### LLMs for Software Engineering State of the Art & Open Problems

Aug 26, 2025

Hou et al. (2024) & Fan et al. (2023)

### **Family**



### Occupation: Faculty in Software Engineering

Change is the heart of software development

**Programming is program transformation** 

Q1: Analyze what software changes occur in practice?

Q2: How can we automate them?

Q3: Can we represent programs as transformations? Archive,

retrieve, and visualize them?

Q4: Can we infer higher-level transformations?



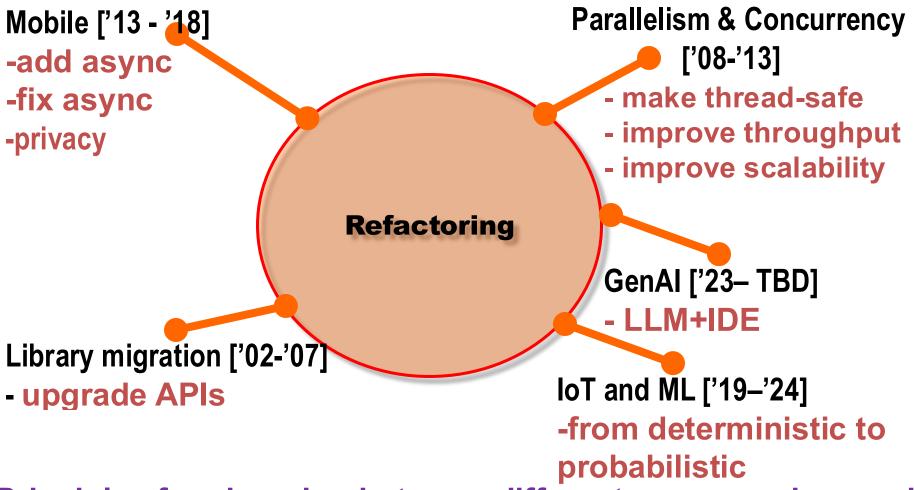






### Work in Your Strength Zone but Reinvent Yourself





Principles for changing between different programming models

### My dream: Practical Impact on SW

Development

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**Automating** 

-ship with official



hundreds of accepted patches

- first open-source refactoring

Google

eclipse

- used at Google

- dozen labs

Refactoring

on Refactoring Tools, HotSwUp, Dagstuhl S.

founded Workshop

#### **Understanding**

- shaped APIs in Java and .NET official concurency libraries

-learnparallelism.net 150,000+ visitors

### **Recreation**





#### On Aug 5, 2015 ...



#### **Motivation**







#### **Discussion Roadmap**

- 1. Surprise Insights 5–7 min
- 2. Models, Data, Gaps 10–12 min
- 3. Optimization & Hybridization 10 min
- 4. Evaluation & Non-determinism 10–12 min
- 5. Tasks & Future Directions 15 min
- 6. Hallucinations: reducing techniques
- 7. Breakout room activity

# 1. First Reactions & Surprise Insights (5–7 min)



# What was the most surprising finding from these two surveys?





## Did any result contradict your expectations?





# Which SE task/domain did you expect to be more mature?



## 2. Models, Data, and Practice Gaps (10–12 min)

- Why are decoder-only LLMs dominating SE tasks? What do we lose by underusing encoder(-decoder) models?
- Only 6/395 studies used industrial datasets. How does this bias research?
- Should SE research prioritize lighter SE-specific LLMs over mega-models?
- YourQ: How do the fundamental architectural differences between encoder, decoder, and encoderdecoder models dictate their suitability for distinct SE tasks like code generation versus understanding?

#### Model Architectures for SE Tasks

- Encoder-only (BERT, RoBERTa)
- Strength: Understanding, classification, embeddings
- SE Use: Bug detection, code search, clone detection, traceability
- Encoder-Decoder (T5, CodeT5)
- Strength: Sequence-to-sequence transformations
- SE Use: Code translation, doc generation, refactoring, test generation
- Decoder-only (GPT, CodeX, Code Llama)
- Strength: Generative, autoregressive, few/zero-shot
- SE Use: Code completion, repair, requirement-to-code, design brainstorming

#### Rule of Thumb:

- Understanding → Encoder
- Transformation → Encoder–Decoder
- Generation → Decoder