

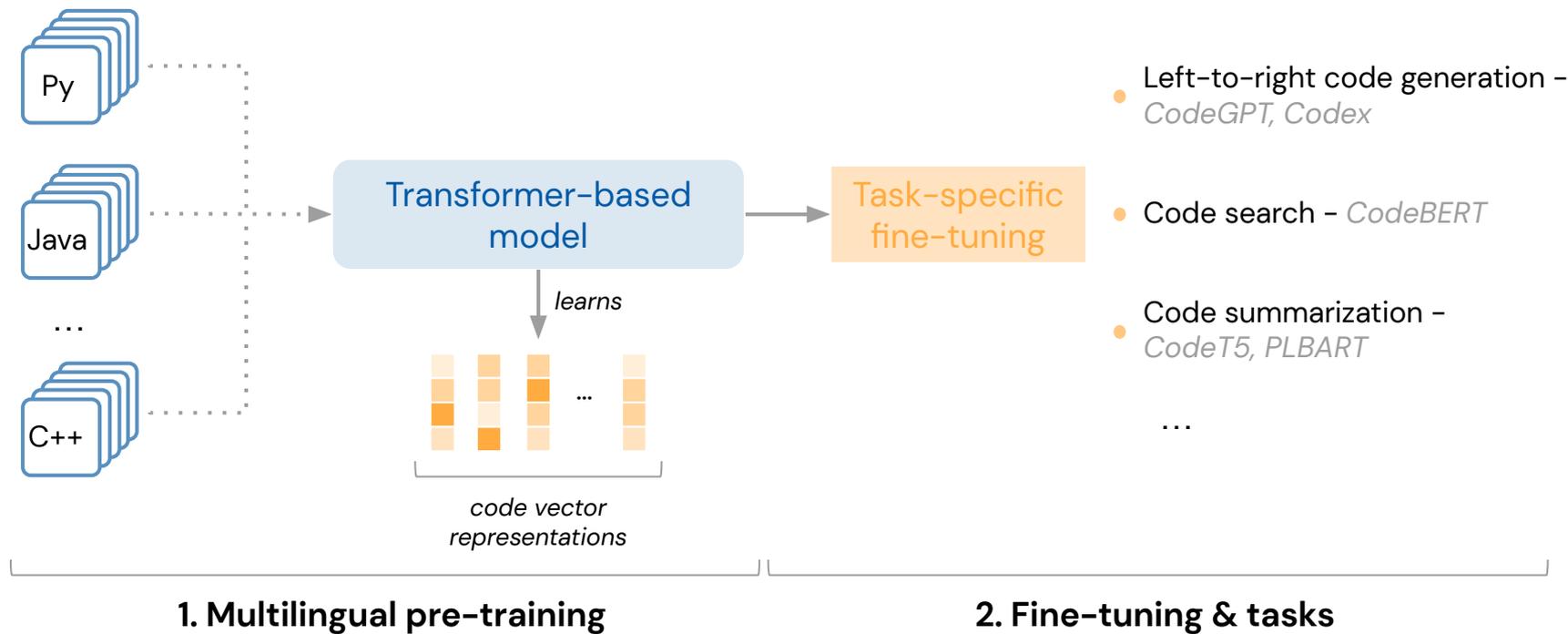
# Better Modeling the Programming World with Code Concept Graphs-augmented Multi-modal Learning

Martin Weyssow, Houari Sahraoui, Bang Liu



# Context & Motivation

# State-of-the-art learning paradigm



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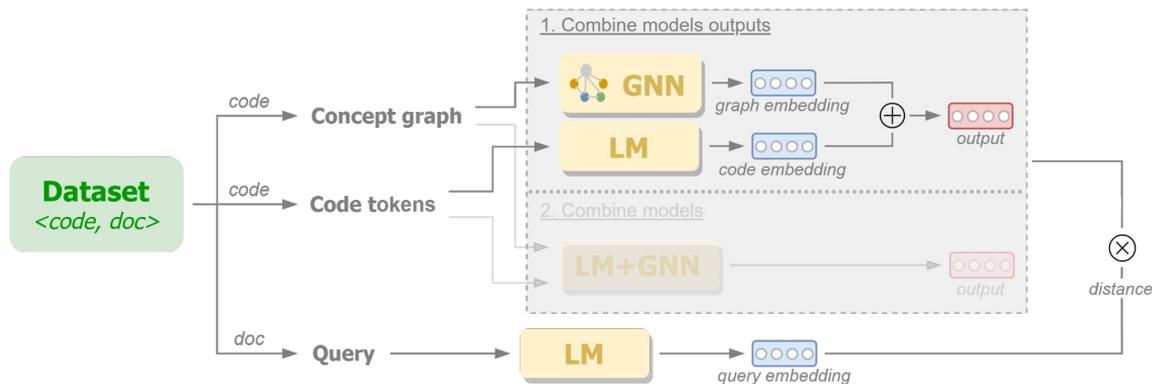
But

- Programs are concept-based → concept graphs
- Programs are multimodal! → learn from multiple level of abstraction

**Can we learn better representations of code?**

# Multimodal learning with code concept graphs

**Proposed approach.** Joint-learn a BERT-like language model (LM) and a graph neural network (GNN).



## Applicability to code search

- find the best code candidate given a natural language query
- simple fusion of code and concept graph representations
- improvement over CodeBERT, a strong baseline

# Discussion

**Can we have large multimodal pre-trained models of code?**

- learn general-purpose code representations

*and/or*, **should we fine-tune existing pre-trained models in a multimodal fashion?**

- define modalities specific to the task

**Scaling law** → more parameters = higher accuracy on the tasks at hand

- **Can we observe the same trend with multimodal learning?**
- **How does multimodal learning compare to unimodal learning *w.r.t* this law?**
- **Are the data processing and fusion worth the time/resources? → trade-off**

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**Martin Weyssow**

DIRO, University of Montreal  
martin.weyssow@umontreal.ca



**Houari Sahraoui**

DIRO, University of Montreal  
sahraouh@iro.umontreal.ca



**Bang Liu**

DIRO & Mila, University of Montreal  
bang.liu@umontreal.ca

