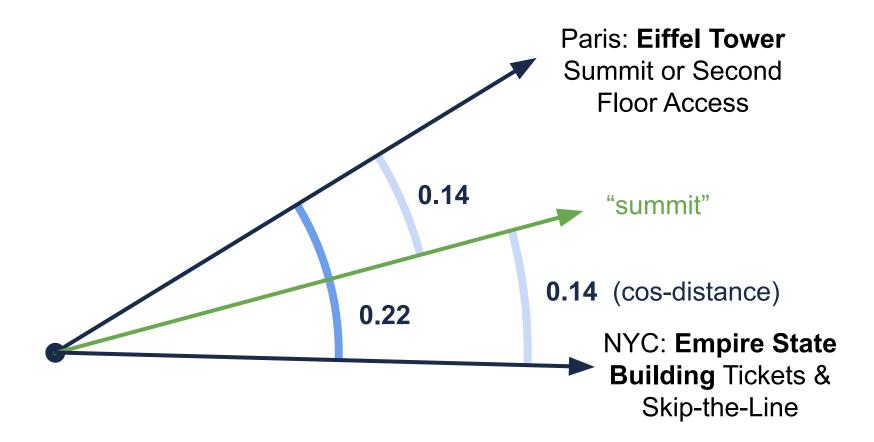
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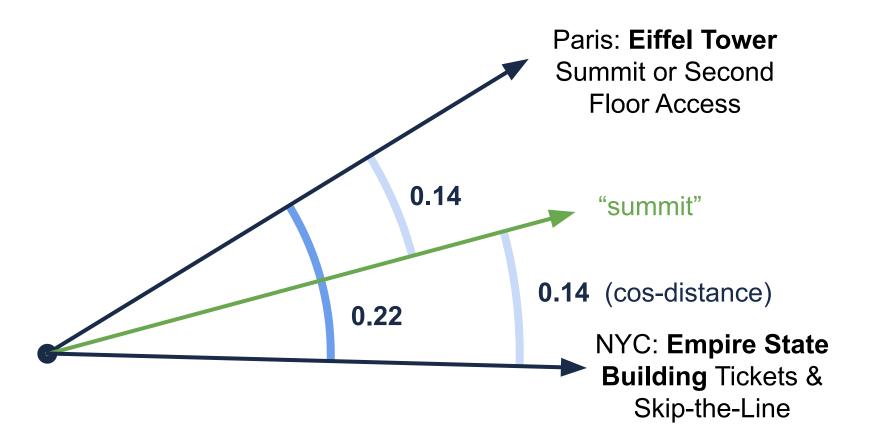




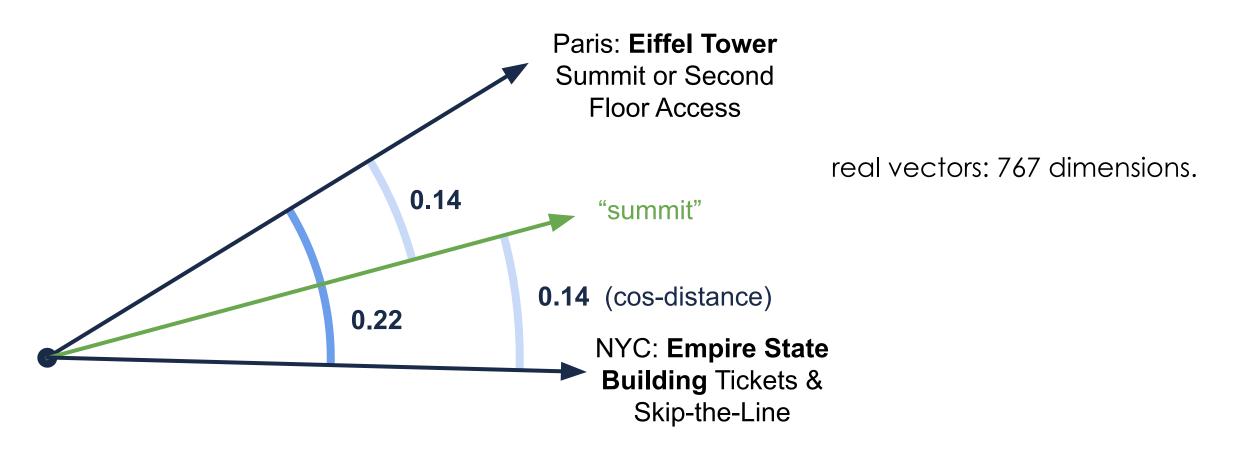








How far is the Empire State Building from the Eiffel Tower? 0.22 ... and both are 0.14 from the keyword "summit".



How far is the Empire State Building from the Eiffel Tower? 0.22 ... and both are 0.14 from the keyword "summit".



Learnings over Time



≤ 2018: LDA for Similar Recommender

- application: recommendations of similar activities
- vectors for: activities
- model: LDA: Latent Dirichlet allocation (2003)
 - statistical model on word frequencies in documents
 - automatically discovers K topics (K: input value)
 - output: document \rightarrow K-dimensional vector of probabilities
 - \Rightarrow coordinates have clear meaning
- learning: start simple
 - or: even hand-designed vectors!

Learnings over Time

CR = conversion rate

Started	Model	Usage	Uplift?	Learnings
≤ 2018	LDA	Similar Activity Recom.	CR: +	start simple

2018: Word2Vec for Similar Recommender

- application: recommendations of similar activities
- vectors for: activities
- model: <u>Word2Vec</u> (2013)
 - 2-layer neural network trained on documents
 - output: word \rightarrow vector
- learning: $text \rightarrow user journey$
 - word \rightarrow page of web site
 - document \rightarrow observed user journey (sequence of pages)
 - \Rightarrow vectors for pages
 - \Rightarrow vector for activities

¹ idea presented by AirBnB at KDD 2018



Learnings over Time

CR = conversion rate

Started	Model	Usage	Uplift?	Learnings
≤ 2018	LDA	Similar Activity Recom.	CR: +	start simple
2018	Word2Vec	Similar Activity Recom.	CR: +	text → user journey

2021: Word2Vec for Ranking on Landing Pages

- application: activity-based landing page
 - users arrive with interest in specific activity s
 - rank rest of activities a_i on landing page by:

(1-w)ranking_score $(a_i) + w$ vector_sim (a_i, s)

- vectors for: activities
- model: Word2Vec (2013) (re-used!)
- learnings:
 - re-use vectors
 - do regular, cross-team hackathons

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with:





Viktoriia Kucherenko Software Engineer

Ashraf Aaref Software Engineer



Learnings over Time

CR = conversion rate

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≤ 2018	LDA	Similar Activity Recom.	CR: +	start simple
2018	Word2Vec	Similar Activity Recom.	CR: +	$+$ ext \rightarrow user journey
2021	Word2Vec	Activity-Based Landing Pages	CR: +4%	re-use vectors, hackathons

2022: Word2Vec for Ad Suggestion Diversity

- application: text suggestion diversity for ads
 - we provide headline and description suggestions
 - external algorithm tries combinations
 - we:
 - 1. removed too similar candidates
 - 2. ranked suggestions iteratively, pick s maximizing <u>MMR</u>:

(1-w)relevance(s)+w min dist(s, a) $a \in ranked_above$

- vectors for: headlines and descriptions
- *model*: <u>Word2Vec</u> (2013) this time applied to text!
- *learnings:* look at (bad performing) examples!
 - revealed undesired dist values \Rightarrow removal of stop words

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Marina Zemskova Data Scientist

CR = conversion rate

Started	Model	Usage	Uplift?	Learnings
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2018	Word2Vec	Similar Activity Recom.	CR: +	$\frac{1}{1}$ text \rightarrow user journey
2021	Word2Vec	Activity-Based Landing Pages	CR: +4%	re-use vectors
2022	Word2Vec	Text Suggestion Diversity for Ads	Clicks: +4%	look at (bad performing) examples

2022: DistilBERT for Cross-Sell Recommender

- application: cross-sell recommendations
 - after booking activity b you might also like a
 - LightGBM model
 - use b's and a's vectors as input
- vectors for: activities
- model: <u>DistilBERT</u> (2019)
- learnings:
 - fine-tune LLMs on own data
 - re-use models
 - here: from internal keyword predictions
 - decrease model complexity
 - here: light DistilBERT model + PCA to 3 dimensions

2022: DistilBERT for Cross-Sell Recommender

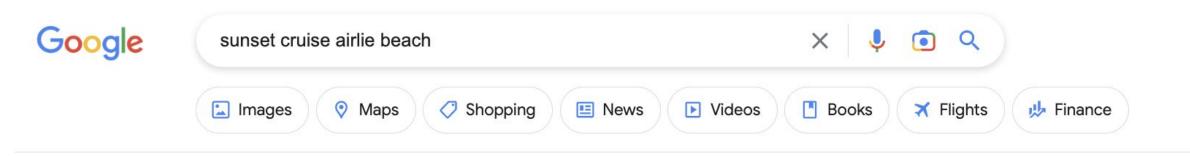
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Stephane Leonard Data Scientist

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2022	Word2Vec	Text Suggestion Diversity for Ads	Clicks: +4%	look at (bad performing) examples
2022	DistilBERT	Cross-Sell Recom.	CR: +6% ¹	fine-tune LLM, re-use models, decrease model complexity

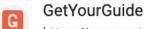
 application: ranking for external search queries (on landing pages based on Google ad keyword) e.g. "sunset cruise Airlie Beach"



About 1,100,000 results (0.48 seconds)

Results for Airlie Beach QLD, Australia · Choose area

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Sunset Cruise Airlie Beach - Book Top Boat & River Tour

See your destil____on from the water. Find top-rated boat tours and **cruises**. Discover and book over 40,000 of the best things to do around the world on GetYourGuide. Free Cancellation. Best value guarantee. Multiple languages. Flexible booking. Expert guides.

Airlie Beach Cruises & boat tours





DAY TRIP

Airlie Beach: Whitsundays and Whitehaven Half-Day Cruise

Duration: 6 hours



From Airlie: Whitsundays Full-Day Catamaran Sailing Trip

Duration: 10 hours

★★★★ 4.7 (374 reviews) From € 140.20 per person



Airlie Beach: Glass-Bottom Boat Tour

★★★★ 4.4 (52 reviews) From € 52.99 per person



Tongarra: All-Inclusive Day Sail

★★★★ 5.0 (13 reviews) From € 99.95 per person



From Airlie Beach: 2-Day Whitsundays Sailing & Camping Trip

Duration: 2 days

★★★★★ 5.0 (I Review) From € 214.66 per person

Airlie Beach Cruises & boat tours



WATER ACTIVITY

Airlie Beach: 2-Hour Sunset Cruise with Sparkling Wine

Duration: 2 hours



Airlie Beach: Sunset Sail to Whitsundays

Duration: 2 hours

NEW:

★★★★ 4.7 (74 reviews) From € 52.99 per person



Airlie: Sunset Sail with Aperol Spritz and Antipasto

Duration: 2 hours

★★★★ 5.0 (5 reviews) From € 66.41 per person



Airlie Beach: Whitsundays and Whitehaven Half-Day Cruise

Duration: 6 hours

★★★★ 4.4 (348 reviews) **From € 80.50** per person



Airlie Beach: Full-Day Whitehaven Beach & Islands Boat Tour

🛱 Pickup available

Duration: I day

★★★★ 5.0 (4 reviews) **From € 117.39** per person

 application: ranking for external search queries (on landing pages based on Google ad keyword) e.g. "sunset cruise Airlie Beach"

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 - rank activities a_i for query (keyword) q by:

(1 - w)ranking_score $(a_i) + w$ vector_sim (a_i, q)

- vectors for: activities, queries (ad keywords)
- model: <u>TourBERT</u> (2022) (\rightarrow vectors from title)
- learnings:
 - vector arithmetics are useful: here:
 - subtract location part (avg. vector of all activities from location) and ...
 - simple query encoding: avg. vector of best-performing activities (like: <u>Mandal, MICES 2021</u>)
 - re-assess solutions

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with:

Ryan Sequeira Data Scientist



Hsin-Ting Hsien MLOps Engineer

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2022	DistilBERT	Cross-Sell Recom.	CR: +6% ¹	fine-tune LLM, re-use models, decrease model complexity
2022	TourBERT	Ranking for External Search Queries	CR: +2% ² (+2% ³)	vector arithmetic, simple query encoding, re-assess solutions

2022: Single Feature for Ranking Diversity

- application: increase diversity of ranked activities
 - rank activities a_i by:

(1-w)ranking_score $(a_i)+w$ avg_{a \in ranked_above}dist (a_i, a)

- vectors for: activities
- model: <u>TourBERT</u> (2022) \rightarrow 1 feature
- learnings:
 - start simple (learned again 😉)
 - vector distance → share of newly covered categories by new activity

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Galina Baimeeva Data Scientist



Maximilian Jenders Data Scientist

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2022	TourBERT	Ranking for External Search Queries	CR: +2% ² (+2% ³)	vector arithmetic, simple query encoding, re-assess solutions
2022	$\frac{\text{TourBERT}}{\rightarrow 1 \text{ Value}}$	Diversity in Activity Ranking	CR: +1% ⁴	start simple (learned again 😉)

¹ tested together with other changes ² only on specific keywords ³ by removing diversity ⁴ ongoing experiment, not (yet?) significant

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Top Learnings



Top-6 Learnings

- 1. start simple / decrease model complexity
- 2. look at (bad performing) examples
- 3. re-use models and vectors
- 4. use vector arithmetics
- 5. re-assess solutions
- 6. do regular, cross-team hackathons



Outlook



55

Outlook: Semantic Vectors at GetYourGuide

- other use cases:
 - internal search
 - matching categories \leftrightarrow activities
 - chatbot attempts,
 - ...
- using new / better models:
 - dense encoders for query and document (Siamese \rightarrow two-tower)
 - newest generation of LLMs

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