Motivation and vision: Alan Perlis said, "Beware of the Turing tar-pit in which everything is possible but nothing of interest is easy" [1]. Unfortunately, much of an introductory programming course can feel like the "Turing tar-pit." These courses focus on building generalizable programming knowledge by focusing on a language's syntax and semantics [2]. Assignments often involve close tracking of code's execution, typically in the context of 'toy' problems [3]. These activities can create a "perfect storm" for discouraging learners, because they require high cognitive load [4], leading to a low expectation of success [5], while also being disconnected from meaningful code, resulting in low value for the task [5].

With the increasing popularity of programming learning, there is a growing number of learners who do not plan to be software engineers [6]. As a result, there is a greater need to connect learning tasks to outcomes in the real world. Future software developers know that a deep understanding of how programming languages works is part of their professional practice. However, for learners who plan to become end-user programmers [7] (e.g. graphic designers) or conversational programmers [8] (e.g. managers), the reason to learn the details of code's syntax and semantics is less clear [9, 10]. These learners are more likely to be female, a population that has lower self-efficacy in programming learning [11].

New technologies are needed to create programming learning activities where novices can quickly and easily create authentic and meaningful code. Many learners may not care about exactly how a programming language works, but they do care about what code can achieve for them. A new approach that focuses on code's *purpose* rather than its *semantics* is required to help these learners remain engaged with programming learning.

Research Goals: To bridge this gap, **I will develop and evaluate a** "purpose-first" programming learning environment. In order to scaffold the code reading, writing, and debugging capabilities of novice programmers as they work with authentic code, I will provide information, structures, and real-time feedback that highlight how code achieves goals in a domain. This system will allow learners to quickly create and understand real-world code, without the need for a deep knowledge of programming language semantics.

This learning environment will decrease the cognitive cost necessary to complete meaningful programming tasks, while providing supports that can contribute to further learning. I will draw on the theory of programming plans [12] in order to design scaffolds (assistive mechanisms [13]) that clarify code's purpose. A programming plan is a commonly used code pattern, associated with a goal that code achieves. In "purpose-first" programming tasks, learners will always work with authentic code patterns used by practitioners. This "chunking" [14] of meaningful code is a scaffold that allows reasoning about code to occur more easily and aligns with what we know about the ways experts understand code [15]. Instead of writing code from scratch, purpose-first programmers will tailor and combine plans. Instead of tracing code line-by-line to debug or understand how code works, learners will infer code behavior across larger chunks of code.

The primary outcome of purpose-first programming is increased self-efficacy [16] for programming learners. Current approaches to programming learning result in lower self-efficacy for females than males [11], and studies of underrepresented minority groups in STEM have found lower general academic self-efficacy compared to majority groups [17]. Low self-efficacy is associated with lack of persistence in computing [18]. With purpose-first programming, learners see programming accomplishments quickly, which should increase self-efficacy [16].

Intellectual Merit: This work connects cognitive theories to theories of motivation in order to present a new approach to programming learning called purpose-first programming. I will build a novel programming learning intervention that allows me to extend theory to practice, and demonstrate its effectiveness. I will develop design implications for future research on supporting novice programmers as they engage in meaningful and authentic programming experiences. My findings will generate evidence for the impact of purpose-first programming on student self-efficacy and learning. These advances will improve computing education, create a new pathway to programming learning, and advance our knowledge of how students understand programs and programming.

Broader Impacts: This work opens new avenues to computing, inviting a broader group of learners to engage with programming, particularly those who are less likely to find code semantics interesting. By building a computational learning environment, I will be able to reach a large number of learners with a multifaceted approach that addresses the cognitive and motivational factors that can derail programming learning. I will improve learners' self-efficacy, a factor that disproportionately affects groups underrepresented in computing. During the development of purpose-first programming, I will work primarily with students at a non-R1 university; for example, DePaul University or Northeastern Illinois University, where African American constitute 9% and 10% of the student body, and Hispanic students constitute 15% and 36% [19,20].

Foundations: Purpose-first programming is a method of learning and performing programming tasks in a specific domain (e.g. web scraping), where tasks are facilitated with information, structures, and feedback that highlights how code achieves goals in that domain. In my thesis work, I laid the foundations for purpose-first programming by creating a curriculum for learning five frequently-used web scraping code patterns with "purpose-first" scaffolds [13]. These scaffolds include highlighting of "slots" where changes to each pattern should occur, natural language description of the goal each pattern achieves, and subgoal labels [21] that describe how parts of the pattern contribute to the overall goal.

Overview: In my postdoctoral work I will develop an interactive learning environment called *PURPLE* (<u>PURPosefirst Learning Environment</u>), where novice programmers complete purpose-first programming. I will design and build *PURPLE* in multiple stages. First, I will use an off-the-shelf interactive learning platform to build *PURPLE* v1.0. Next, I will perform a formative study using *PURPLE* v1.0 to inform design decisions about new features. Then, I will use an iterative design process to build *PURPLE* v2.0 that incorporates real-time feedback mechanisms to support purpose-first programming. Finally, I will evaluate the effectiveness of *PURPLE* v2.0 for building self-efficacy and programming skills among novice programmers.

Milestone 1: Building PURPLE v1.0: a purpose-first programming curriculum in a new context (Jan-Feb 2021) To create an initial version of an interactive learning environment for purpose-first programming, I will compile a set of programming patterns and associated tasks, in a new domain (e.g. creating shapes in Processing, or analyzing social media data with Pandas). Building on my experience identifying common patterns in the domain of web scraping with BeautifulSoup, I will identify patterns and annotate them with the purpose-first scaffolds I developed in my thesis work. I will then add the tasks to a Runestone interactive ebook [22], which will facilitate log data collection as well as enable basic interactive features, like textual feedback when a student selects a wrong answer.

Milestone 2: Formative study on PURPLE v1.0 to inform design changes: Understanding problem-solving process and self-efficacy on tasks with purpose-first programming scaffolds (Mar-Aug 2021)

In a series of formative studies, I will investigate the affordances that my initial set of plan-based scaffolds in PURPLE v1.0 provide for completion of programming tasks, as well as learners' affective experiences when completing tasks with extra support. By performing think-aloud studies [23] of novice programmers' code writing, debugging, and understanding when executing tasks with purpose-first scaffolds, I will gain an understanding of how novices use information about code's purpose to solve problems, and where they struggle to make use of the assistance provided. I will also interview students about their feelings of self-efficacy after completing tasks. I will run three studies with novice programmers, each focusing on a different programming task: debugging, code writing, and code explanation.

Milestone 3: Iterative Development of PURPLE v2.0, a purpose-first programming environment with real-time feedback (Sept 2021-Aug 2022)

Next, using the findings from Milestone 2, I will investigate how to design real-time feedback in *PURPLE* v2.0 to support novice programmers as they complete programming tasks. I will design new interactive feedback that extends the functionality of the initial scaffolds, to allow for an easier completion of programming tasks. My designs will modify the existing purpose-first scaffolds to add real-time feedback. For instance, while *PURPLE* v1.0 only provides static text describing what a code pattern achieves in general terms, *PURPLE* v2.0 may change that text dynamically to become more specific as a learner fills in slots in a code pattern. To develop *PURPLE* v2.0, I plan to either extend the capabilities of Runestone with new Javascript components, or create a new standalone system. I will develop three interactive, real-time feedback features. As I develop each feature, I will run a user study to evaluate the effectiveness of this feedback for improving novices' ability to complete programming tasks.

Milestone 4: Evaluating the effectiveness of PURPLE v2.0: self-efficacy and learning (Sept-Dec 2022) Finally, I will evaluate PURPLE v2.0's ability to increase self-efficacy among new programmers, as well as to prepare learners to complete tasks without purpose-first scaffolds. At a local college, I will offer a workshop involving use of PURPLE v2.0 for students interested in learning programming, but who have no experience in the domain of the curriculum. Using a validated survey instrument (e.g. [24]), I will measure these learners' self-efficacy for programming before and after the workshop. At the end of the workshop, I will assess learners' ability to complete tasks similar to those in PURPLE v2.0, but without the purpose-first scaffolds. These findings will help us understand if purpose-first programming is a valuable early learning tool.

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