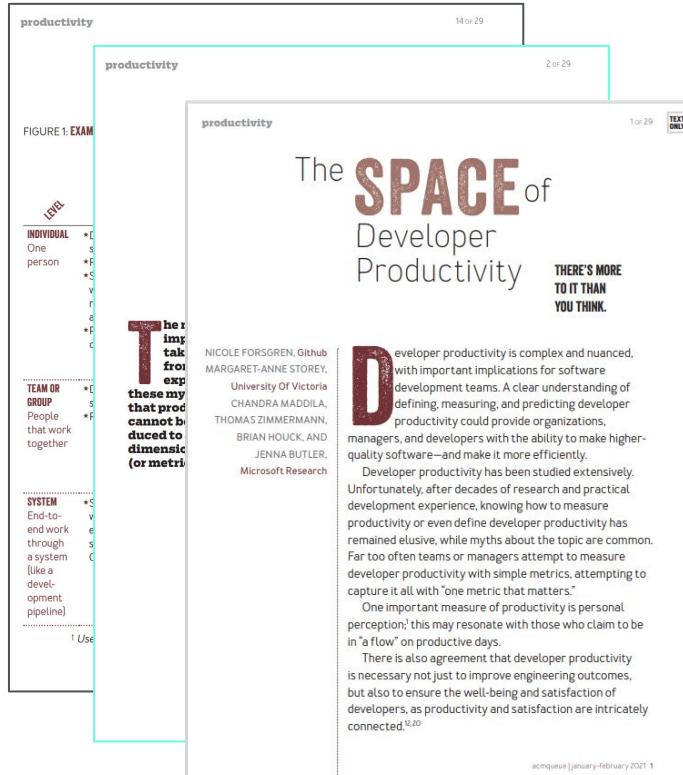


AI and the Future of Software Development: Learning from Industry, Research, and Human-Centered Theories

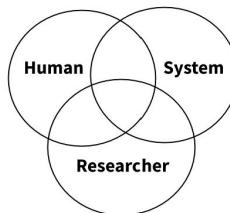
• • •

CIbSE 2025, Ciudad Real, Spain
Margaret-Anne Storey

SPACE: A framework for understanding productivity



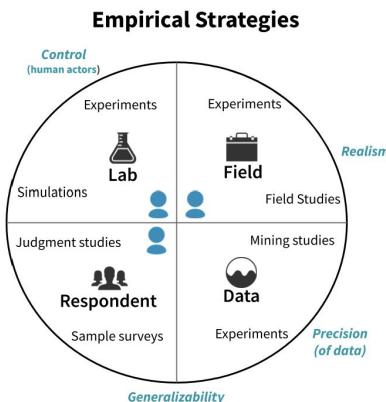
Who?
(is the main beneficiary)



What?
(type of research contribution)

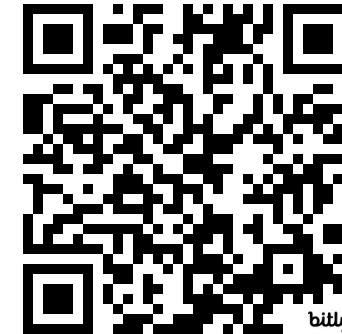
Descriptive Solution

How?
(which research strategies are used)



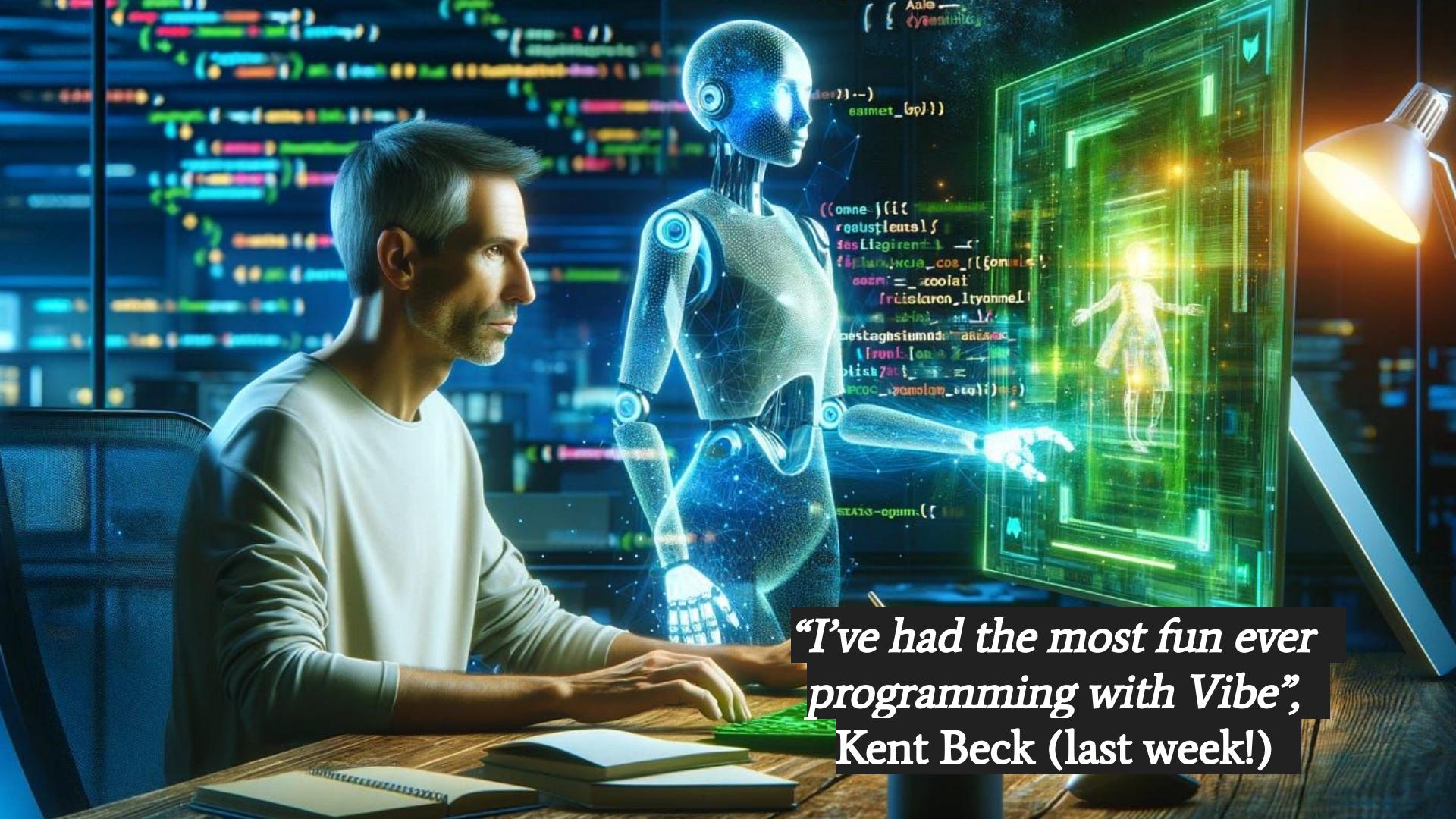
Non-Empirical Strategies

Formal Theory Meta



<https://bit.ly/wwh-framework>

Storey, M., Ernst, N.A., Williams, C. et al.
The who, what, how of software engineering research: a socio-technical framework.
Empirical Software Eng 25, 4097–4129 (2020).



*“I’ve had the most fun ever
programming with Vibe”,
Kent Beck (last week!)*

“AI measurement is a mess – a tangle of sloppy tests, apples-to-oranges comparisons and self-serving hype that has left users, regulators and AI developers themselves grasping in the dark” [Roose 2024, New York Times]

“Industry has to move fast, and doesn’t have the time to study many of the **human and social aspects** that we see emerging”
Peter Rigby (Meta), March 2024 (Victoria BC)

Most studies of GenAI4SE focus on development speed, code quality, and tool satisfaction

We need to leverage and extend
foundational human-centric theories
that outlive tools and aggregate our findings





<https://www.kidovate.ca/>



<https://www.kidovate.ca/>

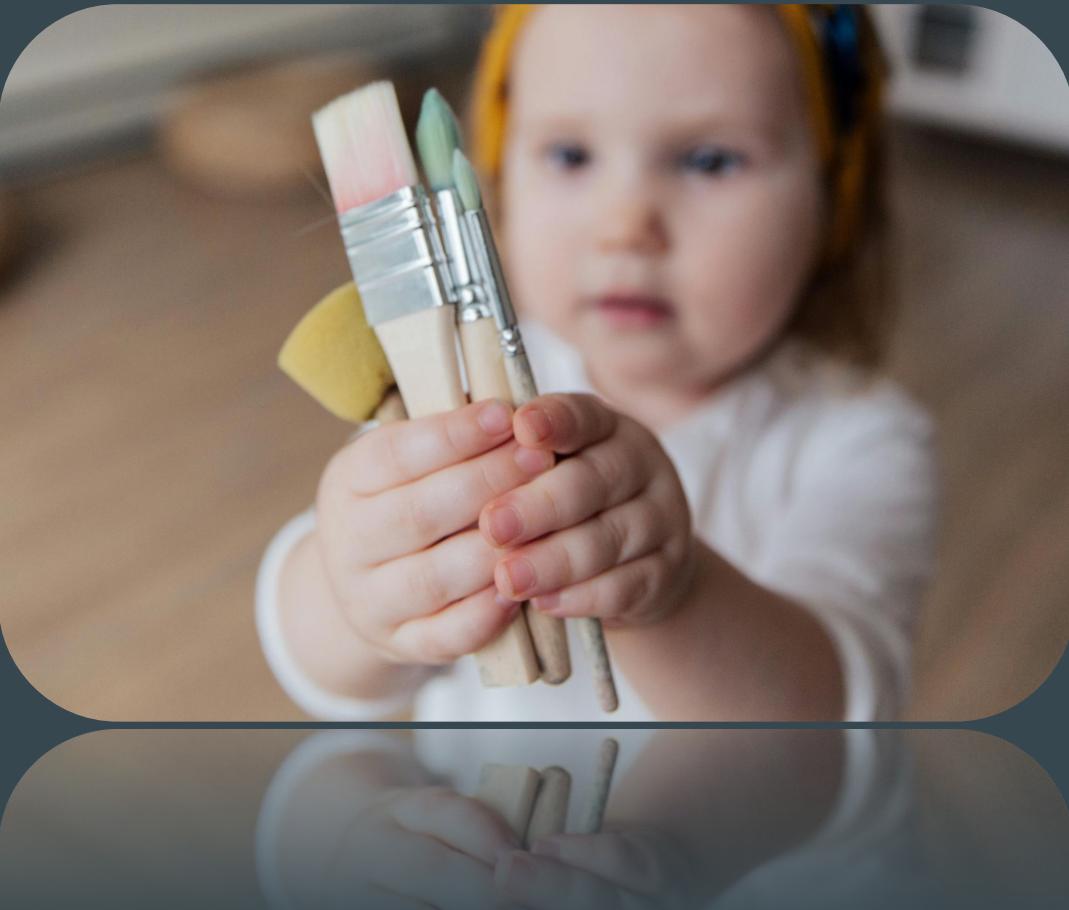
Entrepreneurship for kids invokes
Creative Problem Solving
(Goals, Constraints, Opportunities)





Flow experiences are critical for creative problem solving





Tools augment our capabilities to support creative problem solving

Collaboration
enhances our
experience and our
creative problem solving
abilities



Three Lenses to Understand how GenAI may Support *Creative Problem Solving in Software Development*



Flow
Experiences



Cognitive
Augmentation



Collaboration

Three Lenses to Understand how GenAI may Support *Creative Problem Solving in Software Development*



Flow
Experiences



Cognitive
Augmentation



Collaboration

Theory of Flow - Characteristics

Intense **concentration**

Merging of **action and awareness**

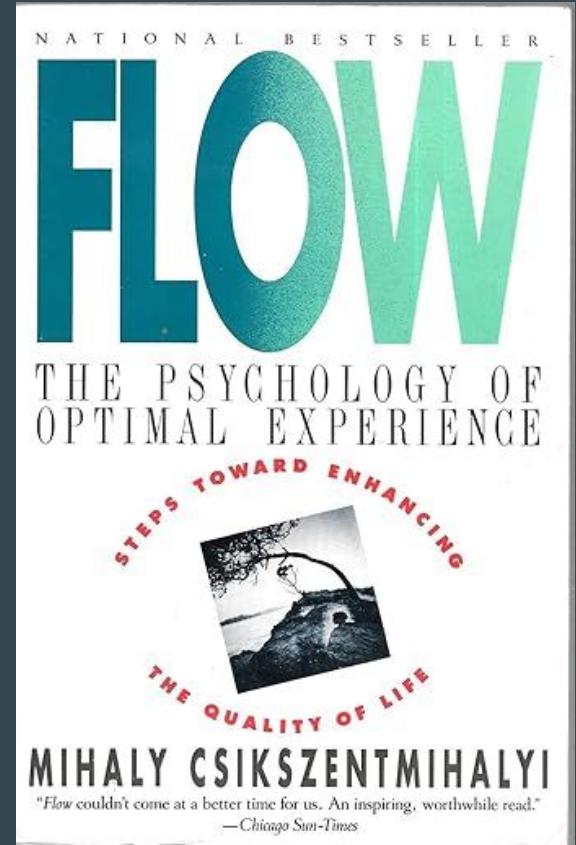
Loss of reflective **self-consciousness**

Sense of **control** over one's actions

Distorted **temporal** experience

Autotelic experience (activity is intrinsically rewarding)

[Csikszentmihalyi, 1991]

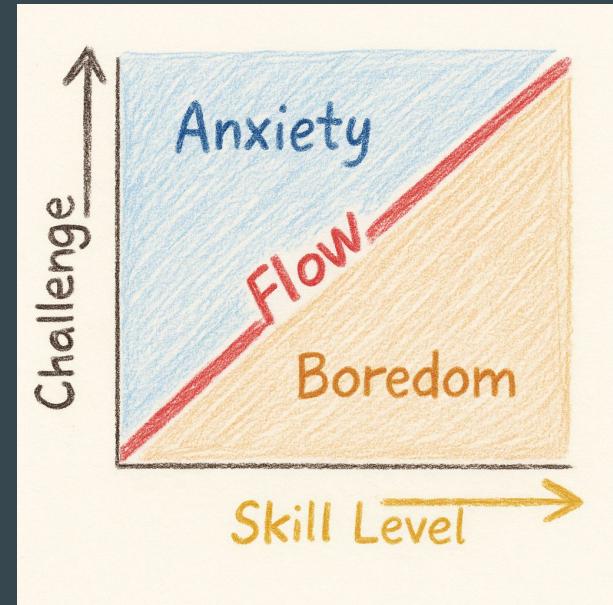


Conditions For Flow

Balance between one's skill and challenges

Clear proximal **goals**

Immediate **feedback**



[Csikszentmihalyi, 1991]

Collective flow

Flow experiences are often enhanced when we are in the company of others
[Csikszentmihalyi, 1991]

Efficacy **beliefs** positively predict **collective flow** over time (and vice versa) [Salanova, 2014]

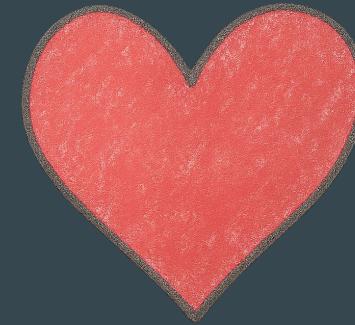


What happens when we achieve flow?

Enhances **creativity**, **learning** and **motivation**

We feel **joy** during times of optimal experience

We reach **peak performance**



Studies about **Flow** in software development (pre GenAI)

Barriers may be personal, interpersonal or situational [Ritonummi2023]

Interruptions [Meyer2017, Ritonummi2023, Ma2024]

Distractions (context switching) [Meyer2019]

Insufficient **focus time** (for creativity, learning) [Brown2023, Ritonummi2023]

Interventions to improve focus time (Flowlight) [Meyer2017]

Tool **friction** [Brown2023, Ritonummi2023]

Waiting on others, getting **stuck** [Ritonummi2023]

Not enough (or too much) **challenge** [Ritonummi2023]

Studies about **Flow** in software development (pre GenAI)

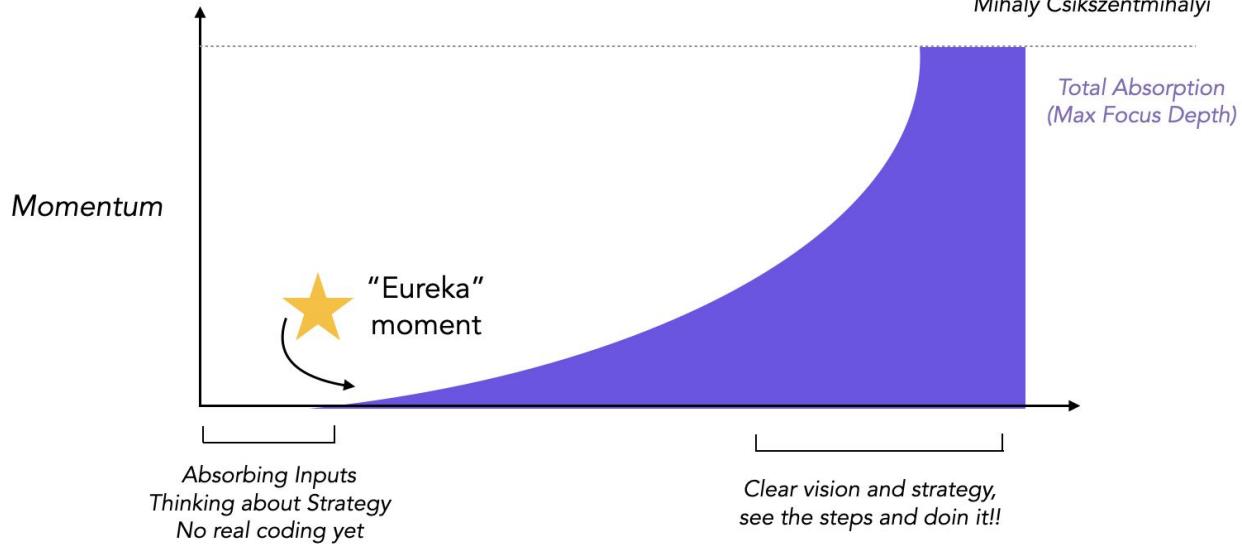
Enablers:

Importance of **goal setting** to facilitate flow in SE [Meyer2019]

Fast feedback facilitates flow in SE [Petersen2011] [Noda2023]

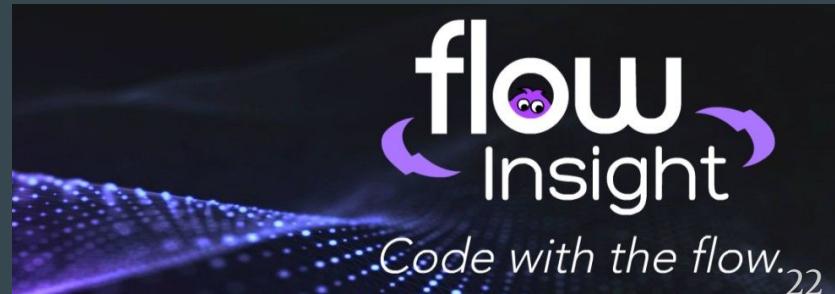
...fewer studies about enablers!

"Momentum" over time

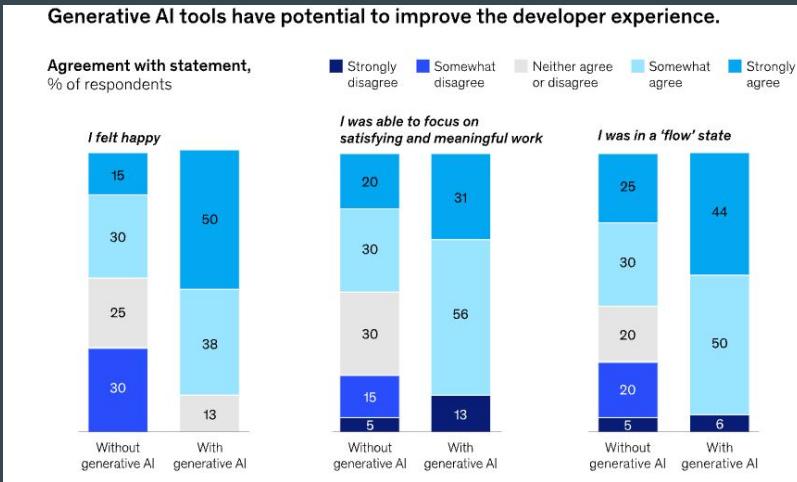


<https://www.linkedin.com/in/artystarr/>

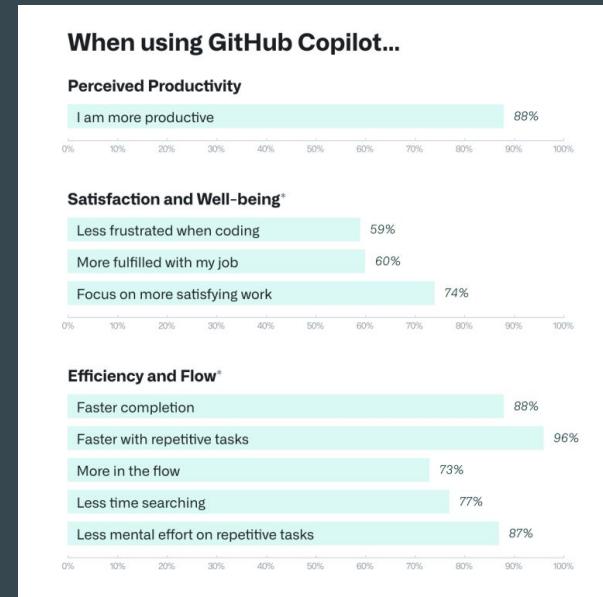
A New Theory of Developer Flow: Troubleshooting and Momentum



Flow in the Age of GenAI: what have we learned? (1)



More likely to be in flow and to focus using GenAI [McKinsey, 2023]



GitHub: More in flow, reduced repetitive tasks [Kalliamvakou, 2024]

Flow in the Age of GenAI: what have we learned? (2)

Microsoft study: 88% of users reported a change in how they worked with GitHub Copilot, reporting more “**fun work**” and less “boilerplate work” [Butler, 2025]

Meta: Multi-line recommendations if not done carefully can interrupt flow (**jarring effect**). Experiments led to designs with 99% adoption [Dunay, 2024]

Academic Thesis: AI helps some developers achieve flow, but may cause others to get **stuck** if there is a lack of **task context** [Lange, 2024]

*“Ade” is finding their way of programming in which you do **a lot of prompt engineering, less satisfying, more dull, and less likely to put them into flow.** And they think it is because of the structure of the activity. At the end, they are less productive because they cannot force themself as much to stay focused on the task.*

[private communication from a colleague]

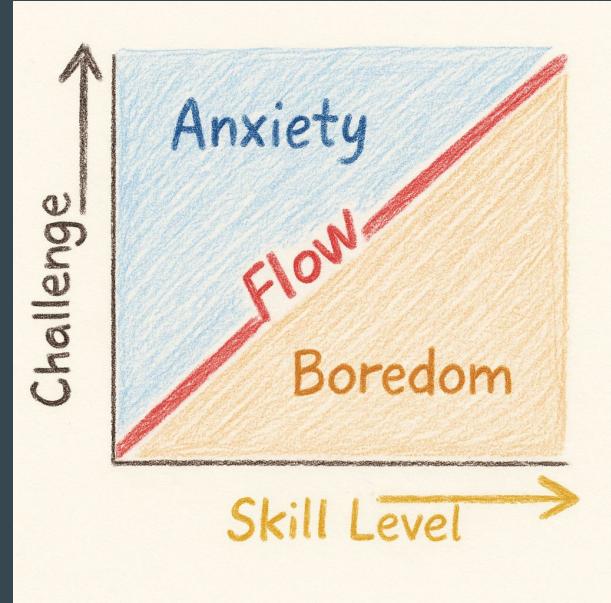
Conditions For Flow (recap)

Balance between one's skill and challenges

Clear proximal **goals**

Immediate **feedback**

[Csikszentmihalyi, 1991]



Do we need to explore how GenAI can help set the conditions for development flow?

Three Lenses to Question how GenAI may Support *Creative Problem Solving in Software Development*



Flow
Experiences



**Cognitive
Augmentation**



Collaboration

Laws of Media applied to GenAI in SE

Cognitive support theories, make hard things easier

Cognitive augmentation, to expand human thinking and creativity



**Cognitive
Augmentation**

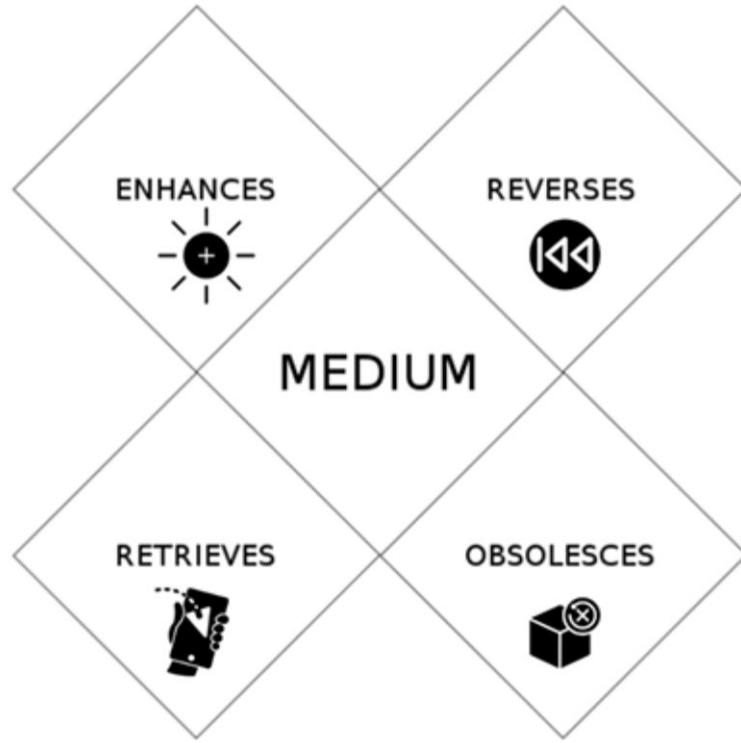
④ Laws of media applied to GenAI in SE

Cognitive support theories, make hard things easier

Cognitive augmentation, to expand human thinking and creativity



**Cognitive
Augmentation**

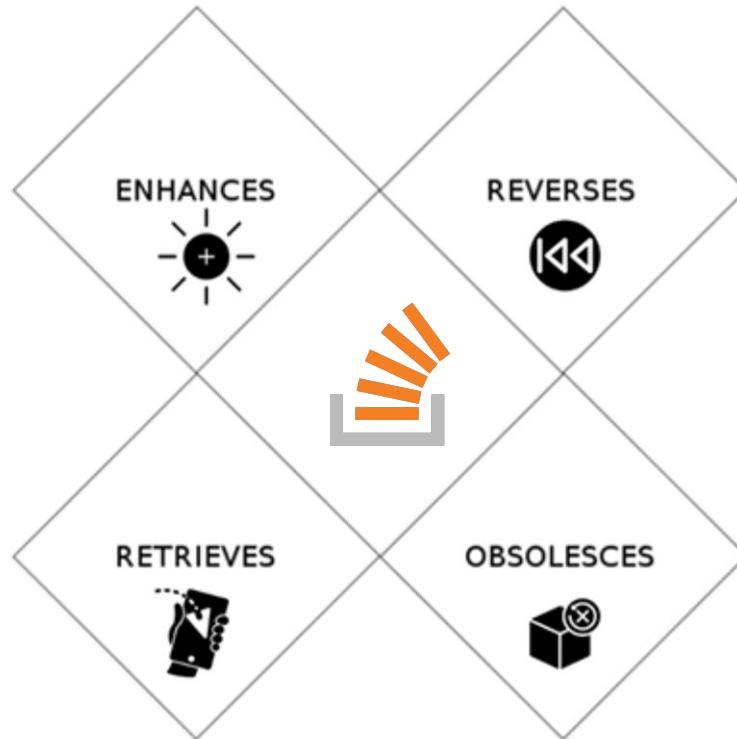


30 | McLuhan's **tetrad**: Four laws of media

McLuhan, M. (1975). McLuhan's Laws of the Media. *Technology and culture*, 16(1), 74-78.

*Faster answers to
questions,
Debugging,
Community*

*Gurus,
Portfolios*



*Trust,
Blind Hacking,
Flips into: LLMs
(drive for more
customization)*

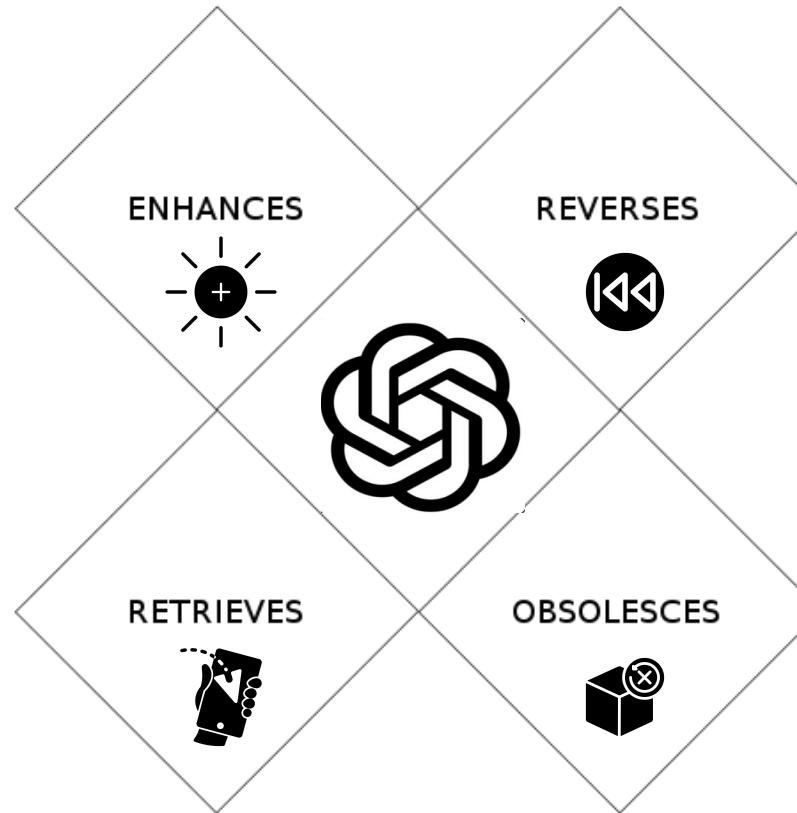
*Email,
Documentation,
Textbooks,
Onboarding docs*

31 | McLuhan's **tetrad** applied to Stack Overflow

<https://bit.ly/research-playbook>



*Automation possibilities
Productivity enhancements
Quality improvements
Personalized solutions
Documentation, code reviews
Better time estimates
Communication, Teamwork
Creativity of dev and teamwork
Who can be a developer*



*Natural language
(pseudocode)
Chatbots, AI agents
End user programmers
Ethical/privacy concerns
Improved diversity*

*Over-reliance
Homogeneous solutions
Devaluation of dev craft
Loss of control, trust
Low understanding
Lost provenance
Model collapse
Lack of empathy for humans*

*Barriers to entry
Writing code
Search, Stack Overflow
Manual documentation,
Manual tests, code reviews
Human troubleshooting
Nerd culture, narrow skills
Traditional education
Onboarding support*



<https://bit.ly/research-playbook>



*What will GenAI reverse into when overused in
(some particular) SE task ?*

Laws of Media applied to GenAI in SE

④ Cognitive support theories, make hard things easier

Cognitive augmentation, to expand human thinking and creativity

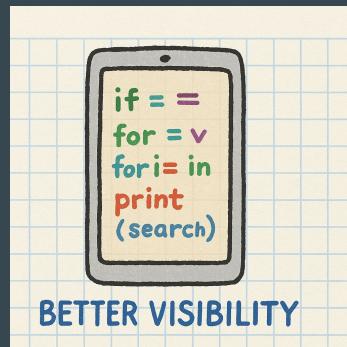


Cognitive
Augmentation

Cognitive Support Theories [Walenstein, 2000]

Humans perform cognitive tasks like searching, matching, recalling, reasoning, problem solving

Tools support cognition by answering “What is hard about this task, and how can this tool help?”



Types of cognitive support:

[Walenstein, 2000]

- **Search** support (locate relevant information)
- **Inference** support (e.g., showing dependencies)
- **Transformation** support (e.g., refactor code)
- **Traceability** support (e.g., helps users understand changes over time)

Evaluating cognitive support:

- Task-Artifact **fit**
- Does it reduce **cognitive cost** or does it overload memory or attention

*How can cognitive support theories be applied to understanding impact of
Cognitive AI?*

Laws of Media applied to GenAI in SE

Cognitive support theories, make hard things easier

④ **Cognitive augmentation, to expand human thinking and creativity**



**Cognitive
Augmentation**

Augmenting Human Intellect: A Conceptual Framework [Engelbart, 1962]

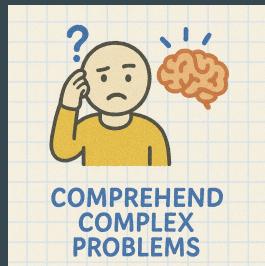


Augmentation vs. Automation:

Engelbart emphasized augmenting human capabilities (e.g., thinking, learning, reasoning) rather than replacing these activities

Augmenting Human Intellect: A Conceptual Framework [Engelbart, 1962]

Engelbart proposed technology can **amplify** human intellect by improving our ability to:



Engelbart predicted a **co-evolution of humans and tools** where cognitive work is distributed between individual and external systems (tools, representations, environments)

Engelbart's theory of Cognitive Augmentation cont.

Bootstrapping Strategy: Improving tools that help us improve tools — a recursive model for accelerating intellectual growth (GPTs!)

How can we improve tools that help improve tools to augment developer intellect - but without forgetting the goal is to improve developer intellect?

Engelbart also influenced ongoing ideas about **Human-AI collaboration!**

Human-AI Collab Calls for New **Meta-Cognitive** Skills [Tankelevitch2024]

Awareness of what you know and don't know: reflecting on how you prompt and how to adapt if results are suboptimal, knowing "how to ask"

Monitoring your own understanding and strategy use: critiquing the output and asking if it aligns with your goals

Regulating your learning and problem-solving: asking if you are over relying on it, calibrating one's level of trust, knowing when to ask for help

What meta-cognitive skills do we need to develop to use GenAI so it truly augments our creative problem solving ability in SE?

Three Lenses to Question how GenAI may Support *Creative Problem Solving in Software Development*



Flow
Experiences



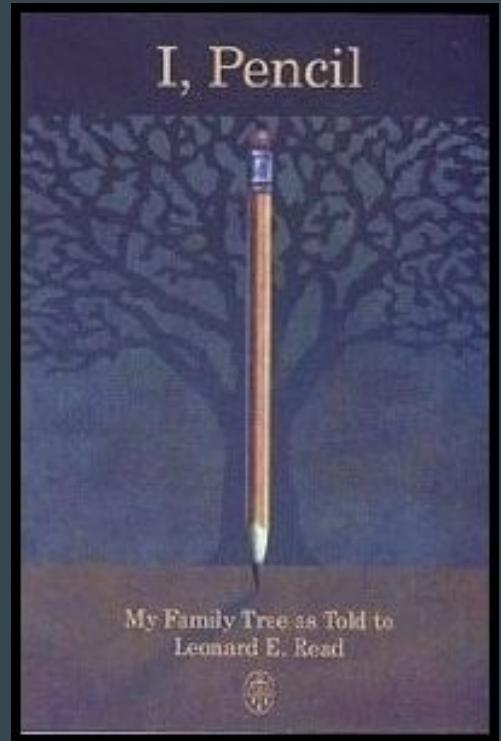
Cognitive
Augmentation



Collaboration

Collaboration

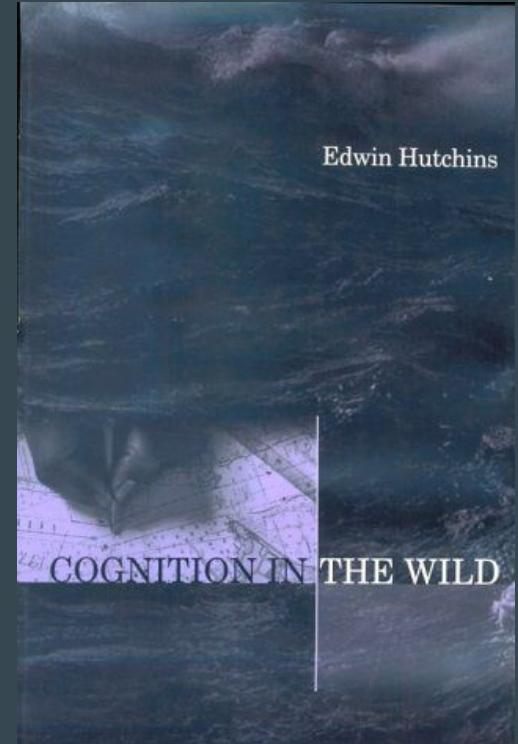
A program is a shared mental construct, a “theory of the program”, which lives in the minds of people who work on it
[Naur, 1985]



Distributed Cognition [Hutchins, 1996]

Theoretical framework that expands the boundaries of cognitive processes beyond the individual mind to include cognition that is distributed across people, tools and time

- **People** (and their social interactions)
- **Artifacts** (tools, representations, documents)
- **Environments** (physical or digital contexts)

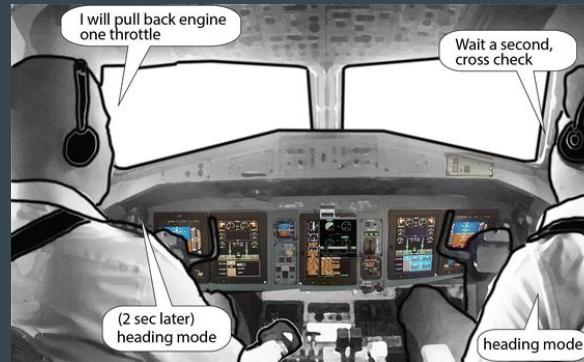


Distributed Cognition cont. [Hutchins, 1996]

Cognition is **social** – decision making happens collaboratively

Knowledge, reasoning and ideas **emerge from human interactions**

Reasoning and learning are **temporal** - spread across multiple episodes of work



Distributed Cognition and Software Development

Examples of **distributed cognition** across people in software development (pre GenAI):

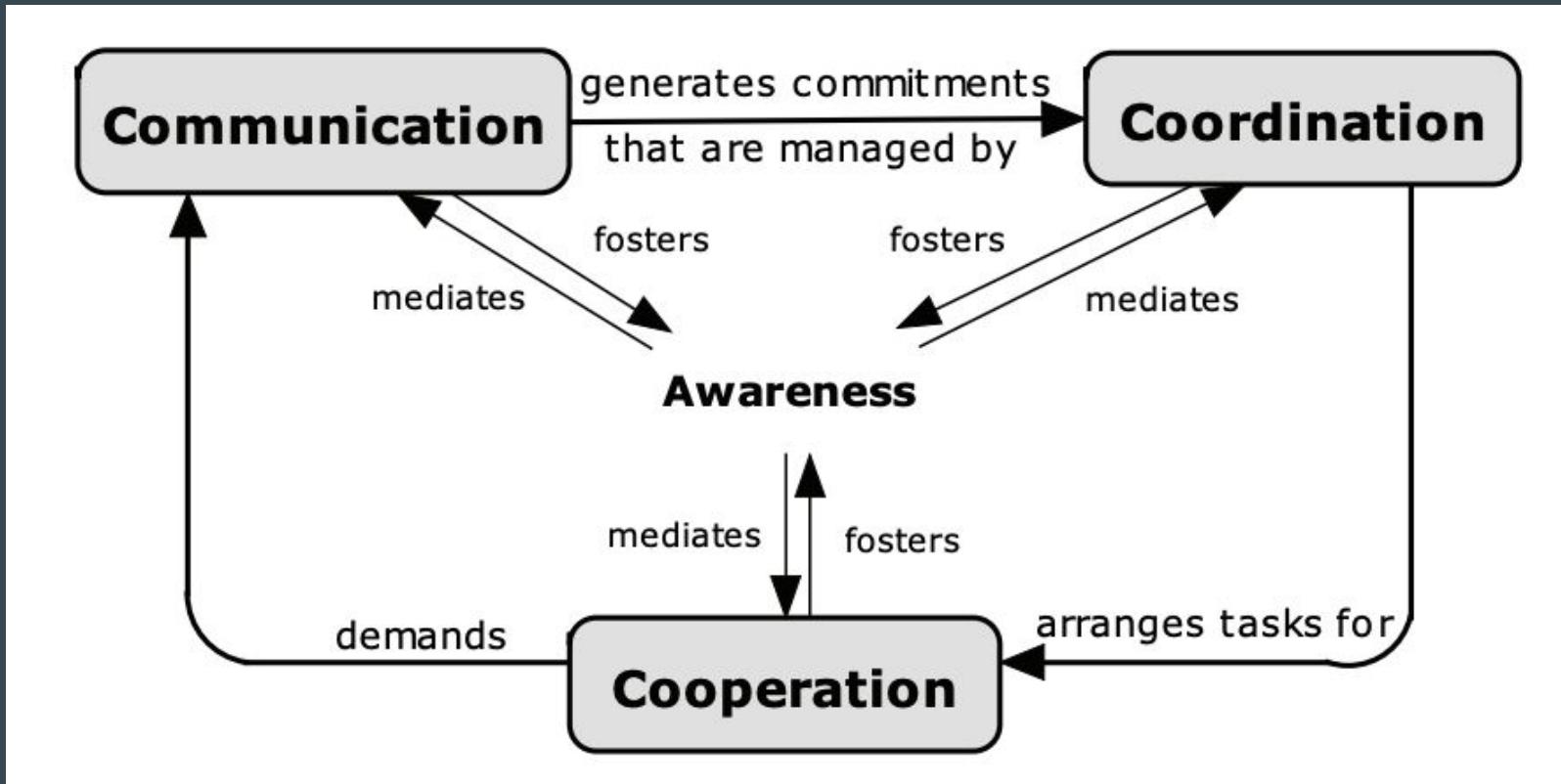
Pair programming [Lui, 2006]

Code reviews [Sharp, 2006]

Design patterns [Mangalaraj, 2014]

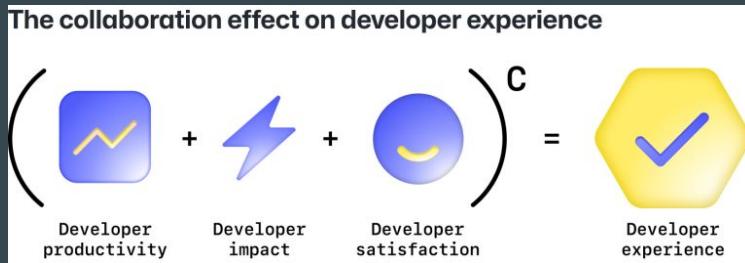
Will the use of GenAI in software development impact how knowledge is distributed among team members? Will it impact the dynamics of team collaboration?

3C Model of Collaboration [Ellis, 1991] [Fuks, 2008]



Collaboration is the multiplier for productivity and experience

Devs work with avg 21 other engineers, spend ~30% of their time talking to others, over half collaborate with other teams once or more per week [GitHub, 2023]



Many want **collaboration** to be a **top metric** in performance reviews

4 out of 5 devs think **GenAI** will make their **teams more collaborative** ! [GitHub, 2023]

*Are the number of code reviews or the number of pull requests good “metrics” for collaboration when GenAI is used?
Which of the 3C’s do these measure?*

Collaboration in software development is not just coding...

- GenAI shows potential for improving **meetings** (collaboration) [Microsoft, 2024]
- GenAI enhances performance, builds **expertise** and fosters **social connectivity** in design teams [Proctor&Gamble, 2025]

Which theories should we use or build to understand how GenAI may shape meetings and social connections in SE?

Flow



*The Future of Creative
Problem Solving in
Software Development*



Augmentation



Collaboration

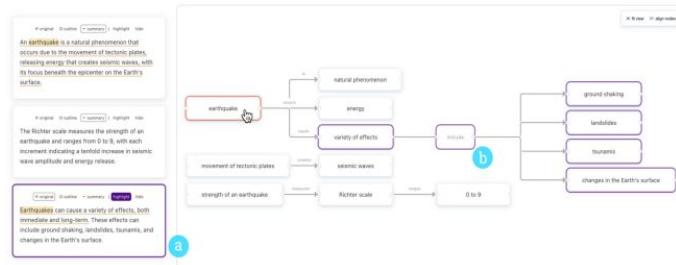
Generative AI begs for a new wave of **natural UIs** beyond Chat

User Experience

aka.ms/nfw

UX, besides technical capabilities, is essential for AI to light up the next wave of tools for thinking. Post-chat UX and notebooks are taking a central stage.

- As discussed elsewhere in the deck, chat as an UX may be at a plateau (Morris 2024), as it can lack expressive power for both abstraction and specificity (Zamfirescu-Pereira et al., 2024). New and existing interaction patterns closer to direct manipulation are used for better expressing intent (Masson et al., 2024, Figma 2024) and parsing AI outputs (Jiang et al., 2023).
- Unlike chat interfaces, notebooks allow for a more structured, versatile, and familiar (Allen 2024) ways for people to create and consume knowledge. The written page and the notebook are re-emerging as a medium and the UX for thinking with AI: as companions to chat experiences (OpenAI 2024, Anthropic 2024) or on their own (Google 2024, Notion 2024).



The Graphologue interface, by Jieng et al (2023).

- Morris, M. R. (2024). *Prompting Considered Harmful*. CACM.
Zamfirescu-Pereira, J. D., et al. (2024). *Why Johnny Can't Prompt: How Non-AI Experts Try (and Fail) to Design LLM Prompts*. CHI 2024.
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Anthropic, (2024). *Claude Artifacts*. Google, (2024). *Noteshell M*. Notion, (2024). *Notion AI*.

*What tools can help us expand our creative problem solving
abilities?*

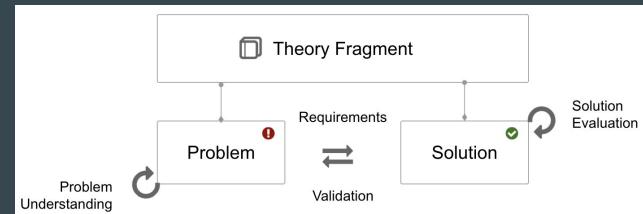
Why a **theory-based approach** for designing and studying GenAI4SE tools?

- Provides a **conceptual framework** to guide what to look for or measure
- Supports **explanation and actionability**, not just descriptions
- Supports **comparisons** across tools and studies
- Provides **design guidance** with a focus on **humans**
- May support **critical reflection** (e.g., to justify or question assumptions and findings)

Theory of Flow

Laws of Media
Cognitive Support Theories
Cognitive Augmentation

Distributed Cognition
3C Model of Collaboration



*Remember how Google “changed our minds”....
Just imagine how Generative AI (and Vibe) will impact how
today’s children will creatively problem solve tomorrow!*



Three Lenses to Understand how GenAI Supports *Creative Problem Solving in Software Development*



Flow
Experiences



Cognitive
Augmentation



Collaboration

References - Theories

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