



# Researching the moment of truth

**An experiment comparing in-the-moment and conventional surveys to investigate online job applications.**

*ESRA 2023 Conference*

**CARLOS OCHOA** | Research and Expertise Centre for Survey Methodology (RECSM – UPF)



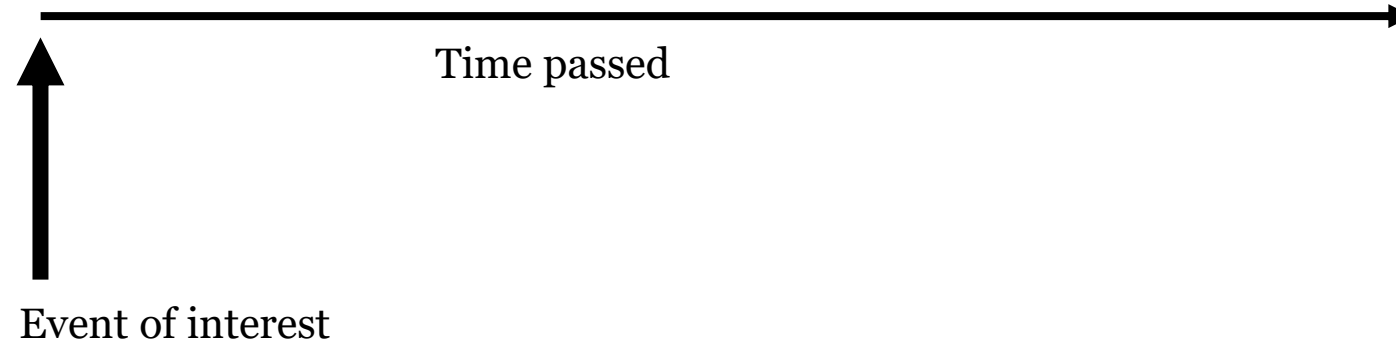
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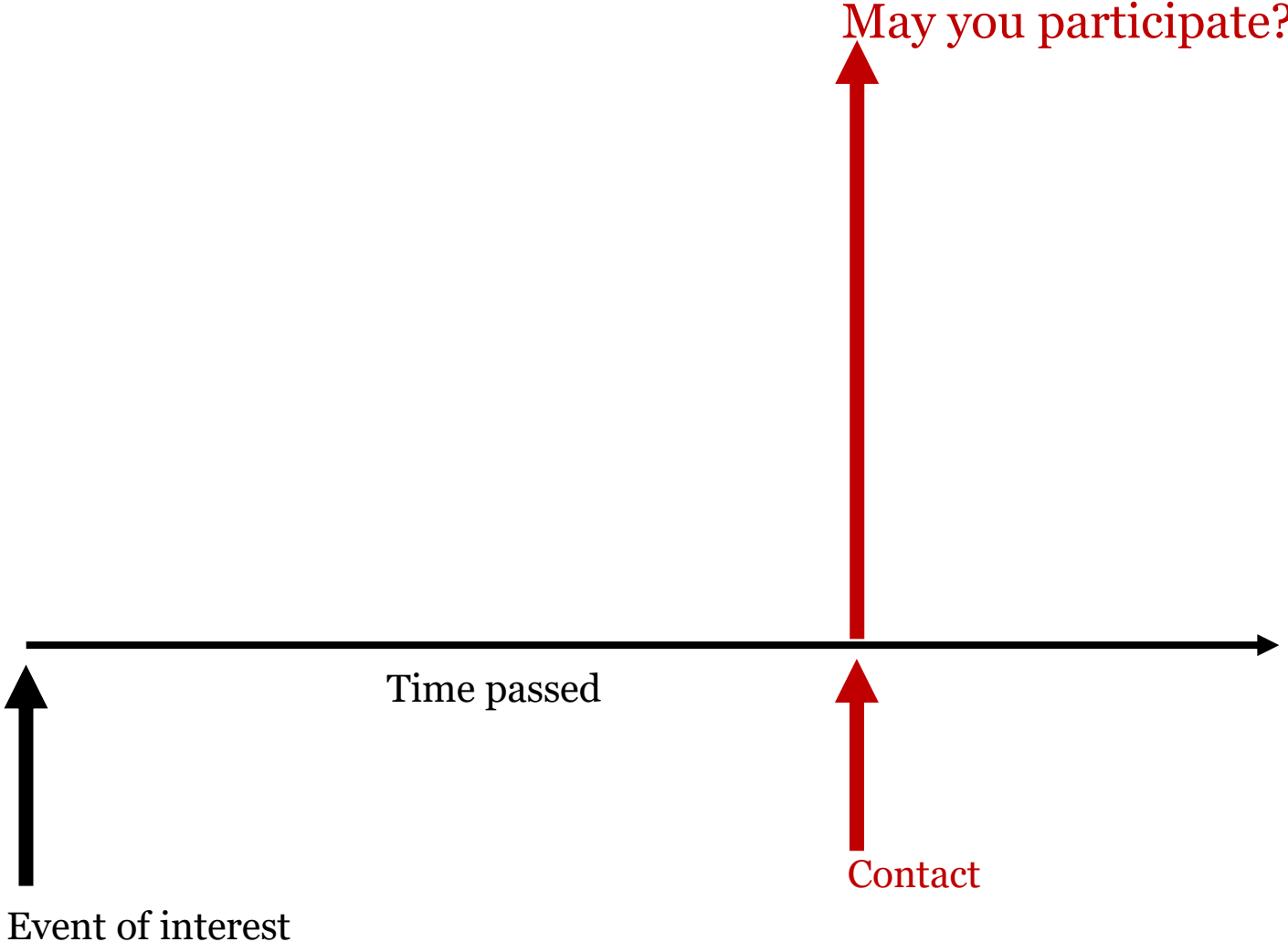
*Thanks to Melanie Revilla for her guidance and invaluable feedback throughout this research.*

*This project has received funding from the European Research Council (ERC) under the European Union's Horizon 2020 research and innovation programme (grant agreement No849165), PI: Melanie Revilla.*

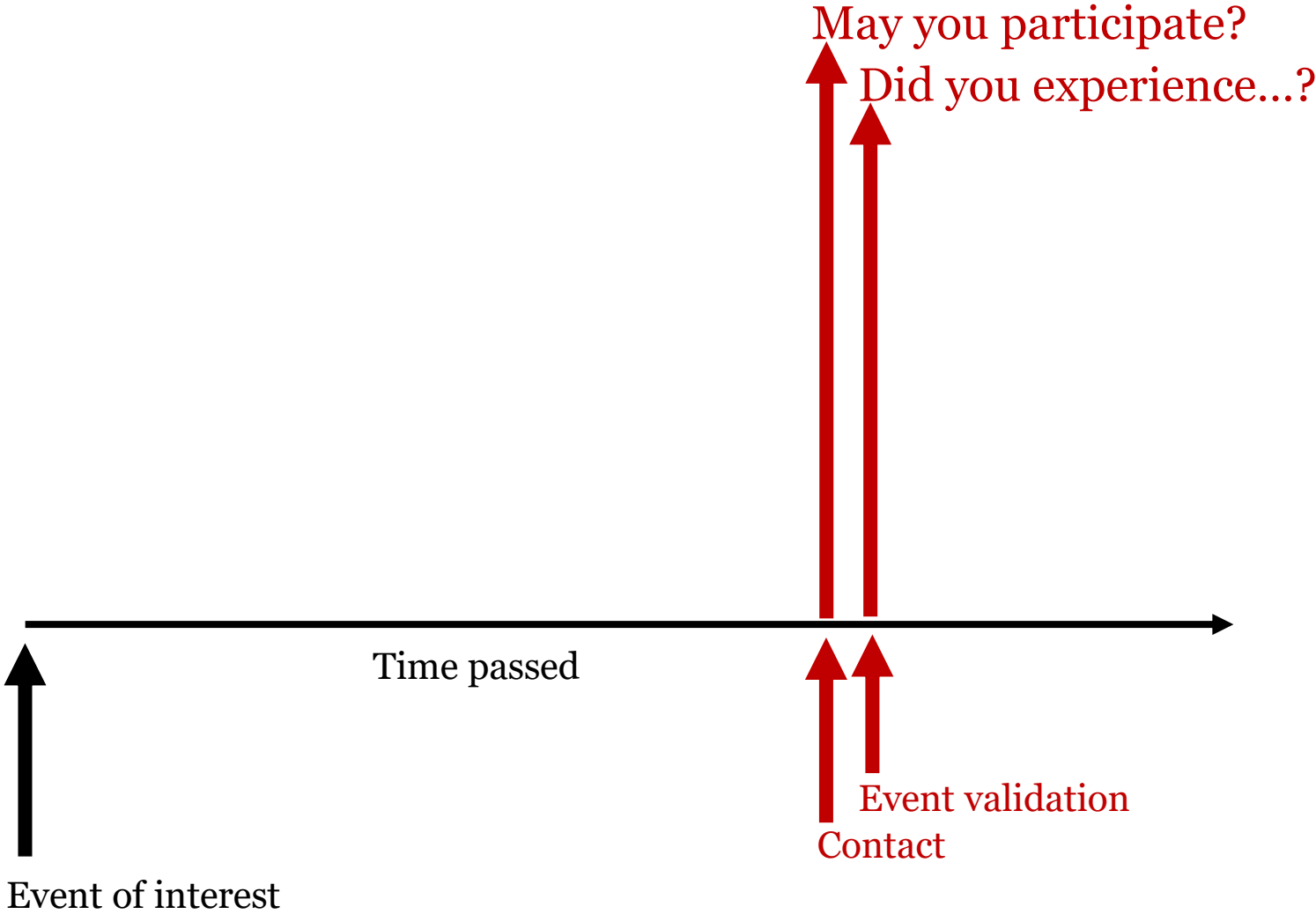
# In-the-moment vs conventional surveys



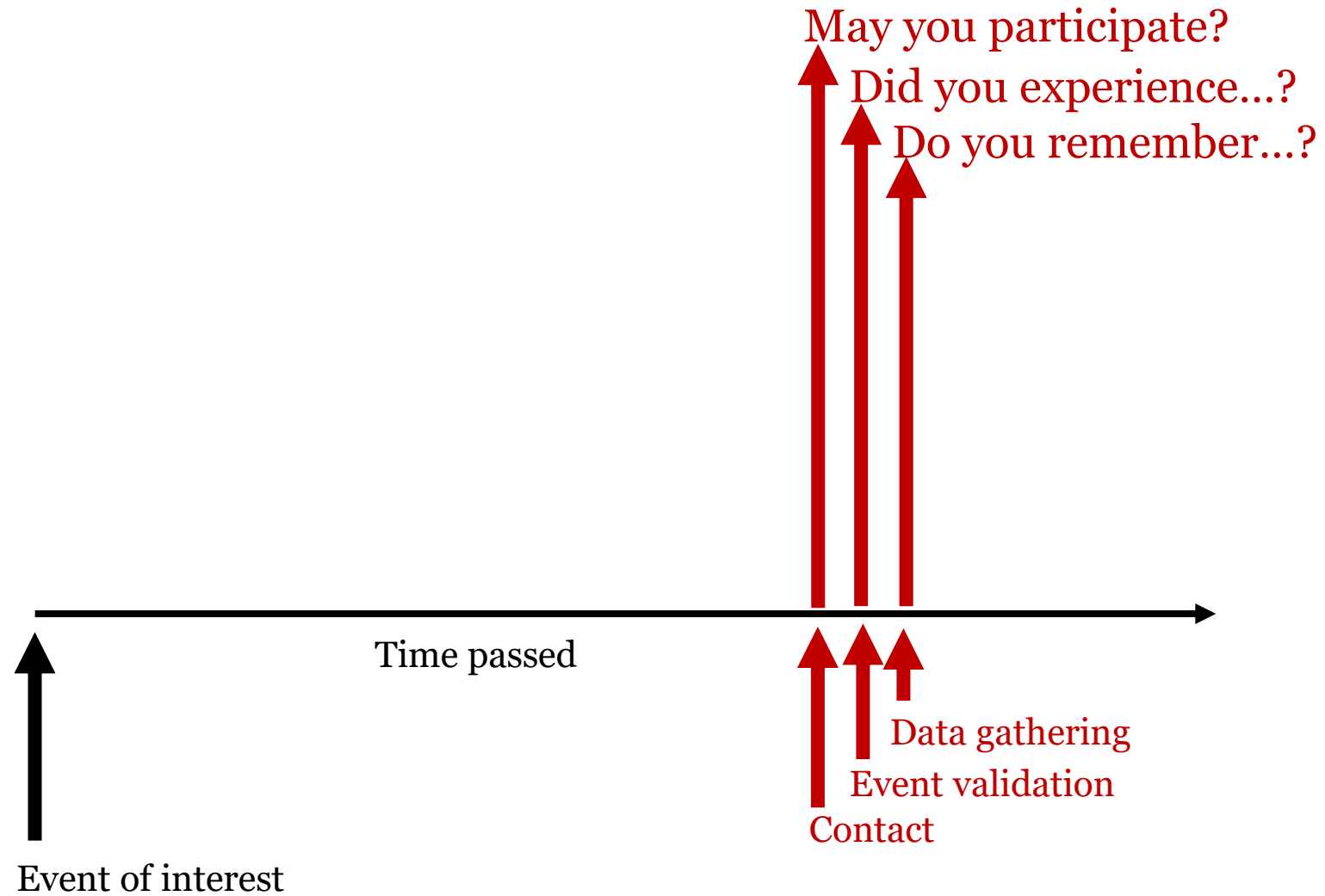
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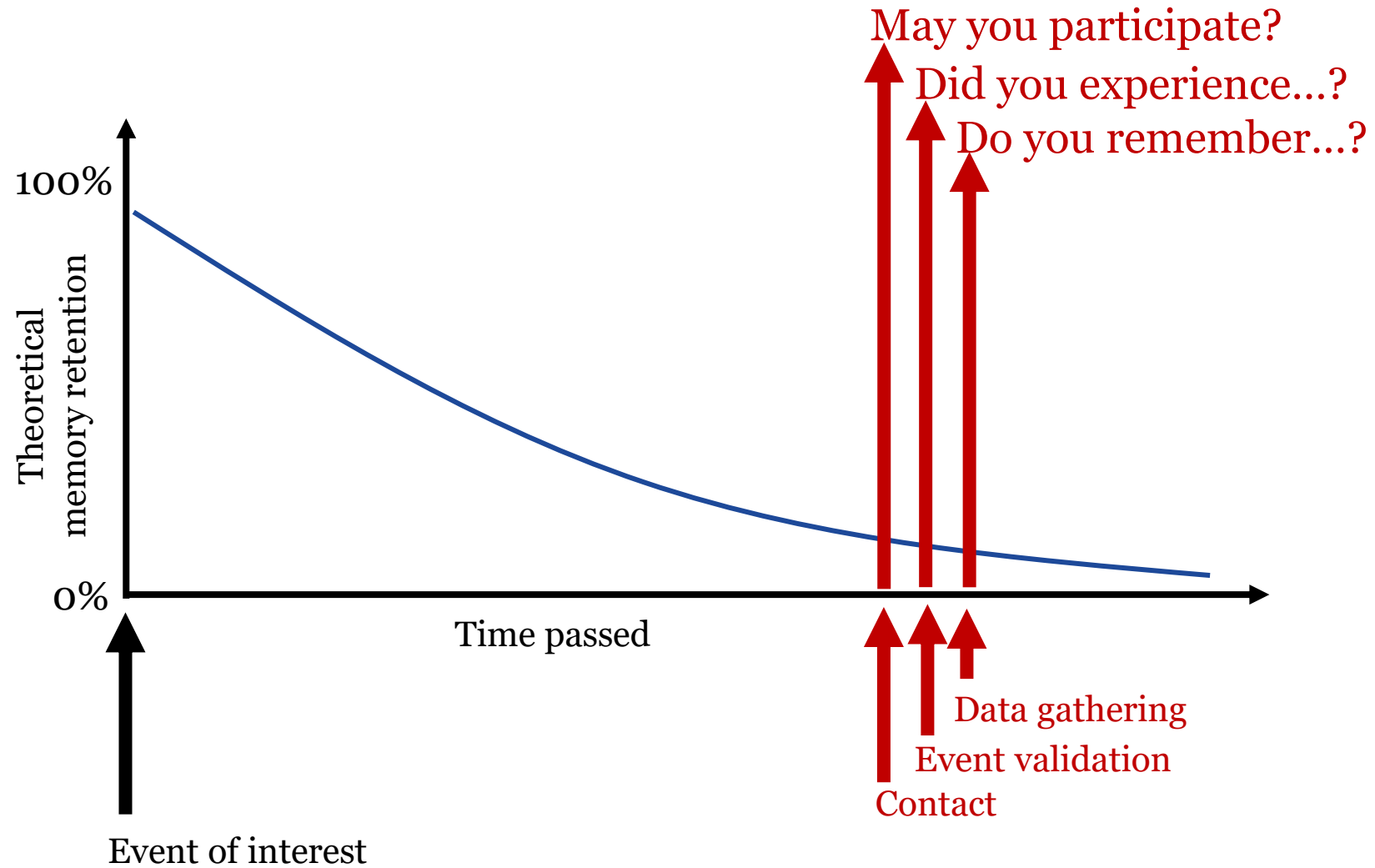
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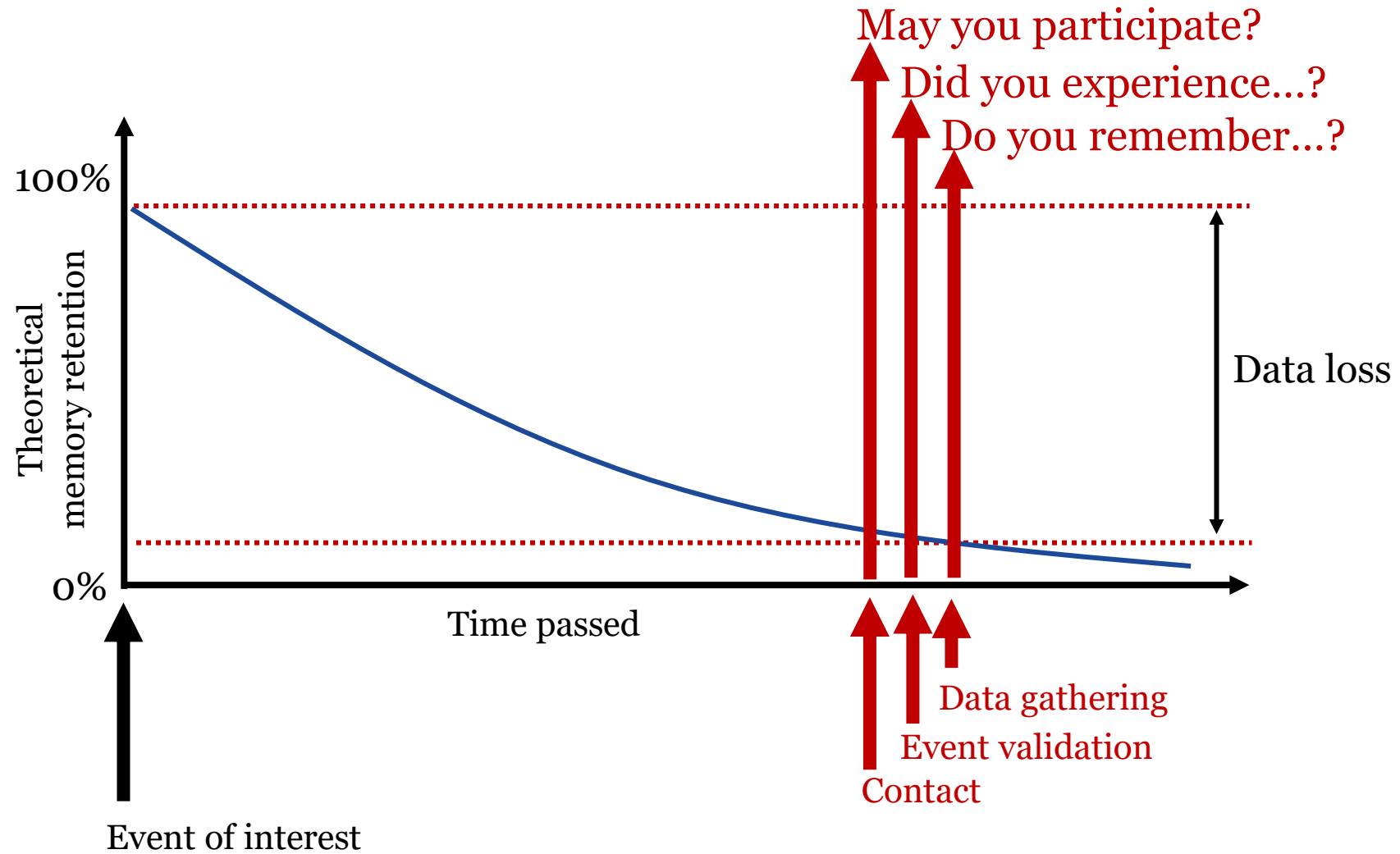
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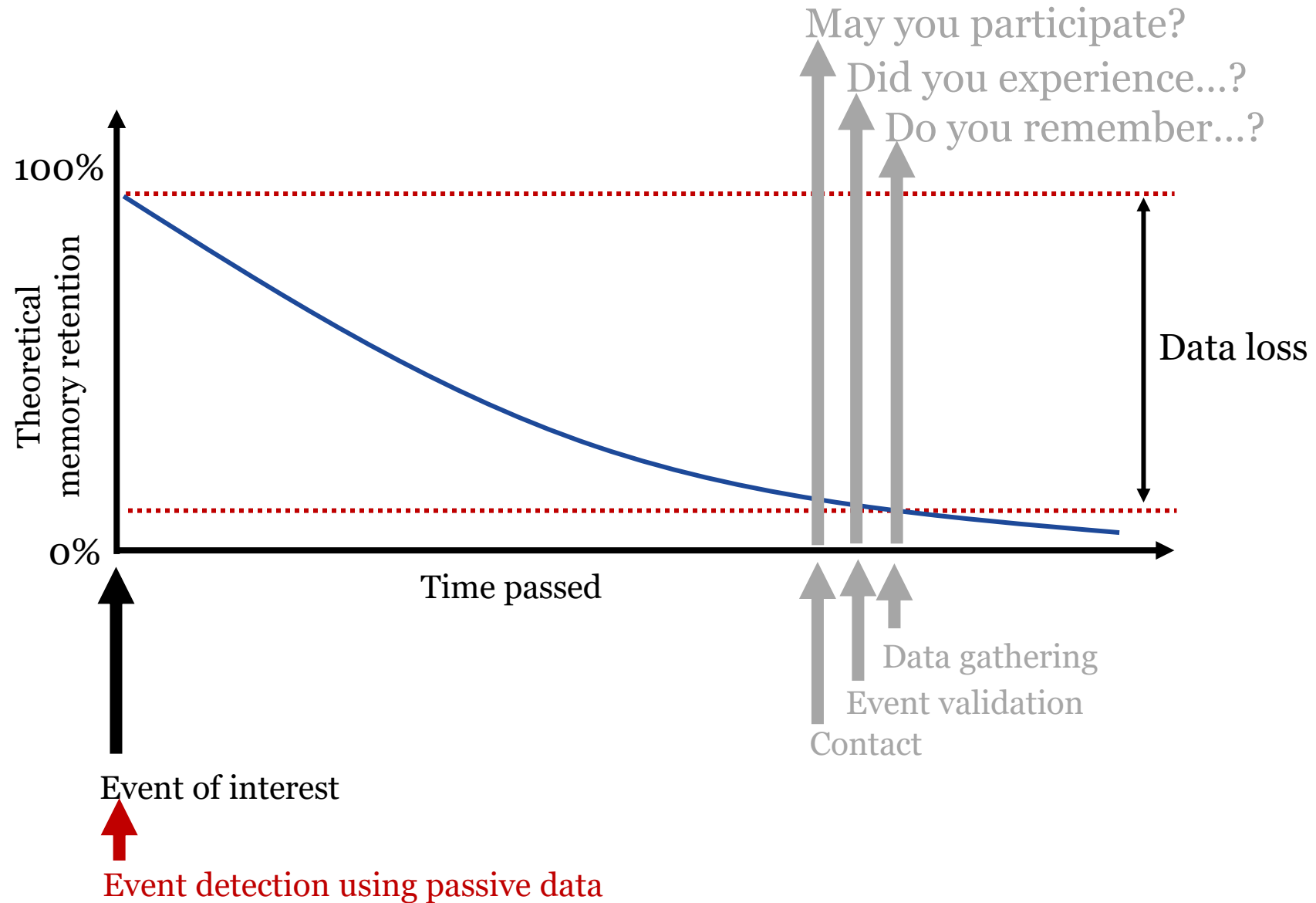
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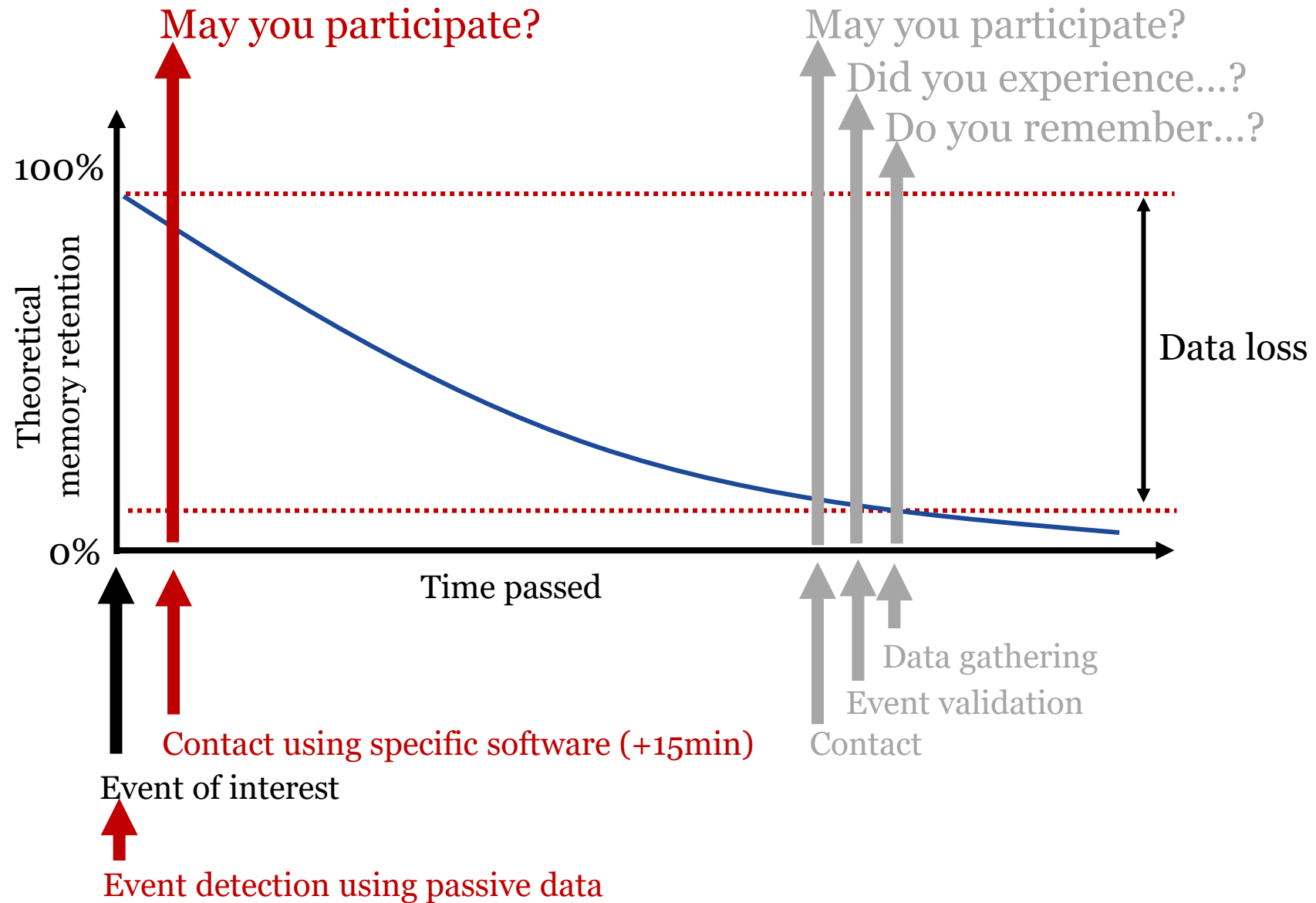


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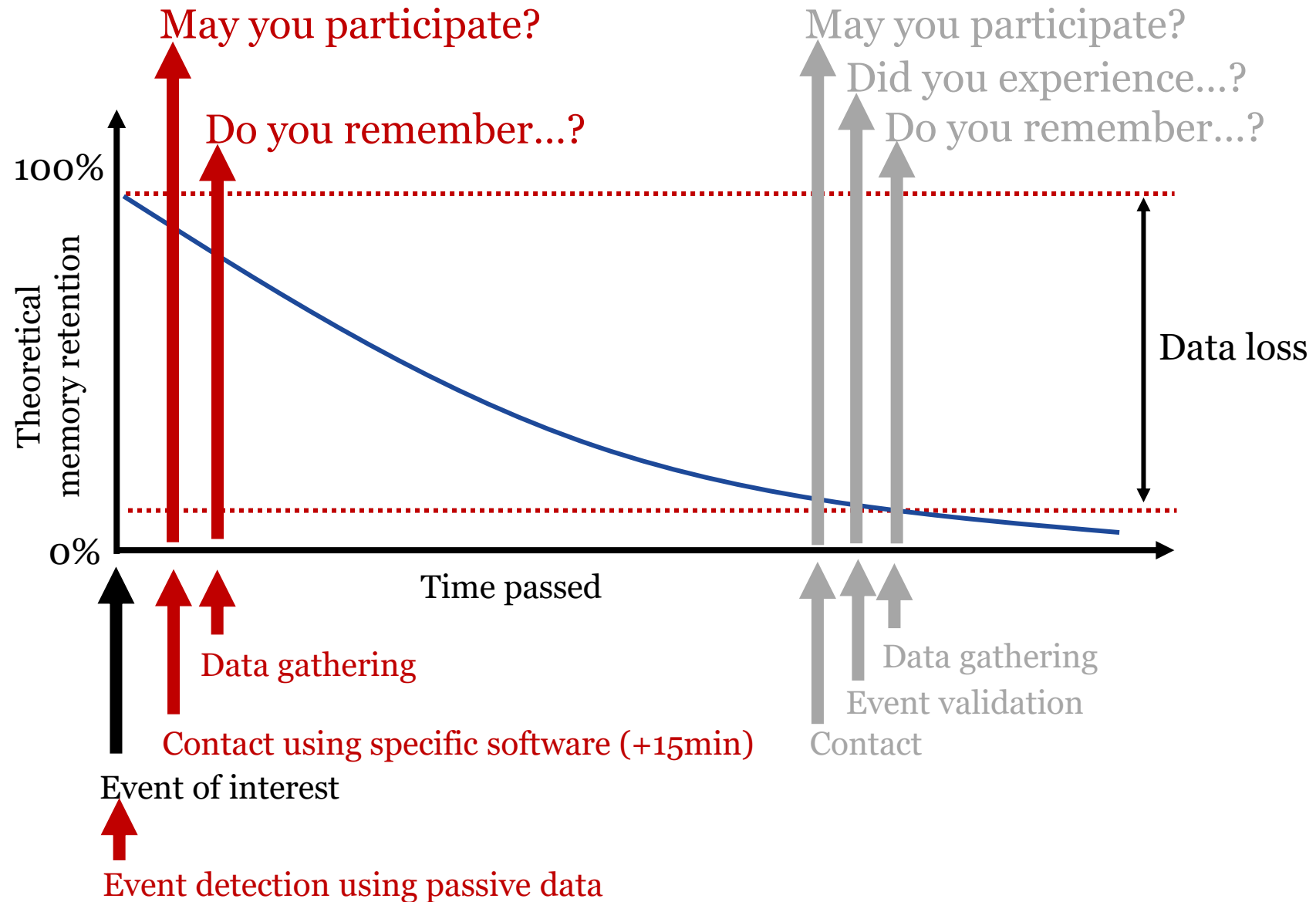




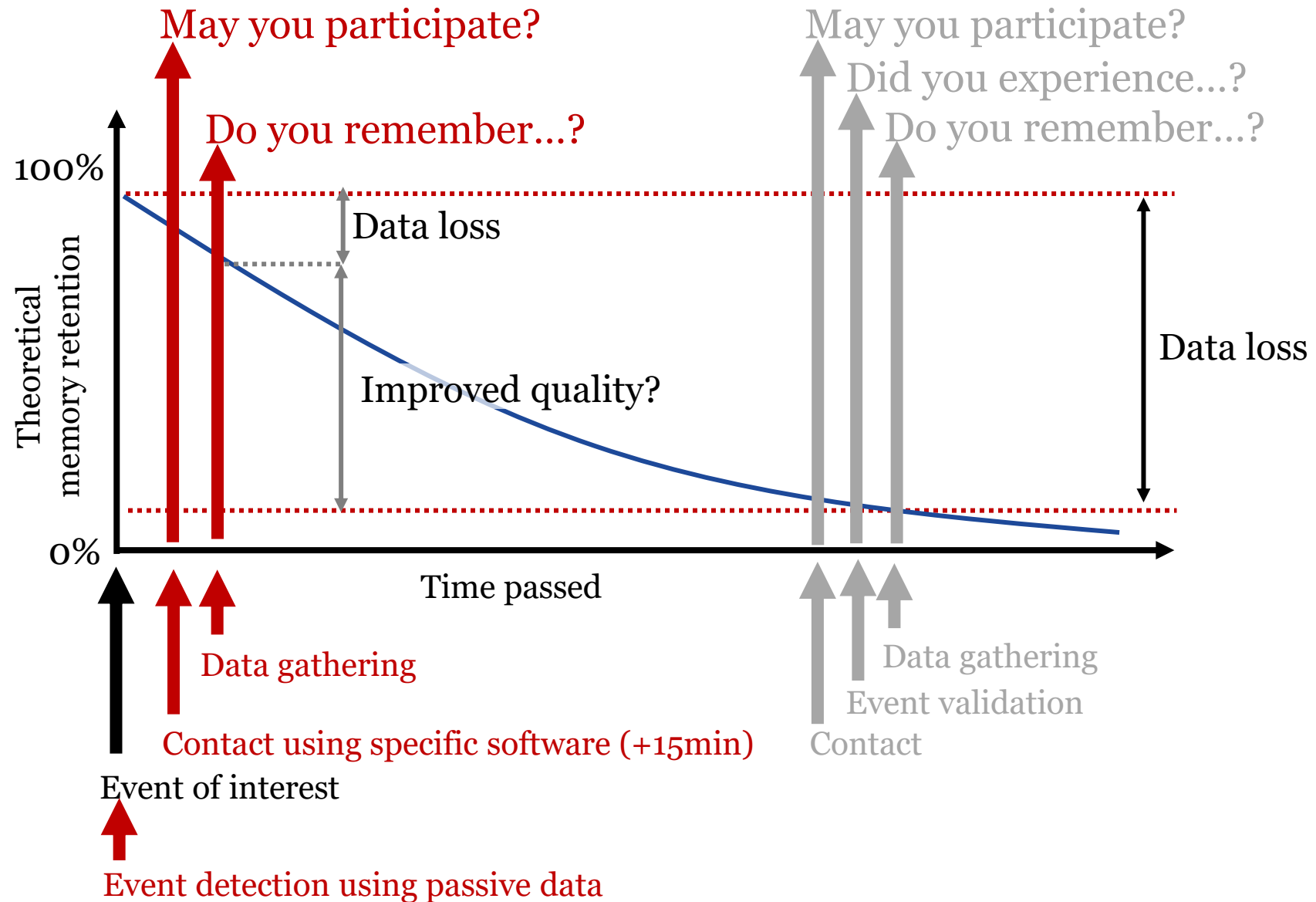
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# Memory errors

## Major classes of memory problems (Tourangeau, 2000):

### 1. Non-encoding

*We may never form a representation of an event in our memory*

### 2. Post-encoding errors

*Errors introduced after the original encoding.*

### 3. Retrieval failures

*We cannot remember the information that is there.*

### 4. Reconstruction errors

*We fill in missing details based on our general knowledge.*

## Several factors increasing the chances of suffering memory errors:

- + Many events of the same category (e.g., supermarket visits)
- + Low distinctiveness
- + Low emotional impact
- + Short duration
- + Non-rehearsal (time spent thinking or talking about the event).

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**+TIME!**

# Background and past experiences

## What we know about in-the-moment surveys triggered by metered data:

- **High theoretical willingness to participate** among metered panelists (69% to 95%) (Ochoa and Revilla, 2022).
- **But very limited experimental research:** one past study focused on flight purchasers; only 18 participants due to technological and operational issues (Revilla and Ochoa, 2018).

## Other related methods:

- **Ecological Momentary Assessment (EMA)** studies people's thoughts and behavior by repeatedly collecting data close to the time they engage in those behaviors. However, in-the-moment surveys focus on detecting events through passive data.

**Assessing the feasibility and potential benefits and drawbacks of in-the-moment surveys triggered by metered data.**

Contribution:

**Offer guidance** on the utilization of in-the-moment surveys to research substantive problems that are particularly susceptible to memory errors and **identify the primary operational and technological limitations** encountered when implementing an actual project for defining future advancements.

# Research questions and hypothesis

**RQ1.** Level of participation?

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## **RQ3.** Data Quality?

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## **RQ4.** Different substantive results?

- *H4. Different results for questions related to the event of interest.*

# The experiment

- **Topic:** how people decide to apply for a job (e.g., do males apply more than females when they do not meet the job position requirements?).
- **Methods:** in-the-moment (ITM) survey vs. conventional survey.
- **Triggering event (ITM):** people applying for a job online.
- **Questionnaire:** same basic questionnaire (71 questions) with the required adaptations for each method.
- **Sample source:** Opt-in online panel in Spain (Netquest).
- **Sample target:** 200 job applicants x 2 groups.

## Conventional group

N=**200** (completed)

- 160 non-metered + 40 metered

Data collected in **5 days** between

- 30<sup>th</sup> of May 2023
- 4<sup>th</sup> of June 2023

Median questionnaire length: **8.6 min**

Median delay event-survey: **23.6 days\***

*\* self-reported by participants*

## ITM group

N=**132** (in progress)

- All of them “metered”

Data collected (so far) in **91 days** between

- 10<sup>th</sup> of March 2023
- -

Median questionnaire length: **9.5 min**

Median delay event-survey: **1.1 hours\***

*\* measured using metered data*

# Preliminary results

*(incomplete fieldword)*

# Results (I): level of participation

	ITM		Conventional	
	n	%*	n	%*
Invited	235		2,080	
Starts	192	81.7%	1,317	63.3%
<b>Dropouts</b>	1	0.5%	83	6.3%
Non-consent	3	1.6%	58	4.4%
Filtered	56	29.2%	964	73.2%
<i>Not searching Jobs in last 48h / 6 months</i>	17	30.4%	791	82.1%
<i>Not confirming last search / -</i>	9	16.1%	-	
<i>Not applying to the detected job / any job</i>	30	53.6%	173	17.9%
Complete	132	68.8%	201	15.3%
Survey closed	0	0%	132	6.3%

\* Percentages are calculated with respect to the preceding category (indicated by the indentation)

The **dropout rate** is significantly lower for ITM, even when controlling for having installed the meter:

- Conventional+Non-Metered: 6.8%
- Conventional+Metered: 4.5%
- ITM: 0.5%

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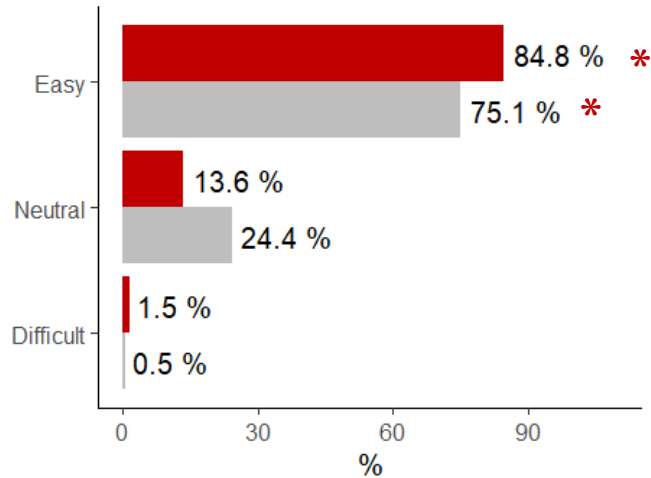
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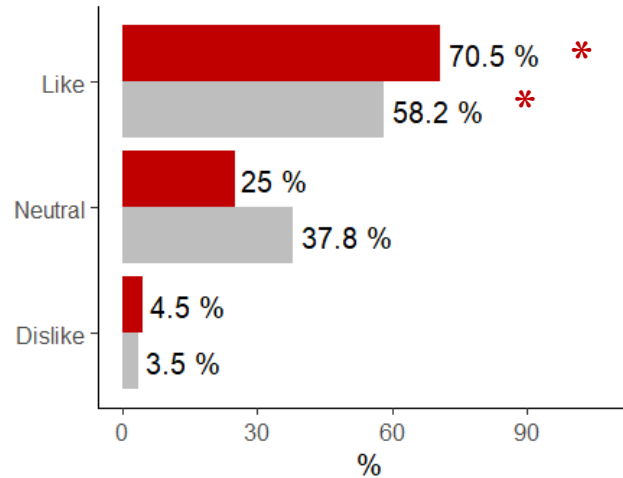
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# Results (II): survey evaluation

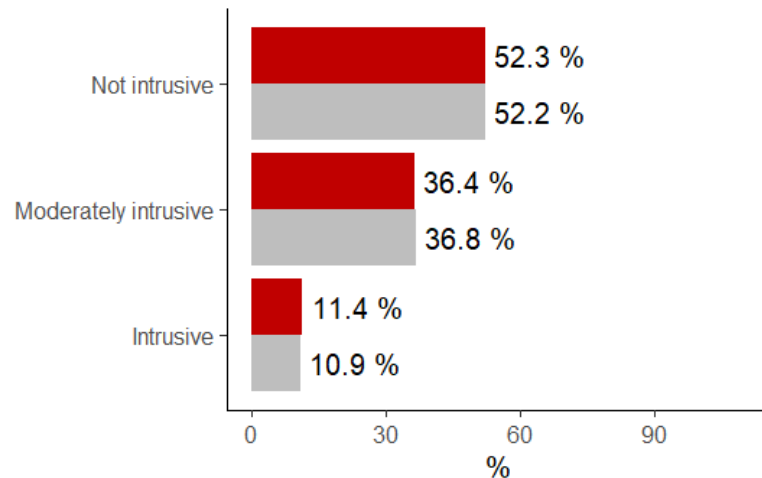
### Level of Ease/Difficulty



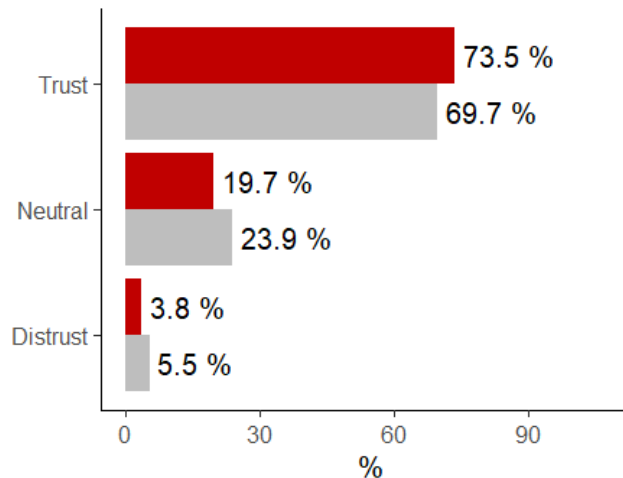
### Level of Liking/Disliking



### Perception of Intrusiveness



### Trust/distrust in survey anonymity

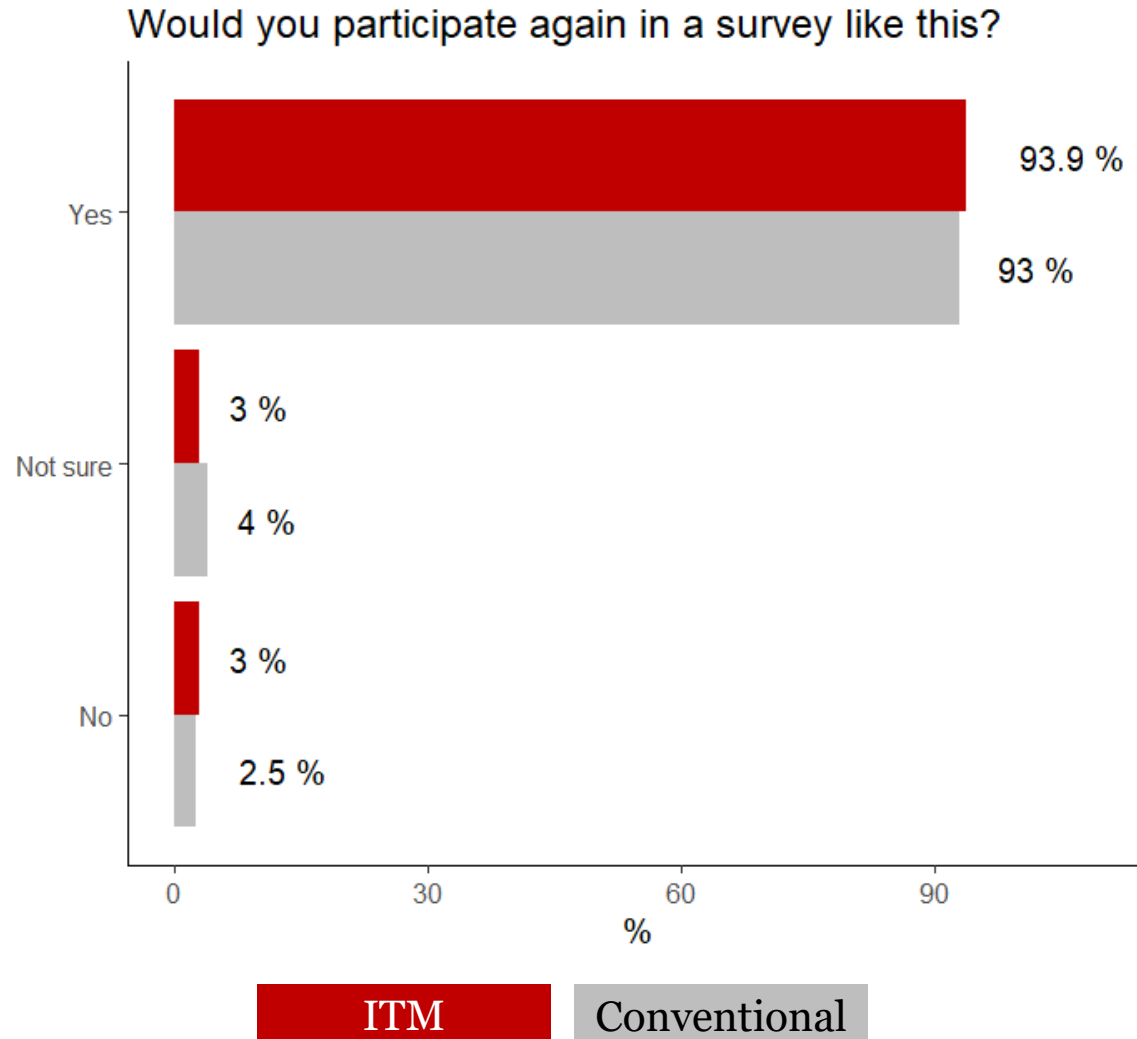


ITM

Conventional

- Significant higher levels of **liking and ease** for ITM even when controlling for sociodemographics.
- When controlling for having installed the “meter”, the positive effect remains but is not significant: metered panelists are more positive towards surveys in general?
- Similar levels of perceived intrusiveness and trust in survey anonymity.

# Results (II): survey evaluation



- Besides the observed differences, ITM surveys triggered by metered data does not seem to pose any challenge in terms of willingness to participate.
- Open answers to the final question do not mention any particular issue with this method, except one comment suspecting a relationship between the job search website and the online panel.

# Results (III): data quality

## Indicators used (num. of questions):

### 1. Explicit non-recall (22)

- Open questions (2)
- Explicit “Don’t know/Don’t remember” (18)
- “Don’t know” in questions that can be answered with passive data for ITM (2)

### 2. Length of answers to narrative open questions (4)

- Narrative open questions (4)

### 3. Straight-lining (2)

- Batteries of questions (2)

### 4. Invalid answers (not answering what was asked) (9)

- Open questions (9)

### 5. Inconsistencies (8)

- Numerical answers out of bounds (4)
- Inconsistencies across questions (e.g., more applications than offers) (3)
- Incorrect number of selected answers in multiple choice questions (1)

# Results (III): data quality

Indicators	Effect sizes of ITM	Without controls		With controls	
		Beneficial effects	Significant effects	Beneficial effects	Significant effects
Explicit non-recall	From -49.8pp to +5.4pp	16/22	3/22	12/22	3/22
Length of answers	From +41% to 52% longer	4/4	3/4	4/4	1/4
Straight-lining	From -1.8pp to -4.7pp	2/2	0/2	2/2	0/2
Invalid answers	From -1pp to -13pp	9/9	1/9	6/9	0/9
Inconsistencies	From +0.6pp to +6.8pp	0/8	0/8	1/8	0/8

- ITM surveys seem to have a beneficial effect on:
  - Non-recall (moderate).
  - Length of answers to narrative open questions (strong).
  - Straight-lining (moderate)
  - Invalid answers (moderate)
- Effects are partially explained by being a “metered” panelist.
- Some effects may become significant with a larger sample (end of the fieldwork?).

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# Results (IV): different results

## **We shouldn't find differences for ... (not affected by memory effects)**

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- Personality traits
  - Conformity
  - Efficacy

## **We may find differences for ... (potentially affected by memory effects)**

- % of met requirement
- % of non-compliers (apply without meeting all requirements)
- % of features that fit
- % of non-fitters (apply despite not all features fit)
- % of applications without meeting requirements in the last 6 months
- % of applications with features that did not fit in the last 6 months
- Probability of being interviewed
- Probability of being hired

# Results (IV): different results

**We don't expect differences ...**  
(not affected by memory effects)

				p-value	
	Conv	ITM	Diff.	No control	Control
Conformity	2.53	2.53	<0.01	0.99	0.38
Efficacy	3.87	3.83	-0.04	0.67	0.27

**We may find differences ...**  
(potentially affected by memory effects)

				p-value	
	Conv	ITM	Diff.	No control	Control
<b>Met requirement</b>	<b>84.0%</b>	<b>76.2%</b>	<b>-7.78</b>	<b>&lt;0.01</b>	<b>0.03</b>
<b>Non-compliers</b>	<b>62.3%</b>	<b>81.0%</b>	<b>+18.7</b>	<b>&lt;0.01</b>	<b>0.02</b>
Features that fit	76.9%	73.1%	-3.8	0.13	0.64
Non-fitters	81.6%	84.5%	+2.9	0.63	0.94
% Applications without all requirements, last 6m.	46.3%	51.7%	+5.4	0.35	0.10
% Applications without perfect fit, last 6m.	48.4%	42.0%	-6.5	0.28	0.36
<b>Prob. of interview</b>	<b>55.6%</b>	<b>46.6%</b>	<b>-9.0</b>	<b>&lt;0.01</b>	<b>0.11</b>
<b>Prob. of hiring</b>	<b>48.3%</b>	<b>39.8%</b>	<b>-8.5</b>	<b>&lt;0.01</b>	<b>0.07</b>

- The effect sizes for time-independent variables are almost null and non-significant.
- Variables related to the event of interest exhibit larger effects, with some cases reaching significance (not all when controlling for sociodemographics + meter).

## ITM surveys...

1. ... are **well-received** by metered panelists, with high participation rates and willingness to participate again.
2. ... suggest **beneficial effects** on data quality, including reduced non-recall, and longer and more meaningful answers to narrative open questions. Most of the effects are a **combination of method and selection effects**.
3. ... present **significant changes in both substantive answers** (e.g., meeting requirements, probability of being hired).
4. ... **continue to pose challenges**; some of them are inherent to the method (**extended fieldwork periods**).

# Limitations and further research

## ... of this research

---

- **Limited sample size** due to availability of metered panelists:
  - Lack of statistical.
  - Difficulty to disentangle selection effects (meter) from method effects.
- Data from a **single panel** (Netquest) in just **one country** (Spain).

## Future developments:

- We could not measure unconscious non-recall (e.g., declared salary vs. published salary) → access **HTML content** (future research).

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## ... of the method

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- **Complex setup** (identification of websites and specific URLs, URLs may change over time ...)
- **False positives** (e.g., job applications with shared devices) and **false negatives** (e.g., job applications from non-shared devices and/or apps).

### Future developments:

- Detection of “hidden” URL” and in-app events.

# Thanks!

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<https://www.upf.edu/web/webdataopp>

# References

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