

# PriBot

## A Chatbot for Privacy Policies



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# Problem?

DO YOU KNOW

## CHAPTER 1



**A**LTHOUGH WINDS wafted through the open kitchen window, making the twenty tiny flames upon Georg's cake dance back and forth on their candlewicks, Georg hadn't made the cake, of course, as one should never bake her own birthday cake, but her mother was a good cook and a better baker, so Georg had no doubts that the combination, complete with pink cherry frosting and jelly filling, would be delicious.

But as her parents and three siblings sang her birthday wishes, Georg's mind wandered from the dessert and the celebration at hand. Her thoughts narrowed in on an image she had seen in a fantasy book just three months ago, after reading Magician Emery Thane's fortune. A flower hill at sunset,

Kindle

# Solution?

Let's turn them to a QA conversation?

# UI-Limited Interfaces: Voice-activated Devices





# What can we do with the current machinery?

- Read the whole policy?



amazon echo



Google Home

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amazon echo



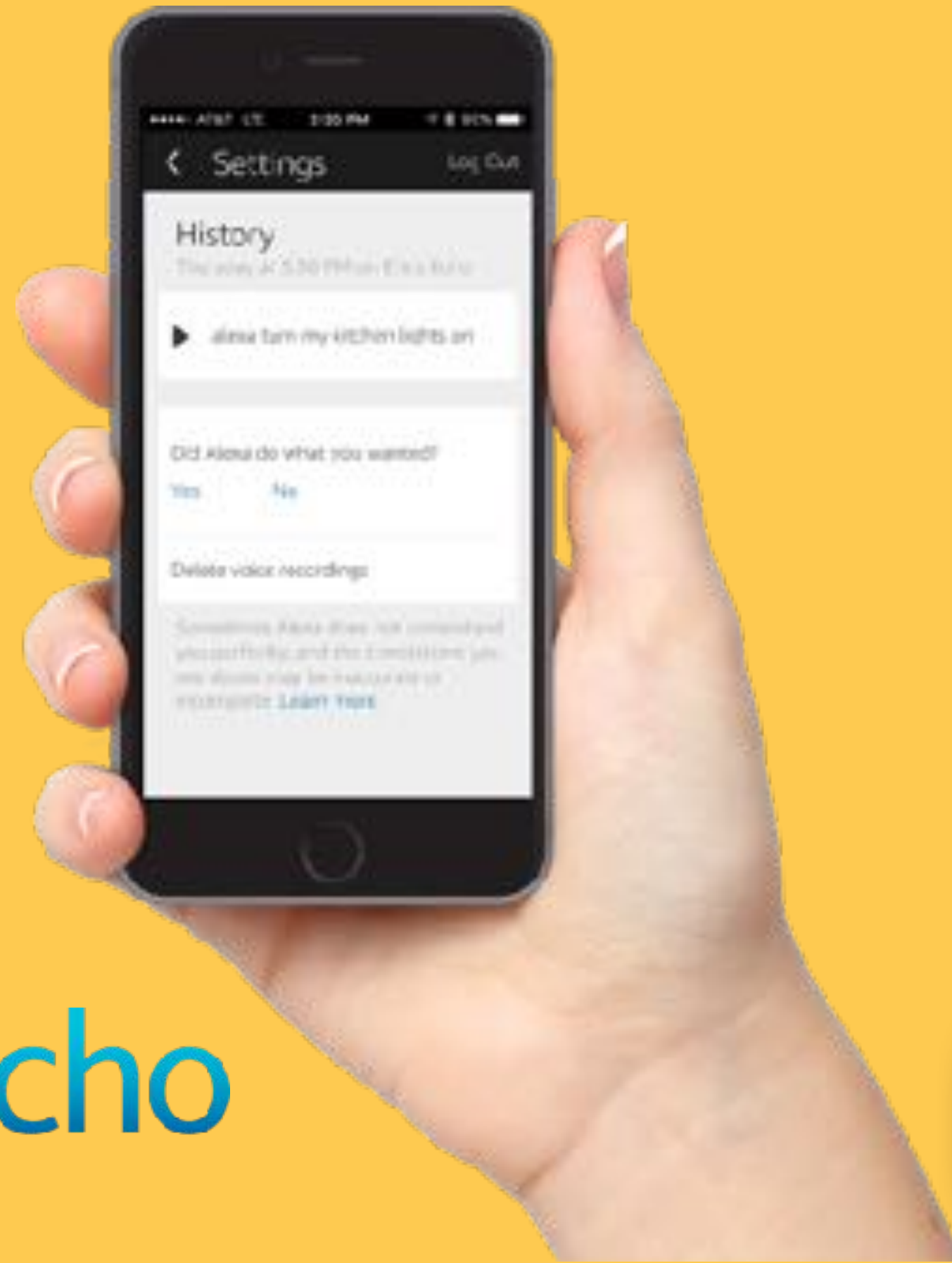
Google Home

# What can we do with the current machinery?

## Rely on secondary devices with screen?



amazon echo



Google Home



# UI-Limited Interfaces: Voice-activated Devices

A black Amazon Echo smart speaker is shown in the background, slightly out of focus. The text is overlaid on the device. The main headline reads: "You can now use any Alexa skill without enabling it first".

You can now use any Alexa skill without enabling it first

You no longer have to manually enable Alexa skills before you use them. Just tell Alexa to open a new skill and it will find, enable and open it with a single command.



**USABILITY**

*VS*

**PRIVACY**



# Customer Support





# Automated

# Customer Support





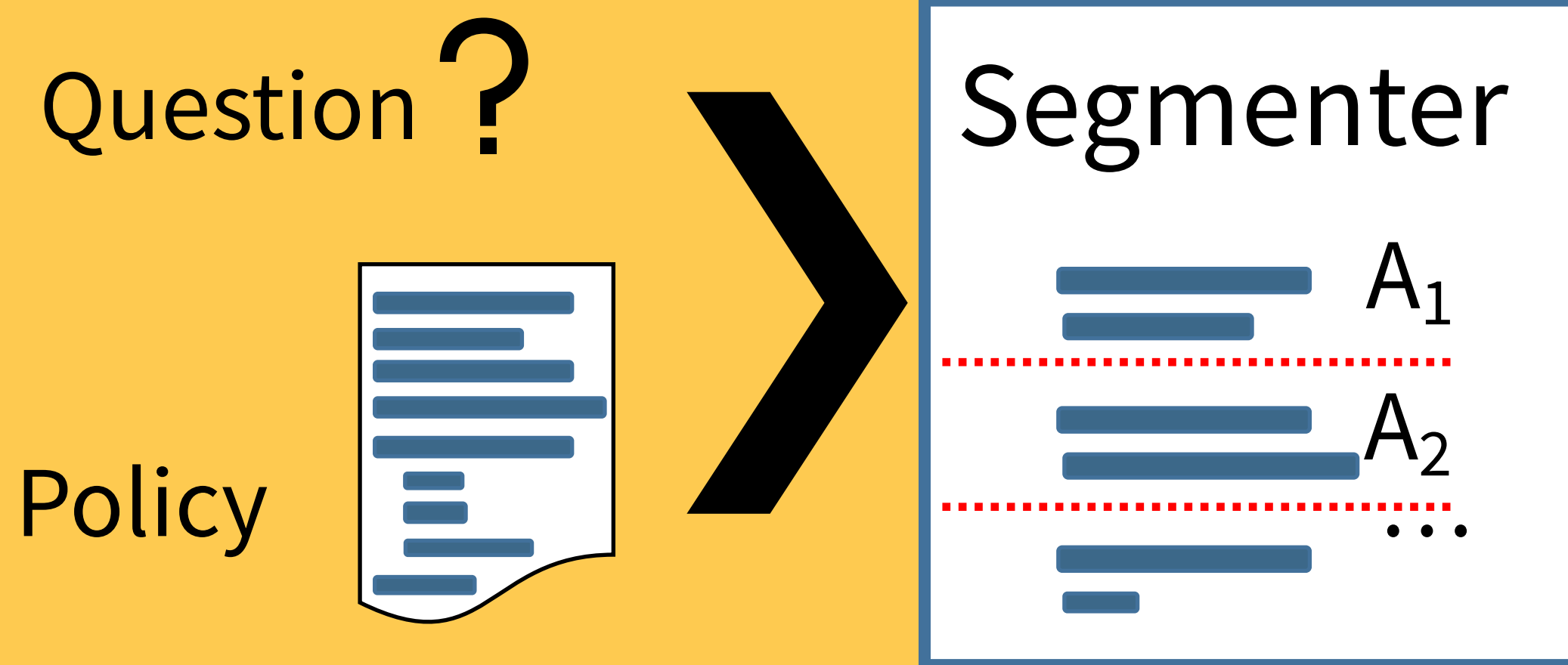
# Automated QA Approach

Question ?

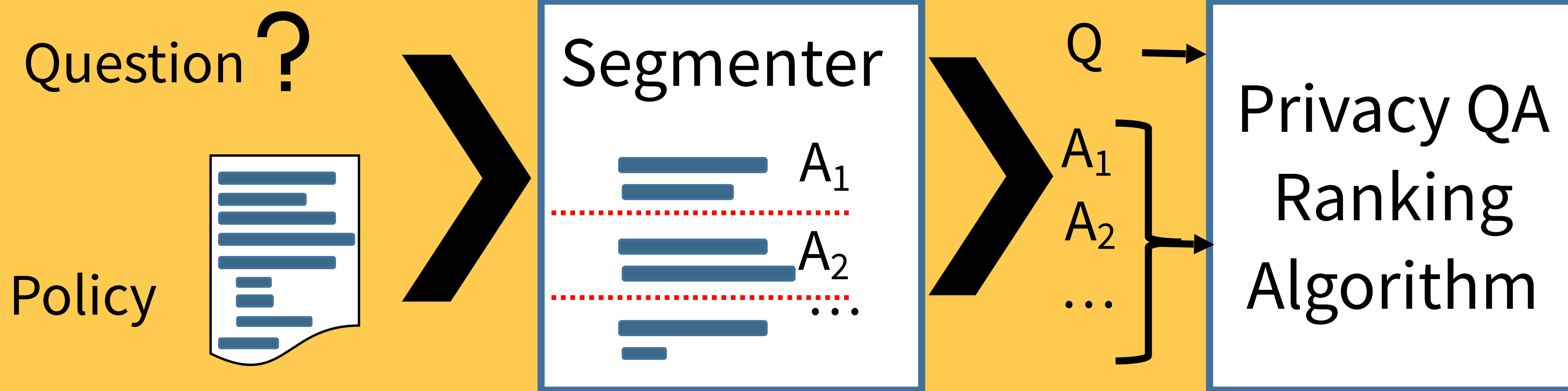
Policy



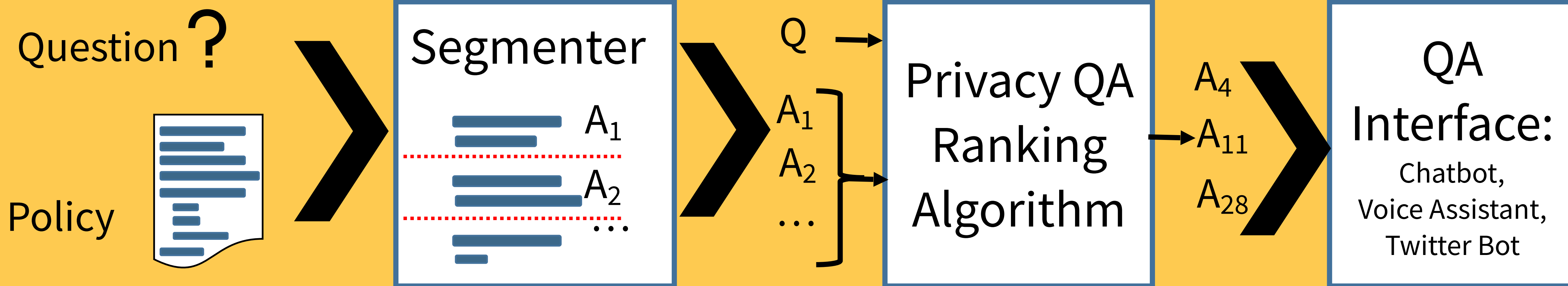
# Automated QA Approach



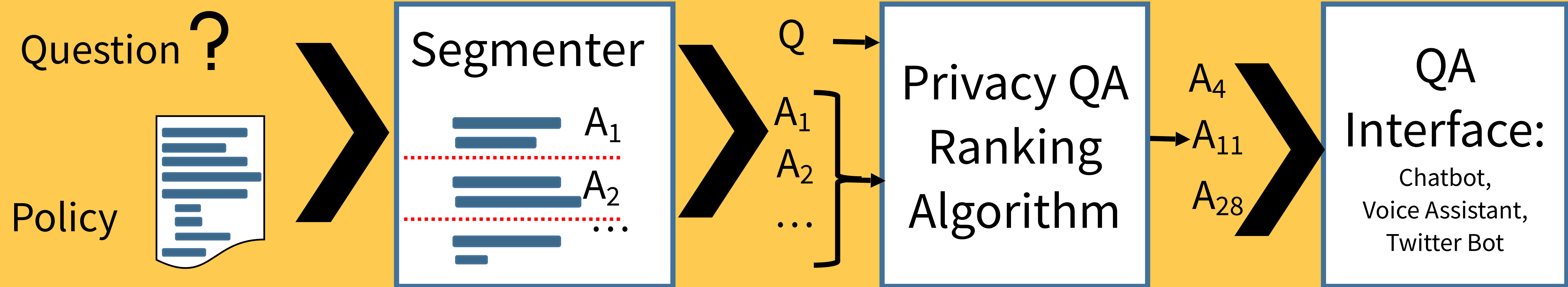
# Automated QA Approach

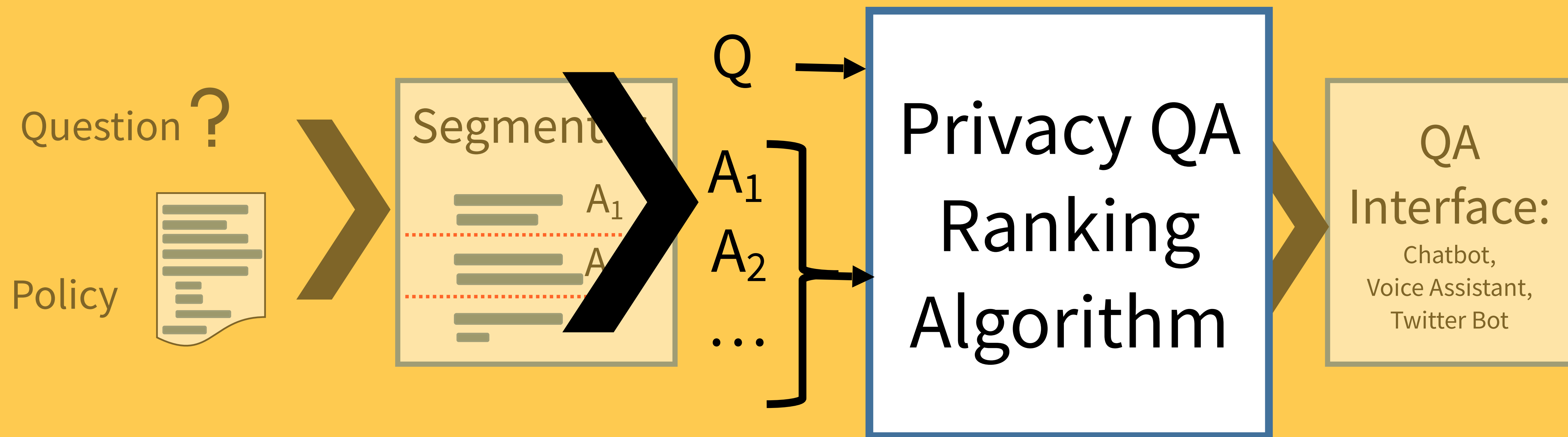


# Automated QA Approach









# Ranking Challenges

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**To whom do you expose my content?**

1. **User** wording is different from **policies** wording.
2. Difficulty of accounting for the **general topic**:
  - Is "content" about the third parties or the first party?

# Advantage of Word Embeddings

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Using a **general** embeddings, such as **GloVe** embeddings (Wikipedia14 + Gigaword 5), allows matching **words** in the **policies** to **words** used by **users**.

Neural Networks feed on labelled data..



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How to get such data?

Neural Networks feed on labelled data..

How to get such data?

We don't have QA data.

Neural Networks feed on labelled data..

How to get such data?

We don't have QA data.

Can we survive with classification data?

# Online Privacy Policies Dataset (OPP)\*

You can modify information you have given us. To correct or delete information or update account settings, log into your account and follow the instructions. We make changes as soon as we can. This information may stay in our backup files. If we cannot make the changes you want, we will let you know and explain why. If you contact us requesting access to your information, we will respond within 30 days.

You can control cookies and tracking tools. To learn how to manage how we - and our vendors - use cookies and other tracking tools, please click here.

User Access,  
Edit & Deletion

Access Type:  
Edit Information

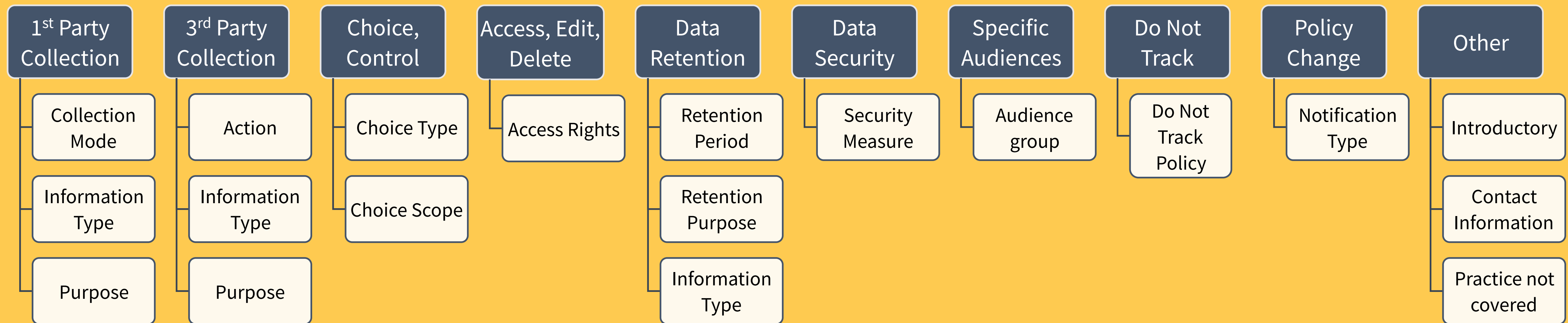
Expert  
Annotations



\*Wilson et al., ACL 2016; [usableprivacy.org/data](https://usableprivacy.org/data)

# Online Privacy Policies Dataset

- 115 annotated policies
- 23K annotations



# Ranking Challenges

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# Twitter Evaluation Dataset

- Search for unbiased keywords in replies:
  - e.g.,: "check our privacy policy"
- Backtrack company replies to questions

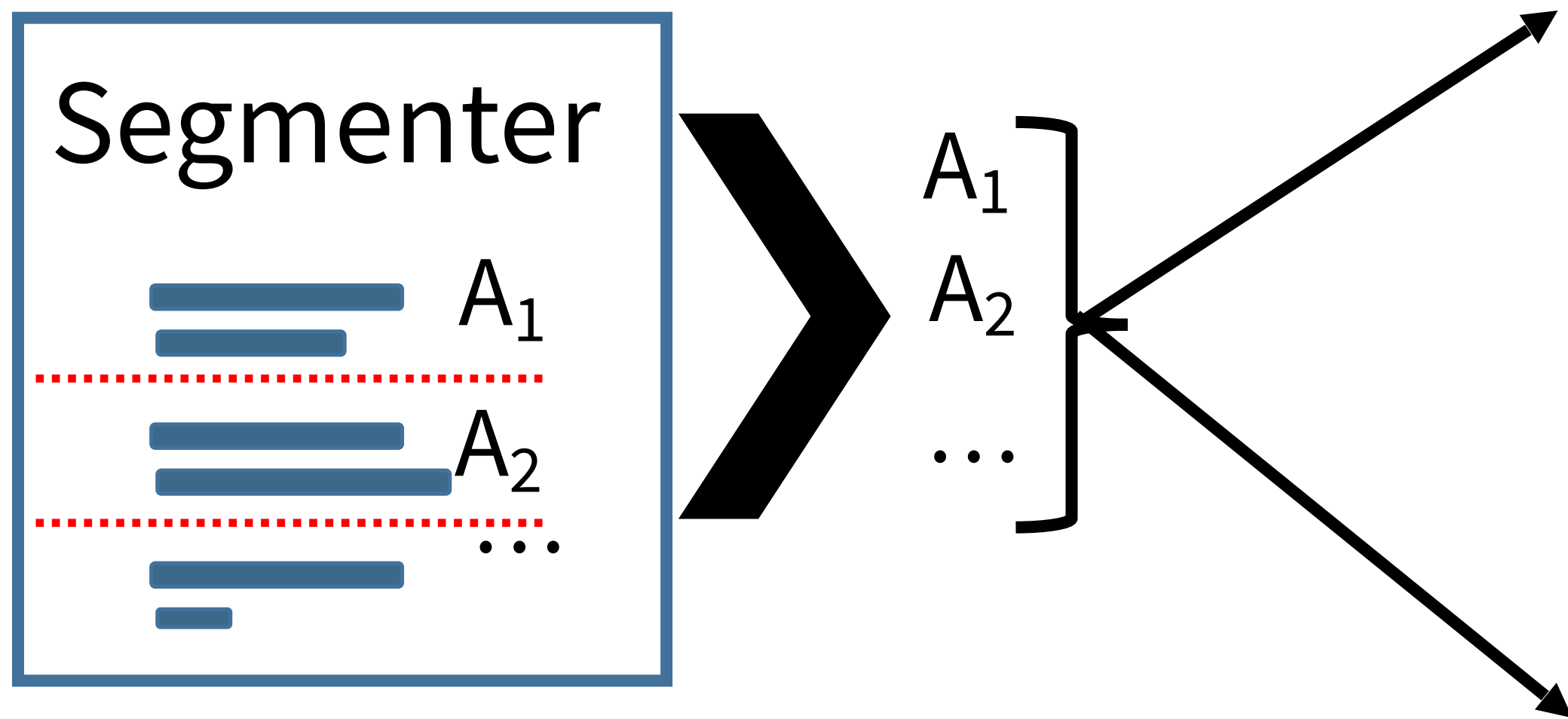


# Evaluation

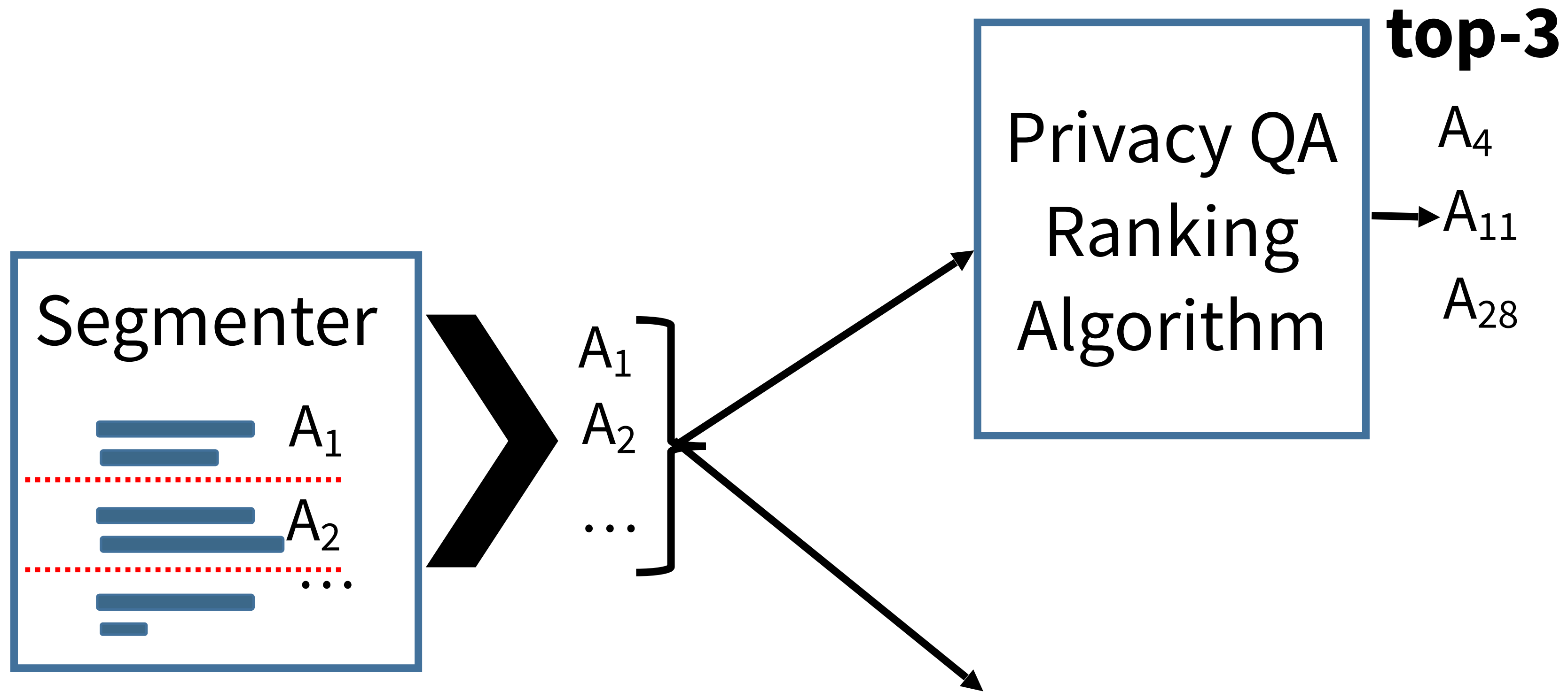
- Predictive Accuracy
- User-perceived Utility

# Predictive Accuracy

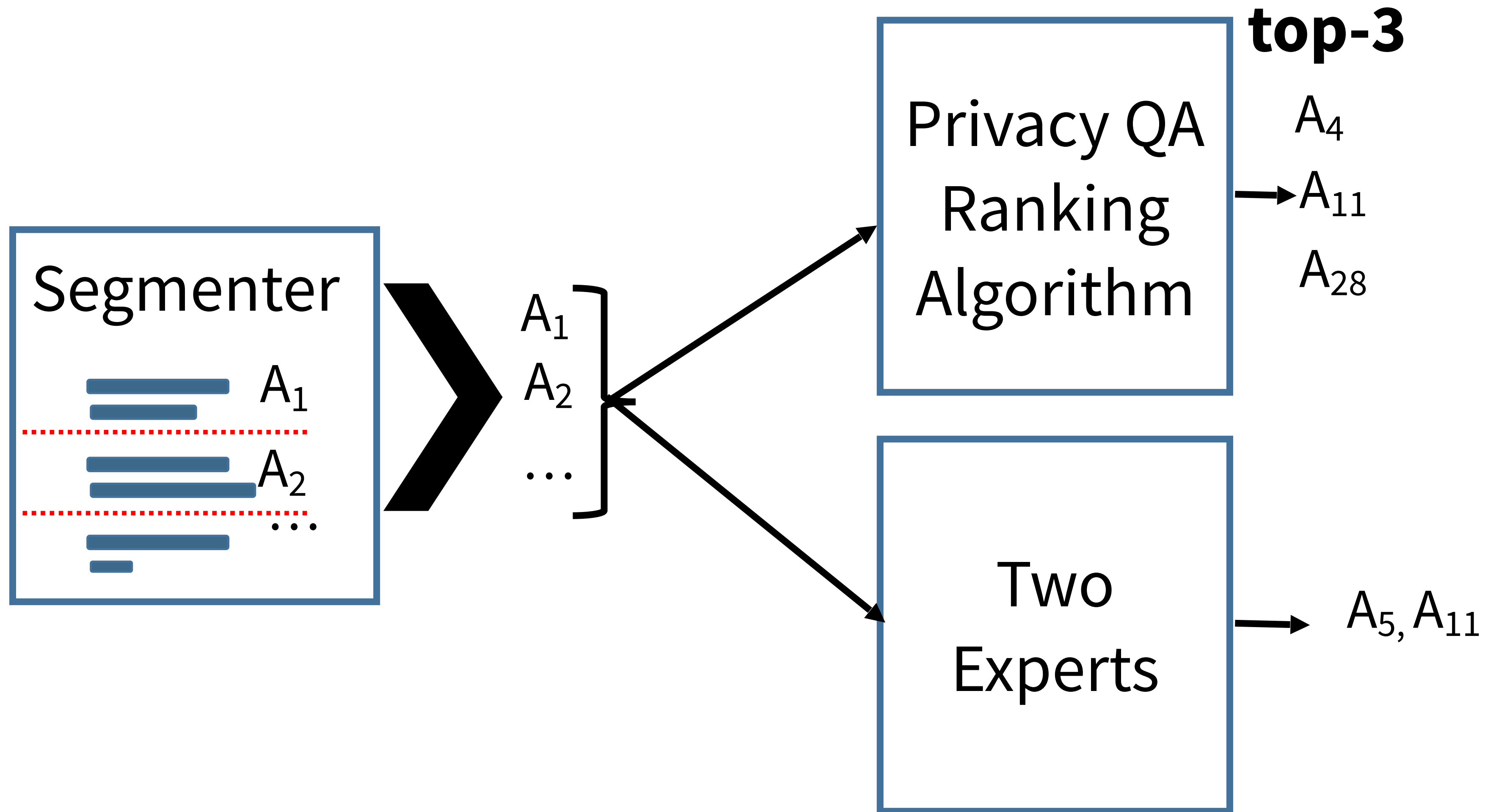
# Predictive Accuracy



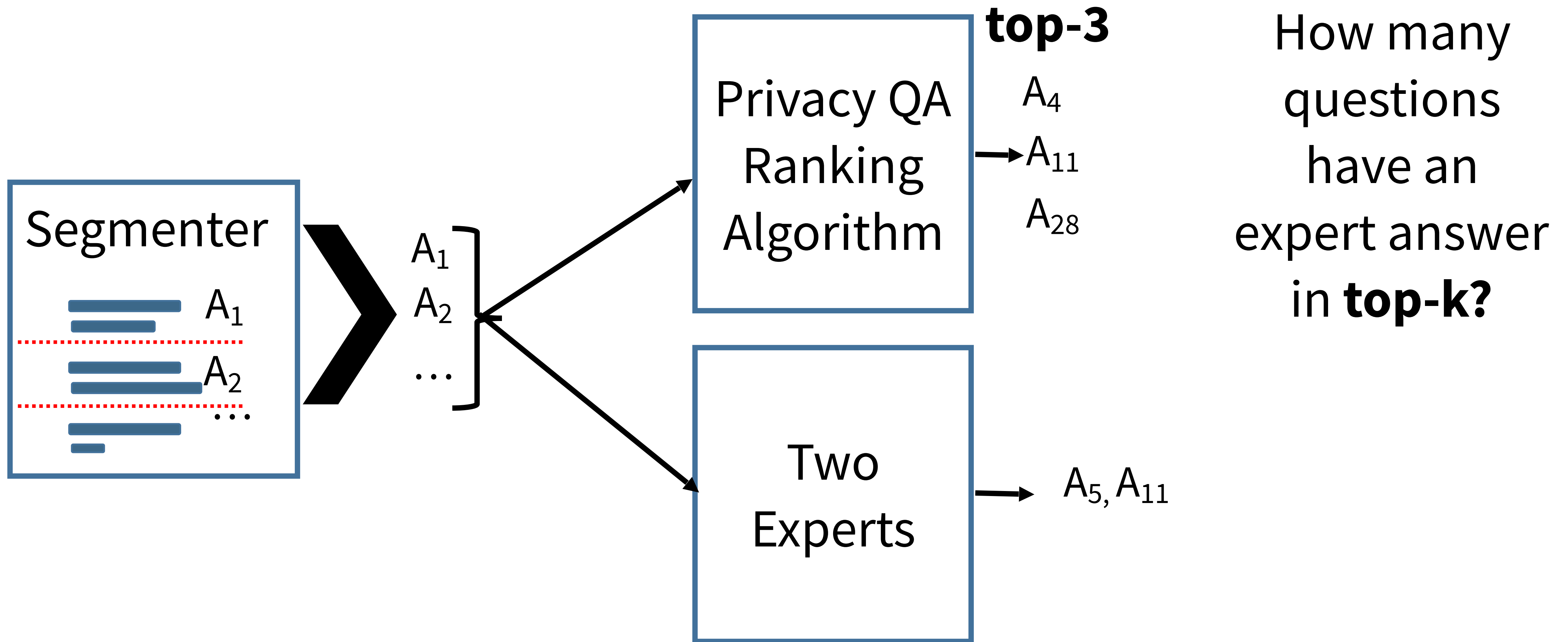
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# User-Perceived Utility

- Methodology
  - Between subject study with 4 groups

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- 1186 participants from MTurk (15 QA pairs per user)

# **UX: A Key to Chatbots' Success**

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- Not everything has to be DL-based:
  - DL for the core functionality
  - External framework for managing interactions

# Take-aways



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- **Solution: PriBot**
  - Answers, **automatically**, user free-form question from policies
  - Provides answers that have high accuracy and relevance in real-time

# Take-aways

- Limited-UI devices and hands-free interactions
  - Traditional privacy notice delivery methods do not apply
- **Solution: PriBot**
  - Answers, **automatically**, user free-form question from policies
  - Provides answers that have high accuracy and relevance in real-time
- Applications:
  - Compare privacy practices of different companies
  - Use for privacy-related customer service



Questions/Feedback? ...

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