

### Challenge:

It is extremely difficult to reason about **large-scale probabilistic systems** due to the inherent state-space explosion of probabilistic behavior

→ **Consequence:** difficult to verify probabilistic systems (for instance, in machine learning)

**Solution:** New approaches for modularly decomposing large probabilistic systems into smaller ones.

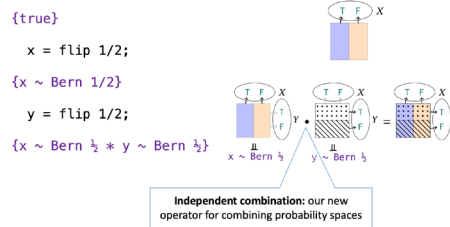
- **Lilac:** a modal separation logic for conditional probability. Decompose probability with separation logic
- **MultiPPL:** a multi-language approach to probabilistic programming language design. Decompose probabilistic reasoning along language boundaries.

Award #2220408

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## Lilac: A Probabilistic Separation Logic for Conditional Probability



## MultiPPL: Multi-Language Probabilistic Programming

```

1 let x be flip 0.20 in
2 (let Y be flip 0.25 in
3  observe (x)E ∨ Y in
4  ret Y)S
    
```

### Scientific Impact:

- New approaches and foundations to probabilistic separation logic that enable scalable modular verification of probabilistic systems
- More scalable and broadly applicable probabilistic verification for machine learning and randomized algorithms
- More scalable and automated probabilistic programming languages

### Broader Impact and Broader Participation:

- *Broad impact:* More usable machine learning and probabilistic reasoning for broad audiences
- *Deployment:* tools deployed at Sandia National Laboratories, collaboration on papers.
- *Educational impact:* new course on probabilistic programming at the Oregon Programming Languages Summer School 2024, presentations at the Programming Languages Mentorship Workshop, new course on probabilistic programming languages at Northeastern University

