

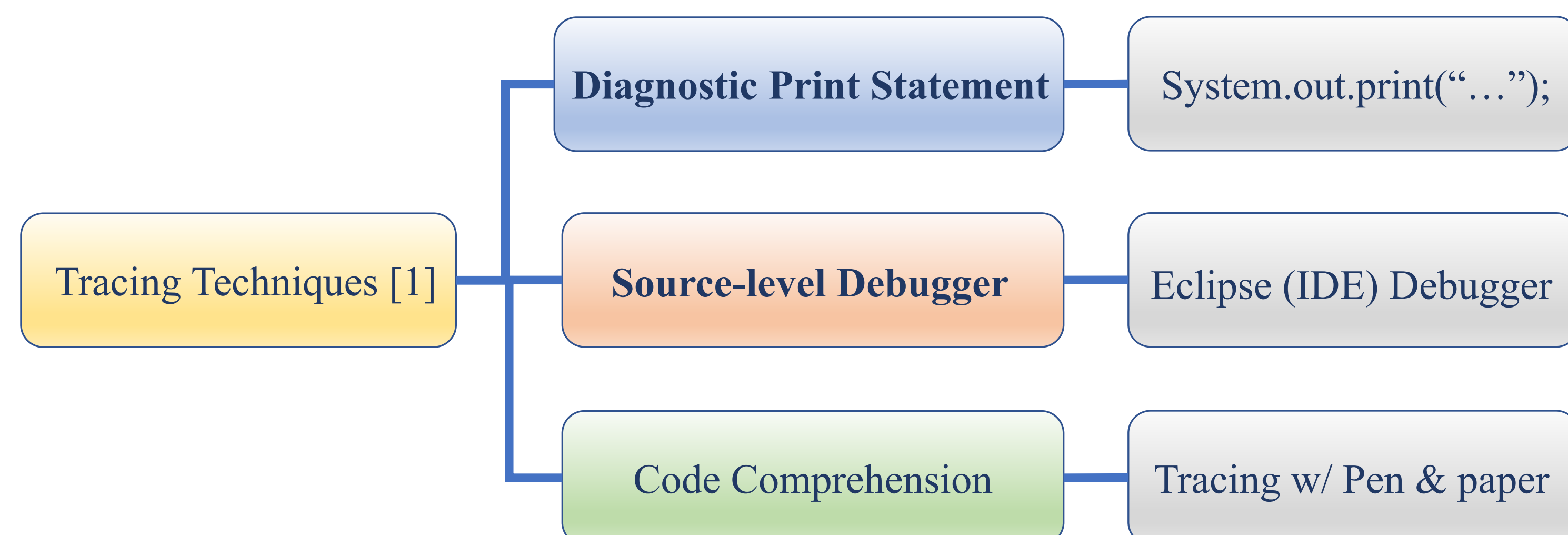
Identifying Debugging Behaviors in Intermediate Programmers

- Intermediate programmers often spend a lot of time debugging
- In a post-CS2 Data Structures and Algorithms course, we used IDE clickstream data to analyze detailed debugging behavior
- We hypothesize that there are differing debugging behaviors exhibited, and that differing behaviors lead to differing project outcomes

Research Questions

- To what *extent* is a particular debugging technique being used?
- Does it matter *when* in the project lifecycle that debugging takes place?
- Can a particular *type* of debugging technique lead to better project score?

Different Debugging Techniques



We focus on two debugging techniques:

1. Diagnostic Print Statements and
2. Source-level Debugger

Diagnostic Print Statement (DPS) Classifier

We want to identify those print statements that the students use for debugging purposes *i.e.* DPS; this is not a trivial process.

1. Exclude Commented Print Statements
2. Exclude Trivial (Delimiter) Print Statements
3. Exclude Project Specific (Required) Statements

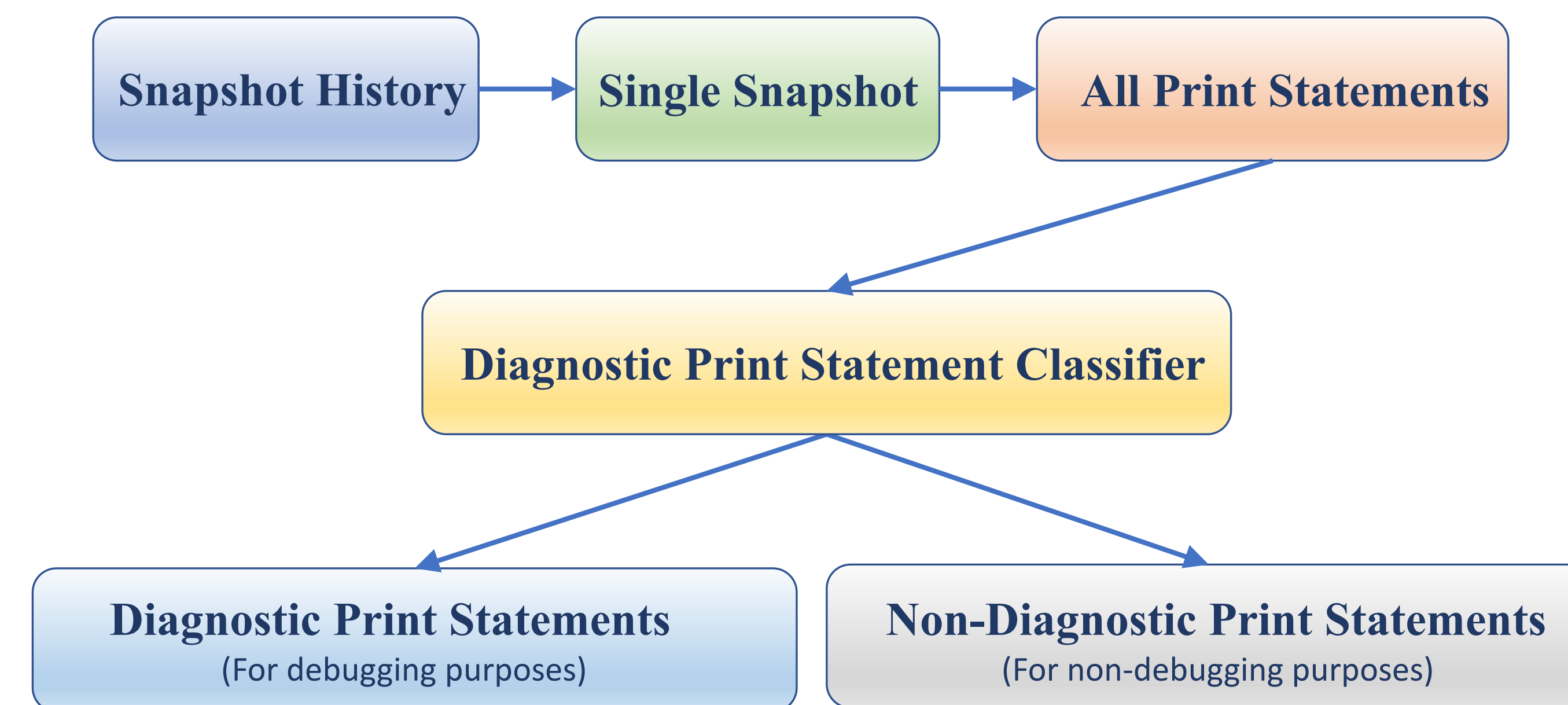
DPS Examples

```
System.out.print(tempValue);
```

```
System.out.print("Success!");
```

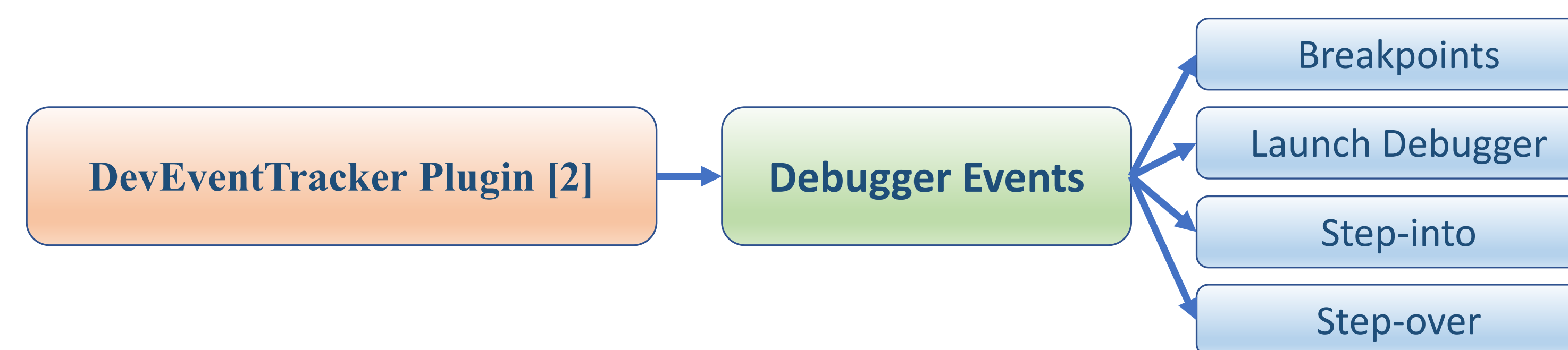
Extracting Debugging Behavior

1. Extracting DPS from Code Snapshots



2. Extracting Eclipse Debugger Events via DevEventTracker* [2]

* Eclipse-based click-stream data collector



Findings

Distribution of Different Debugging Techniques

- **87.21%** of students used the DPS
- **75%** of students used the Eclipse Debugger.
- Most students use both the DPS and the Eclipse Debugger.
- Debugging early and often showed a weak positive correlation with project performance.

$$\text{corr coeff} = 0.19 \quad p - \text{value} < 0.001$$

Preliminary Evaluation using DPS Classifier

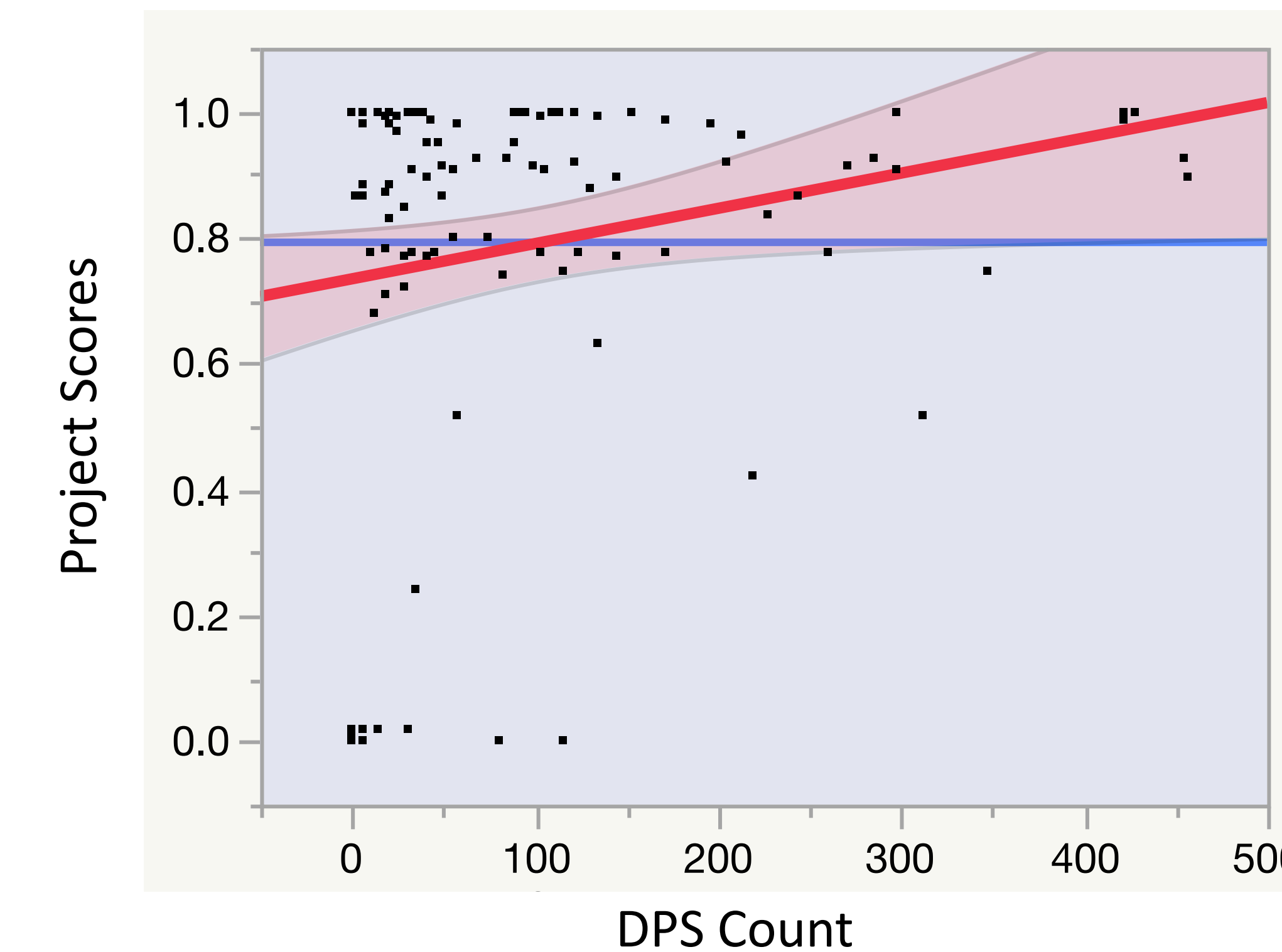
- **12** sample projects (3 samples from 4 different Projects)
 - Print Statements: Total 1467* ($\mu = 122, \sigma = 89$)
 - DPS: Total 611* ($\mu = 51, \sigma = 54$)
- (* for all the intermediate snapshots)

Accuracy: 100%

Therefore, this classifier works well on this dataset.

Relationship with Project Score

1. Project Score vs DPS



$$p - \text{value} = 0.0347$$

$p - \text{value} < \alpha$ (0.05)
Hence, there is significant evidence that project scores correlate to DPS count.

$$R^2 = 0.0456$$

Therefore, 4.56% variability in the project score can be explained by DPS count.

Figure: Project Score vs DPS Count (for Project 1)

2. Project Score vs Debugger Events

- More Debugger Events (step over, step into) → lower Project Score
(The same student performed better in another project)
 - Step over: $p - \text{value} = 0.039$ and Step into: $p - \text{value} = 0.005$
- Therefore, students tend to get lower Project Scores when they spend too much time on the **same bug**.

Key Results

- Students tend to perform better on the project when debugging takes place earlier in the overall project life-cycle.
- There is weak yet statistically significant evidence that both DPS and Debugger Events correlate to overall Project Score.
- Only 4.56% variability in Project Score can be explained by overall DPS count

Future Work

- We plan to focus on individual debugging sessions to find if one type of debugging technique is more effective than another.
- We plan to find out how the students verify that the bug is fixed, such as manual checking, writing new test-cases, and/or by submitting the project for evaluation.

References

- [1] Murphy, Laurie, et al. "Debugging: the good, the bad, and the quirky--a qualitative analysis of novices' strategies." ACM SIGCSE Bulletin. Vol. 40. No. 1. ACM, 2008.
- [2] Kazerouni, Ayaan M., et al. "DevEventTracker: Tracking development events to assess incremental development and procrastination." Proceedings of the 2017 ACM Conference on Innovation and Technology in Computer Science Education. ACM, 2017.

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