# Formal Methods in Software Support for Sound Experimentation





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## Motivating Challenge:

No automated enforcement nor validation of consistency between hypotheses, experiments, and analyses; undetected violations of internal validity can lead to issues with replication and reproducibility.

# <u>Approach:</u>

- **Domain-specific languages** for encoding hypotheses and experiments.
- Enforce **consistency** via program analysis.
- Integrate with legacy tooling for both data collection and statistical analyses.

1. You have a hypothesis; *HyPL* helps: *Optimization level -O3 is better than -O2*  # HyPL encoding of prior work as described in # Mytkowicz et al., ASPLOS 2009 O : { '-O2, '-O3 } P : nat

#### (programs) P <- O (programs) assert (P | O = '-O3) > (P | O = '-O2)



rams) **do** 

Image: marked state

2. You create your experiment in *ExPL*: Helical detects you're testing a specific *refined* hypothesis.

I better rework my experiment; it can be better!

3. You can rework your hypothesis or collect data.This ex: Helical ensures the effect of *Optimization* on *Performance* is identifiable.

# Corresponding ExPL encoding

for optlevel in O do

done

done

done

for prog in config.benchmarks @(samples prog

run prog.compile optlevel > @(intervenes O)

run config.timing prog.exec > @(measures P)

for trialid in [1..config.ntrials] @(samples mstate) do





# **Solution:**

- Specification language and tool support to tightly couple hypotheses and experiments.
- Static and dynamic analysis tools to automate checking that statistical analyses are consistent with hypotheses and data collection.

# **Broader Scientific Impacts**

- Empirical Sciences: Encoding past studies yields novel insights into sources of (in)validity.
- Formal Methods: Hypotheses as types for experiments.
- Aid in **replication**, **reproducibility**, and **auditing**, reducing overhead to validate findings.

### **Broader Impacts**

- FOSS with target user population beyond computing
- Jupyter notebook extension for interactive experimental design to support adoption
- Potential to identify scientific misinformation or invalid studies generated by malicious Al

# Grant Outputs

- Workshop keynote on artifact evaluation
- PostDoc mentorship at NEU
- Robotics & Software Engineering Seminar Talks
- NEU Coop Student funding and mentorship (Kevin Yang)
- Three UVM Graduate Students involved in early work

#### The NSF Formal Methods in the Field PI Meeting (2024 FMitF PI Meeting) November 12-13, 2024 | The University of Iowa | Iowa City, Iowa