

Exploring Data-Driven Approaches to Stress Management:

A Systematic Review of Stress Tracking, Intervention, and System Evaluation Methods

Youngji Koh, Jeonghyun Kim, Kwangyoung Lee,
Yugyeong Jung, Hwajung Hong, Uichin Lee



The Rise of Stress Tracking Technologies



Wearables & smartphones **enable real-time stress tracking** in everyday life
Yet, **stress** is deeply **subjective** and **contextual**¹



Therefore, detection alone is insufficient
How detection-based interventions are designed matters for stress management

Fragmented Perspectives in Prior Work

Prior reviews focused on either...

Stress Detection^{1,2}



Stress Intervention^{3,4}



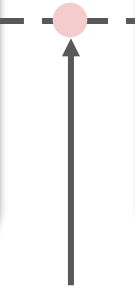
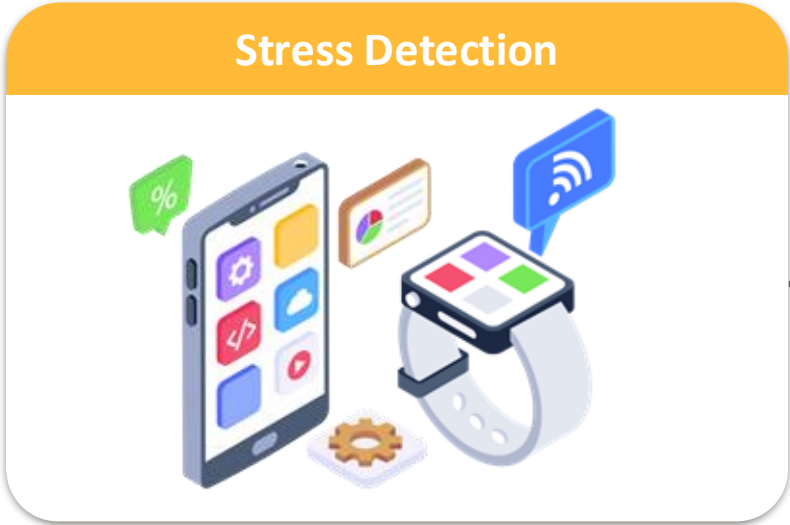
[1] Abd-Alrazaq, Alaa, et al. "The performance of wearable AI in detecting stress among students: systematic review and meta-analysis." *Journal of Medical Internet Research* 26 (2024).

[2] Nouman, Muhammad, et al. "Recent advances in contactless sensing technologies for mental health monitoring." *IEEE Internet of Things Journal* 9.1 (2021): 274-297.

[3] Regehr, Cheryl, Dylan Glancy, and Annabel Pitts. "Interventions to reduce stress in university students: A review and meta-analysis." *Journal of affective disorders* 148.1 (2013): 1-11.

[4] Lamontagne, Anthony D., et al. "A systematic review of the job-stress intervention evaluation literature, 1990–2005." *International journal of occupational and environmental health* 13.3 (2007): 268-280.

Fragmented Perspectives in Prior Work



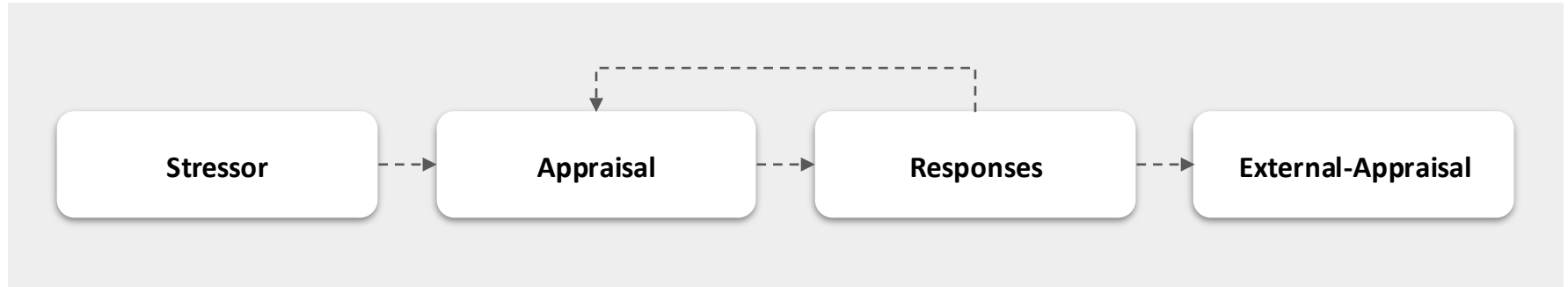
No prior reviews systematically examined *detection*, *intervention*, and *evaluation* from an integrated perspective

Understanding Stress: A Theoretical Lens

To build an integrated framework, we need to first ask:

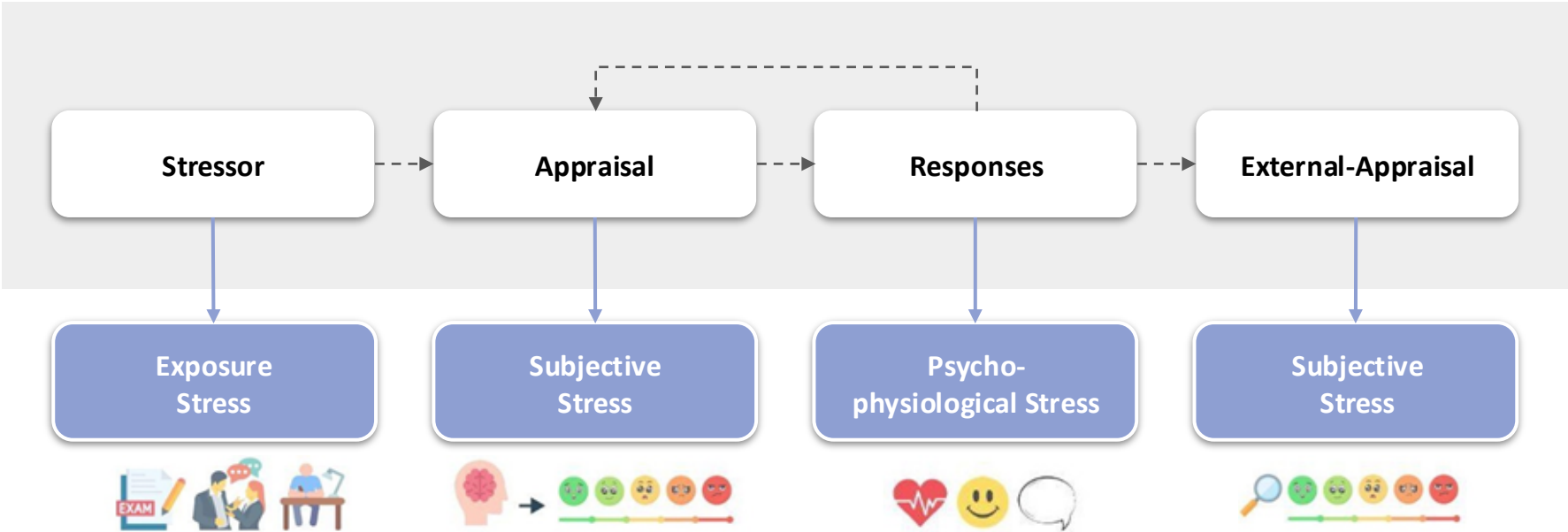
“How has stress been defined and operationalized across studies?”

→ We adopt **Lazarus and Folkman's transactional model**¹, which conceptualizes stress as a dynamic and contextual process



Understanding Stress: A Theoretical Lens

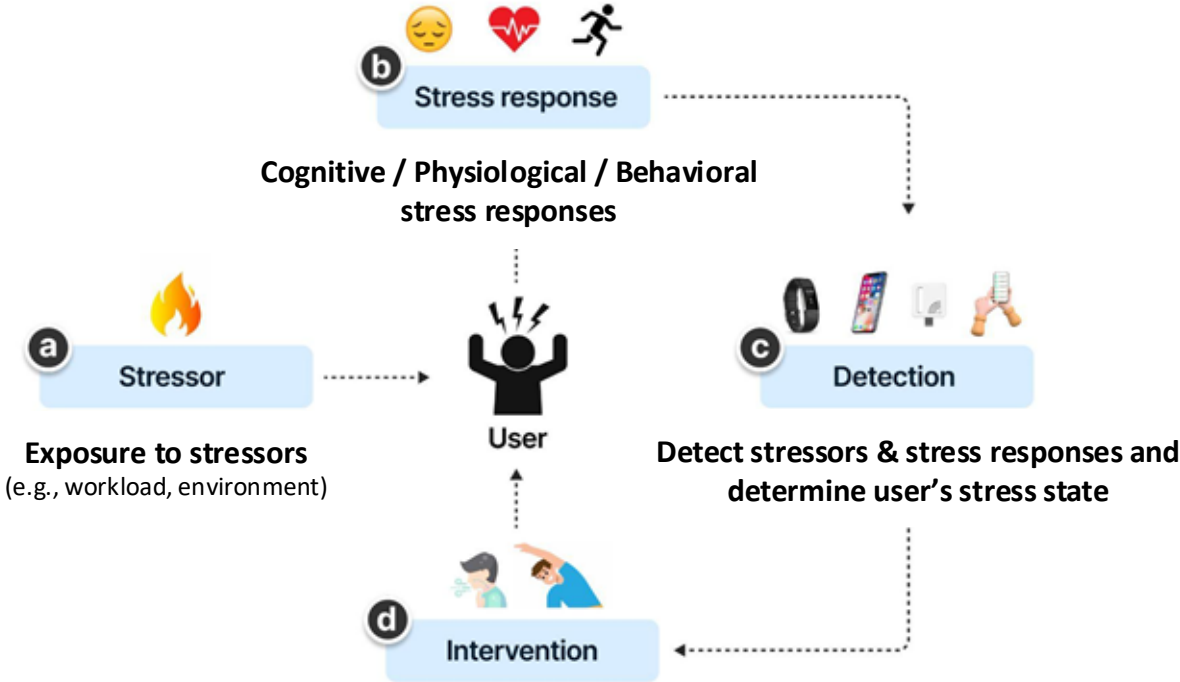
We use this model as a lens to categorize *how stress has been defined across prior HCI work:*



[1] Richard S Lazarus and Susan Folkman. 1984. Stress, appraisal, and coping. Springer publishing company.

From Theory to Stress Management Systems

How stress is defined determines *detection* and *intervention*:



Deliver varied interventions based on how stress is detected

Research Goal

**Examine how stress is defined, detected,
and linked to intervention and evaluation in an integrated way**

We set the following RQs:

RQ1. Tracking

How is **stress defined as an inference target**, and **what indicators** are used?

RQ2. Intervention

How are **these inferences connected to the design and timing** of interventions?

RQ3. Evaluation

How are **these stress management systems evaluated** in practice?

PRISMA Scoping Review

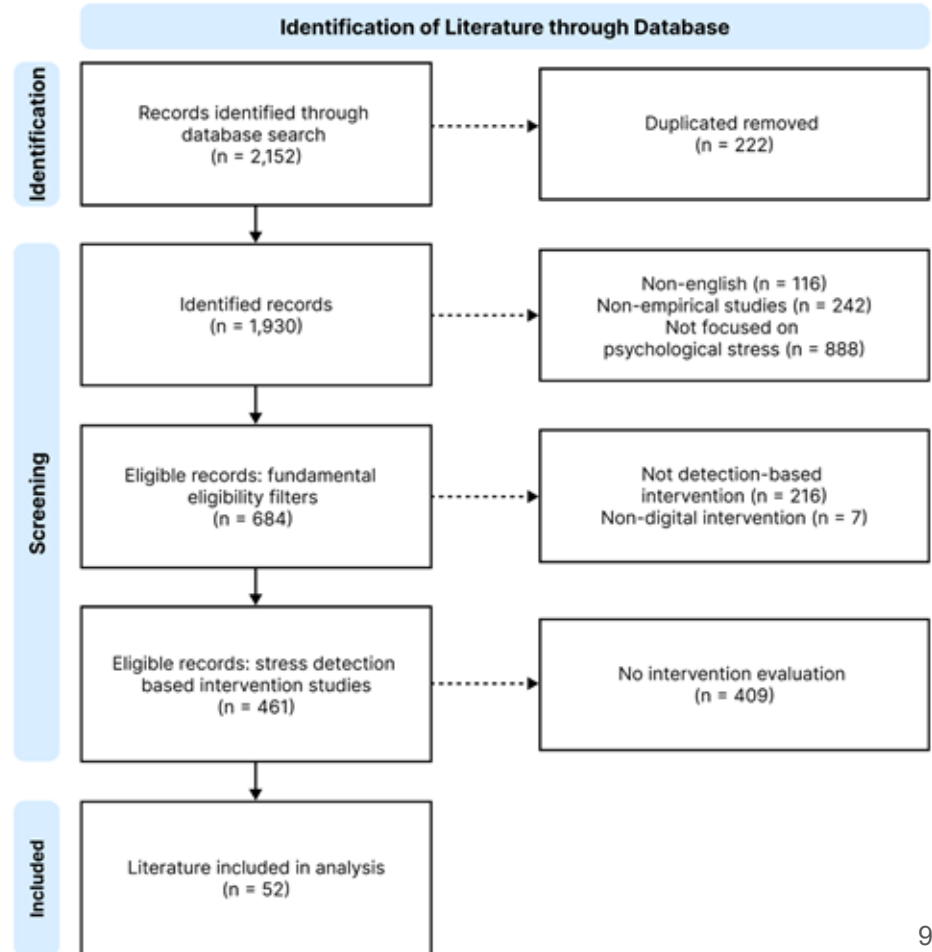
Systematic review of ACM, IEEE, and Web of Science databases

✓ Inclusion

- Digital intervention for stress
- Intervention informed by detection
- Includes user study / evaluation

Screened 2,152 papers

→ Included **52 empirical studies**



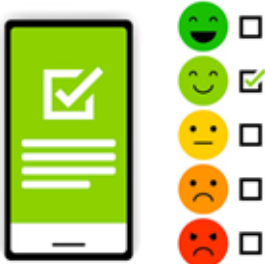
Findings for RQ1. How is Stress Defined?

Most studies targeted either **psycho-physiological** or **subjective stress**

⚠️ 49 out of 52 studies focused on a **single inference target** only



Psycho-Physiological Stress (N=22)



Subjective Stress (N=20)



Exposure Stress (N=7)

Findings for RQ1. How is Stress Measured?

Physiological signals were the most common detection indicator

Stress Indicators	Data Source	Raw Signals	Derived Features	# of Studies
Physiological Indicator	Wearable	ECG / PPG	Heart Rate, HRV	24
		EDA	Skin Conductance	15
		RESP	Respiration Rate	4
		SkinTemp	Thermal features	2
	Camera	Video	Heart Rate, HRV	1
		SkinTemp	Thermal features	1

Other indicators also used:

Subjective(self-report), Behavioral(GPS, app usage), Expression(facial expression, voice)

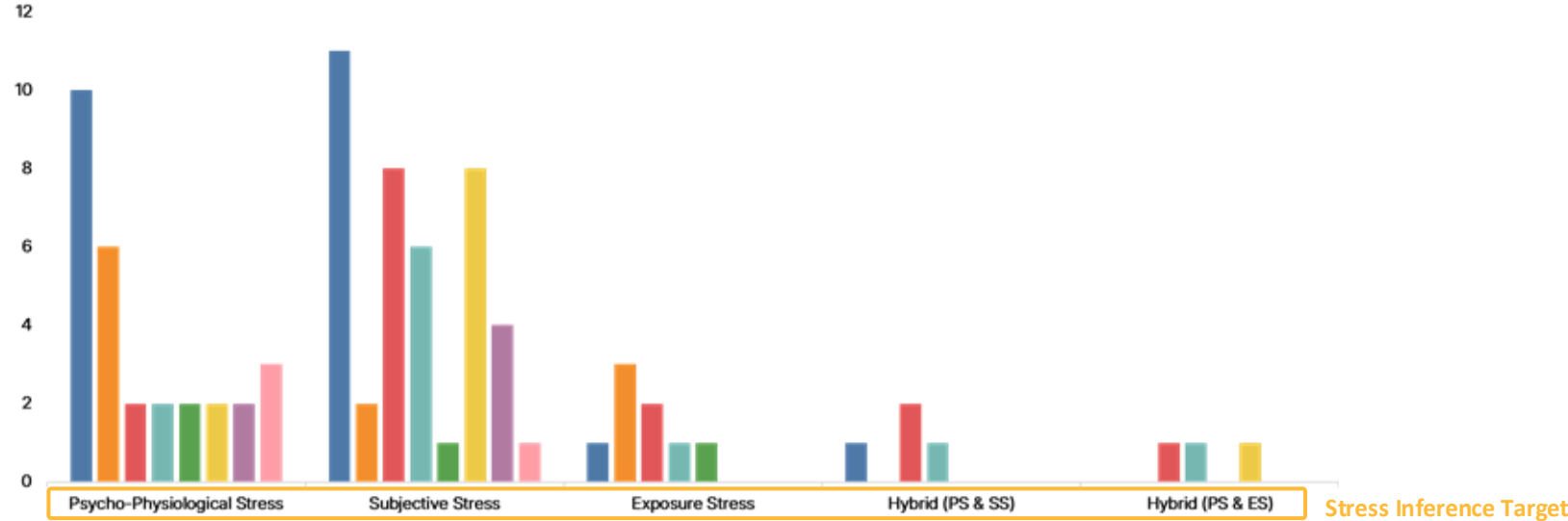
Findings for RQ2. What Interventions Were Used?

Across 52 studies, thematic analysis revealed **8 categories of intervention content**
 → **Visualization & Externalization** was the most common

Stage	Type	Sub-Category
Appraisal (Stress perception and interpretation)	Awareness / Appraisal-Focused	<u>Visualization & Externalization</u>
Response (Coping and stress management)	Emotion-Focused Coping	Biofeedback for Physiological Awareness
		Cognitive Therapy & Reframing
		Mindfulness & Relaxation
		Social Support (Emotional)
	Problem-Focused Coping	Activity Suggestions & Proactive Planning
		Social/Organizational Support (Instrumental)
		Environmental & Task Adaptation

Findings for RQ2. Intervention by Inference Target

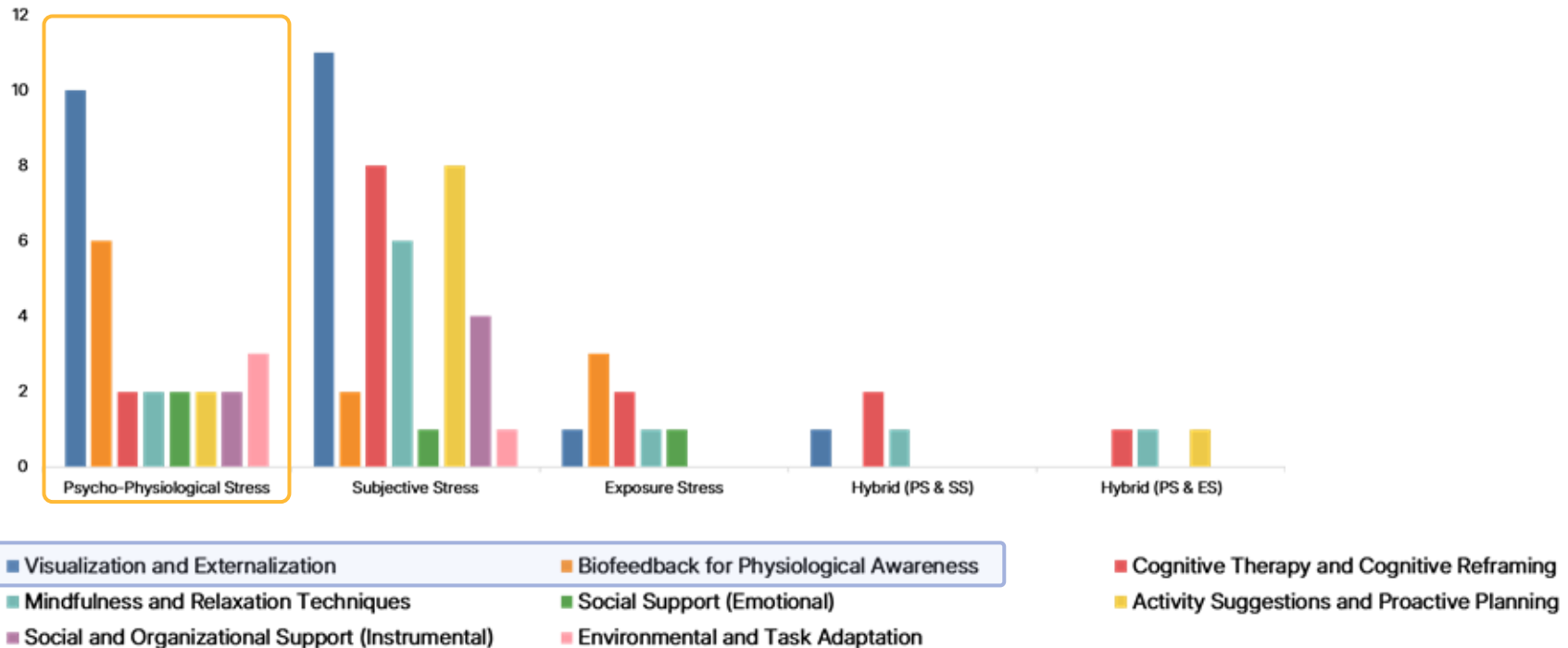
Intervention content **differed** by stress inference target



- Visualization and Externalization
- Biofeedback for Physiological Awareness
- Cognitive Therapy and Cognitive Reframing
- Mindfulness and Relaxation Techniques
- Social Support (Emotional)
- Activity Suggestions and Proactive Planning
- Social and Organizational Support (Instrumental)
- Environmental and Task Adaptation

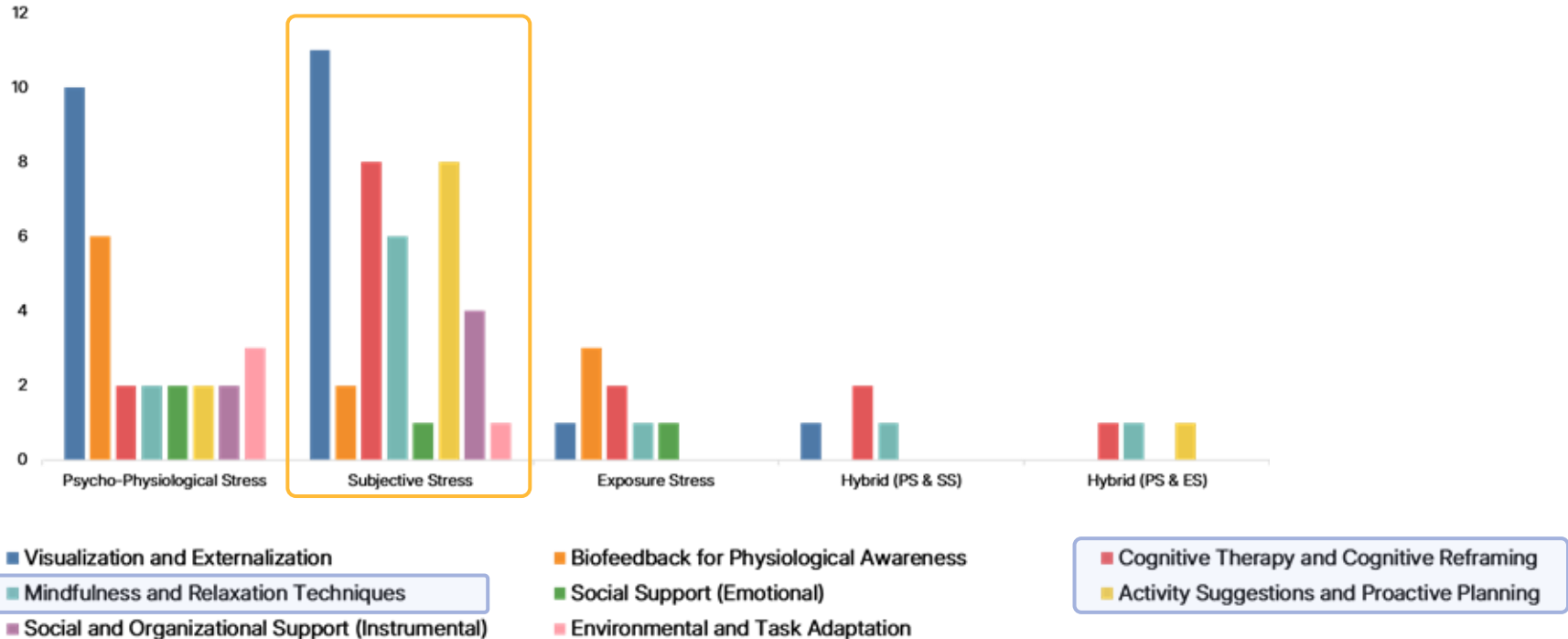
Findings for RQ2. Intervention by Inference Target

Psycho-Physiological Stress predominantly relies on Visualization and Biofeedback



Findings for RQ2. Intervention by Inference Target

Subjective Stress frequently employs **Active Coping** (e.g., CBT, Planning, Mindfulness)



Findings for RQ2. When Were Interventions Delivered?

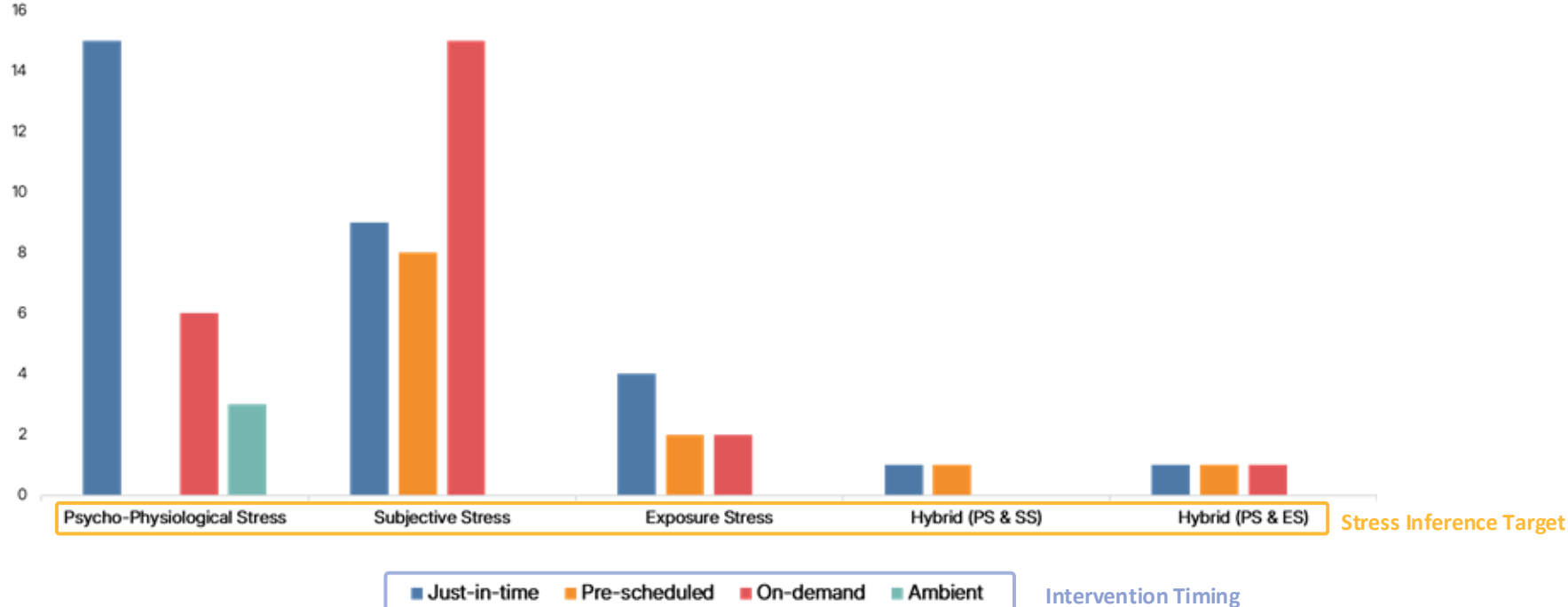
Interventions were delivered in **four timing strategies**

→ **Just-in-time (JIT)** is the most prevalent delivery strategy

Timing	Definition	# of Studies
Just-in-time	triggered by real-time stress detection	30
On-demand	accessed by users when needed	24
Pre-scheduled	delivered at fixed times or sessions	12
Ambient	always visible in the periphery	3

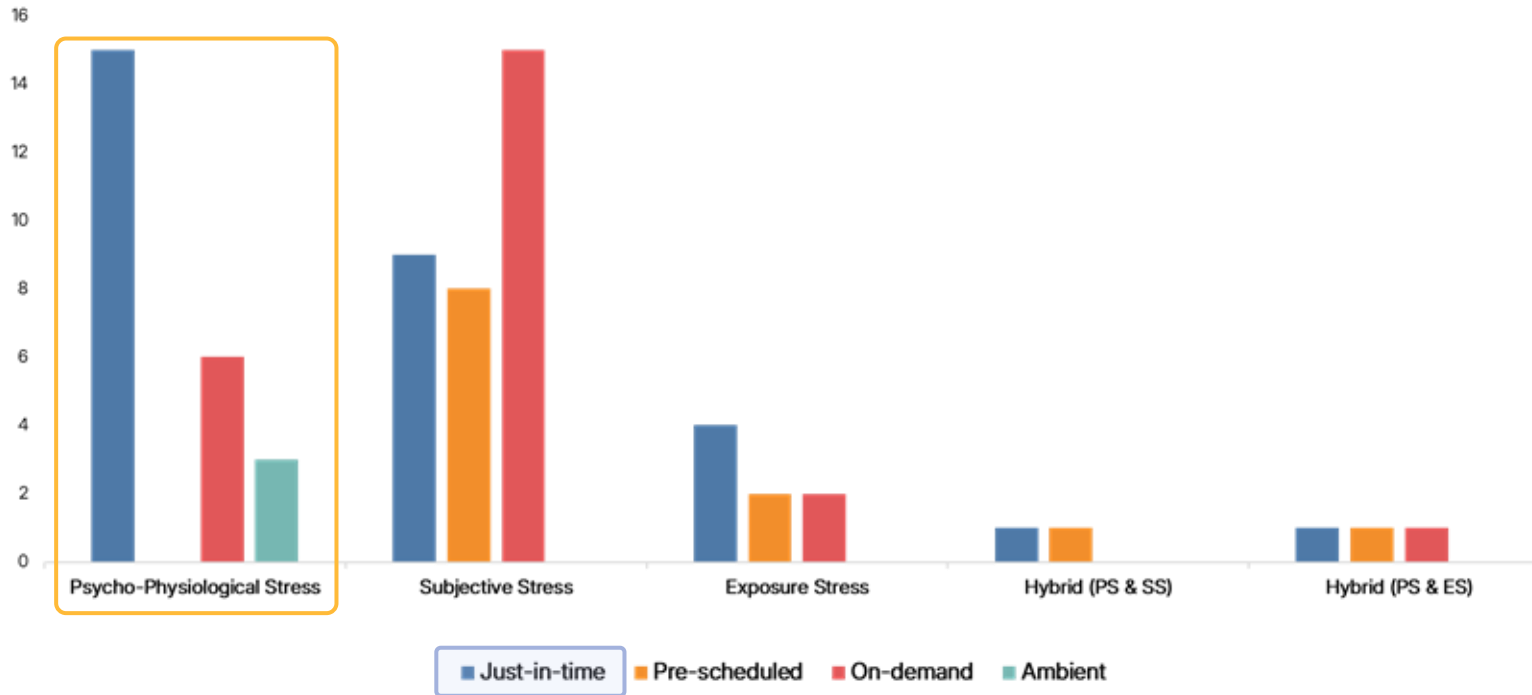
Findings for RQ2. Timing by Inference Target

Stress inference shapes not only content but also **timing of intervention**



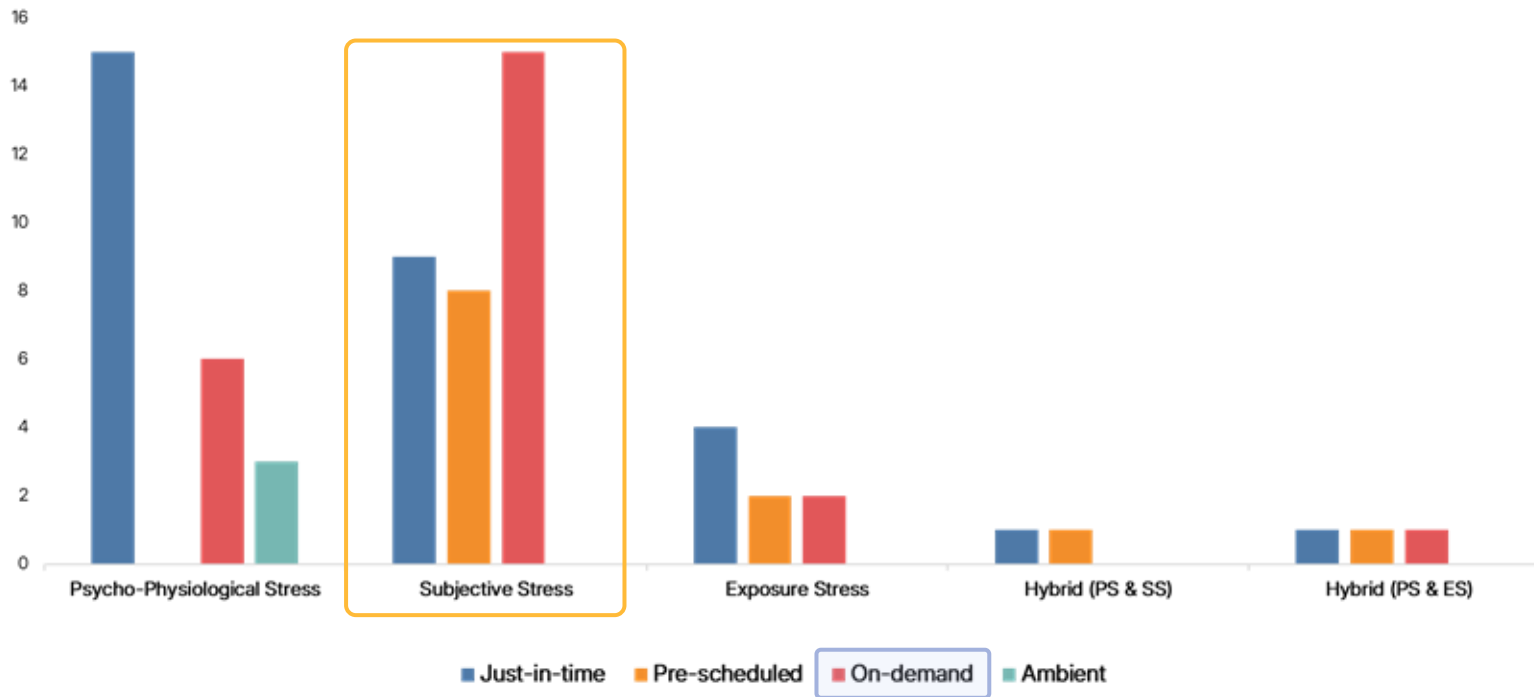
Findings for RQ2. Timing by Inference Target

Psycho-physiological stress systems used just-in-time delivery



Findings for RQ2. Timing by Inference Target

Subjective stress systems relied more on **on-demand** access for user-driven reflection



Findings for RQ3. How Were Systems Evaluated?

We analyzed evaluation practices across four aspects:
study design, participants, duration, and metrics

- Most studies were conducted in **field settings** (N=28) with **students and workers**
- **Mid-term (1 week–2 months)** was the most common duration (N=24)
- Evaluation relied on **psychological scales**(e.g., PSS), **usability**(e.g., SUS) and **qualitative interviews**



Findings for RQ3. How Were Systems Evaluated?

We analyzed evaluation practices across four aspects:
study design, participants, duration, and metrics

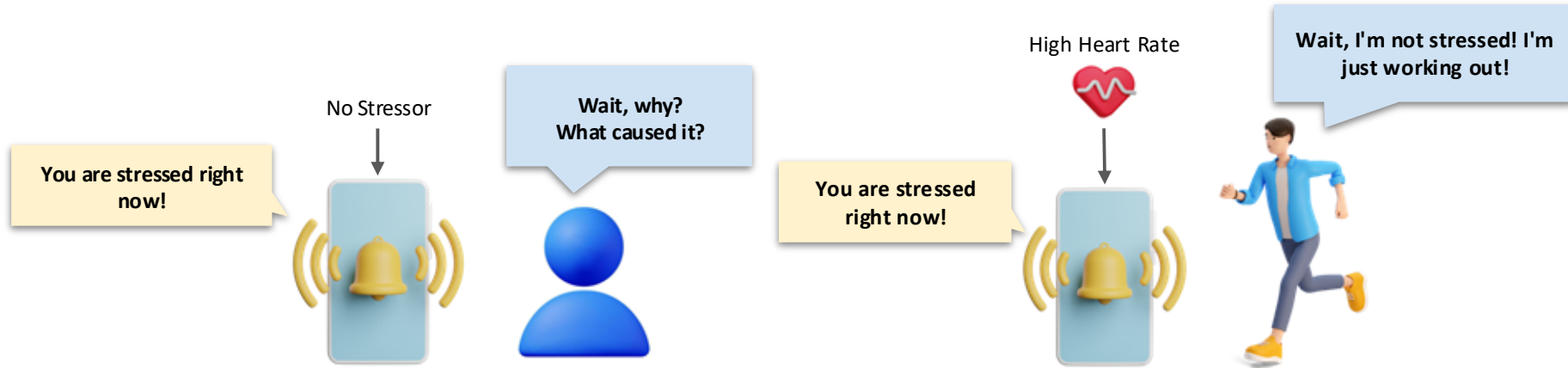
⚠️ **45% of studies used non-comparative designs**

⚠️ **Only 11% exceeded 8 weeks**



Stress Tracking: Current Limitations

49 out of 52 studies focused on a **single stress inference target**



Context Loss

Systems detect "what" happened but not "why" it occurred
→ sensing model acts as a black box

Perceptual Mismatch

User feels excited, system flags it as stress
→ distrust or over-reliance

Stress Tracking: Future Directions

Capture the Full Stress Process:

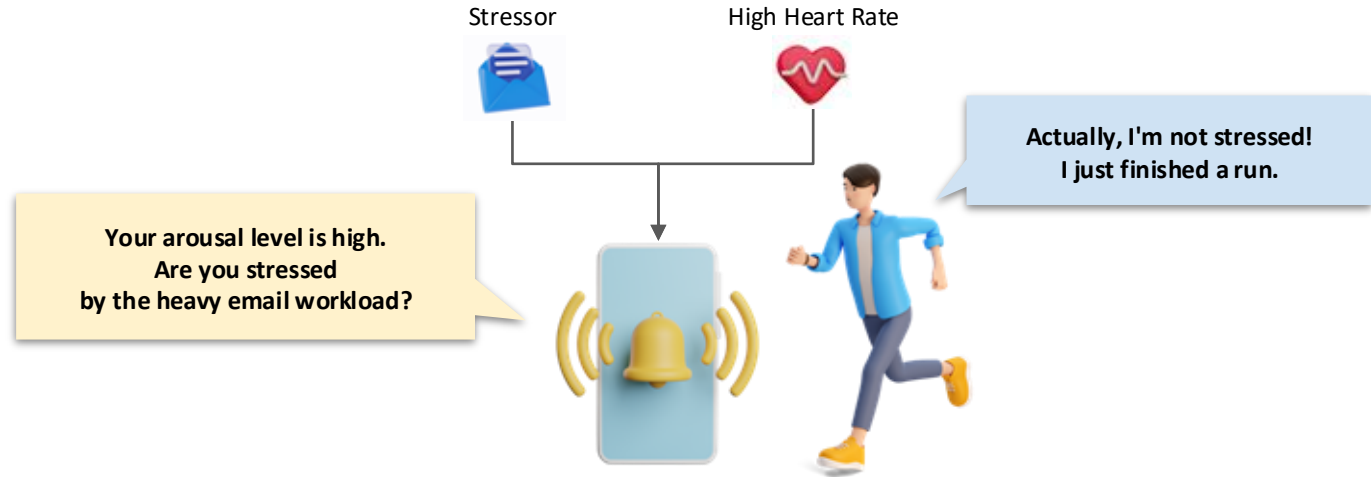
Move beyond single inference target tracking (Stressor & Appraisal & Response)

→ Help users understand not just "what" but "why" they are stressed

Human-in-the-loop calibration:

Users provide feedback on detected stress states

→ System personalizes over time



Intervention: Current Limitations

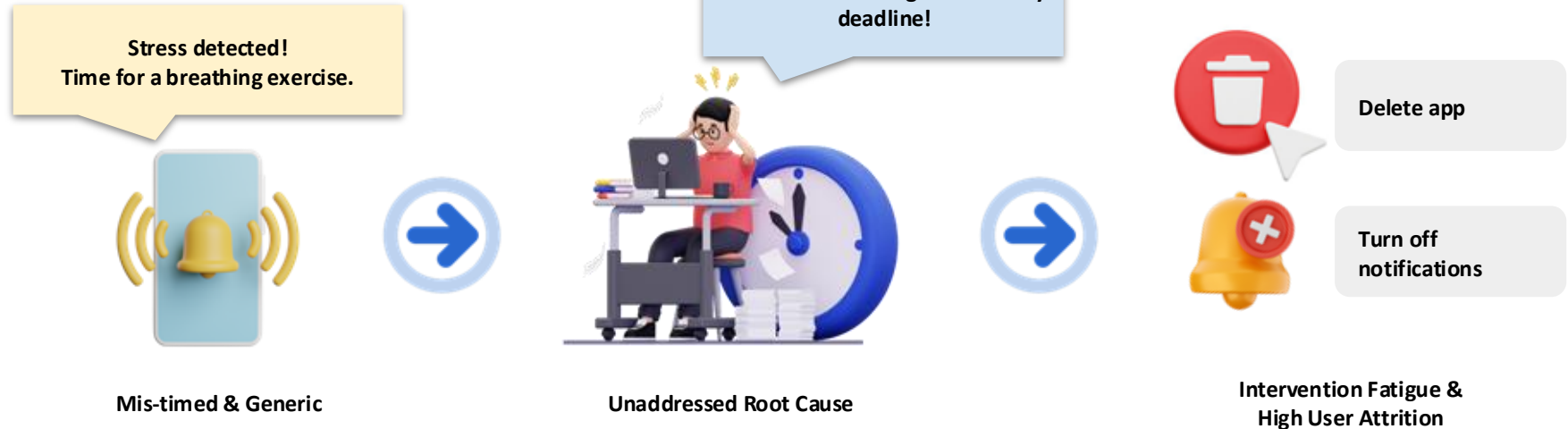
Most interventions are **symptom-oriented without addressing root causes**

→ users become dependent on temporary relief

Most studies used **just-in-time delivery**

→ interventions at unwanted moments

→ intervention fatigue & attrition

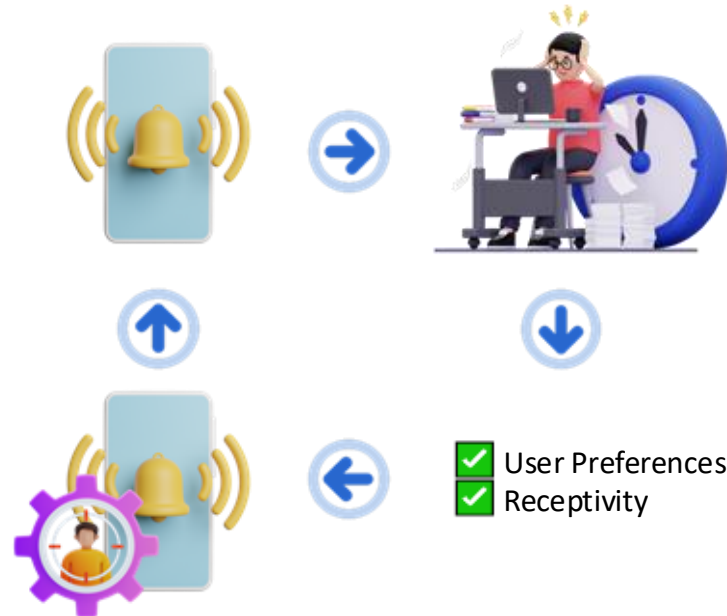


Intervention: Future Directions

Closed-loop Adaptation:

Learn from user feedback to adapt both content and timing

→ from symptom relief to root-cause problem solving



Evaluation: Current Limitations

Study Design

45% used non-comparative designs
→ efficacy remains unvalidated



Only 11% exceeded 8 weeks
→ long-term effects remain unclear



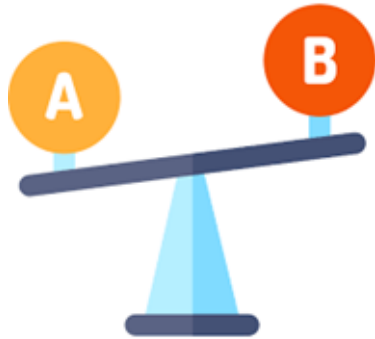
Evaluation Metrics

Focused on efficacy & usability
→ how users actually experience systems remains underexplored



Evaluation: Future Directions

Study Design



Prioritize longitudinal RCTs*
→ Validate **long-term efficacy**

Evaluation Metrics



Go beyond efficacy metrics
→ **Mixed-methods** to understand **how users experience systems**

Exploring Data-Driven Approaches to Stress Management:

A Systematic Review of Stress Tracking, Intervention, and System Evaluation Methods

Youngji Koh, Jeonghyun Kim, Kwangyoung Lee, Yugyeong Jung, Hwajung Hong, Uichin Lee

Take-away Message

- **Stress management should move beyond detection**
→ Consider the full stress process (stressor–appraisal–response)
- **Stress inference should guide intervention design**
→ Adapt both content and timing through closed-loop systems
- **Evaluation should reflect real-world impact**
→ Longitudinal and mixed-method evaluation