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Bodik



ExCAPE
Expeditions in Computer Augmented
Program Engineering



Martin

Expeditions in Computer Augmented Program Engineering

<http://excape.cis.upenn.edu/>



Alur

Cornell, Maryland, Michigan, MIT, Penn, Rice, UC Berkeley, UCLA, UIUC

NSF Expeditions PI Meeting, May 2013



Pappas



Zdancewic



Vardi



Tripakis



Tabuada



Solar-Lezama



Seshia



Sangiovanni

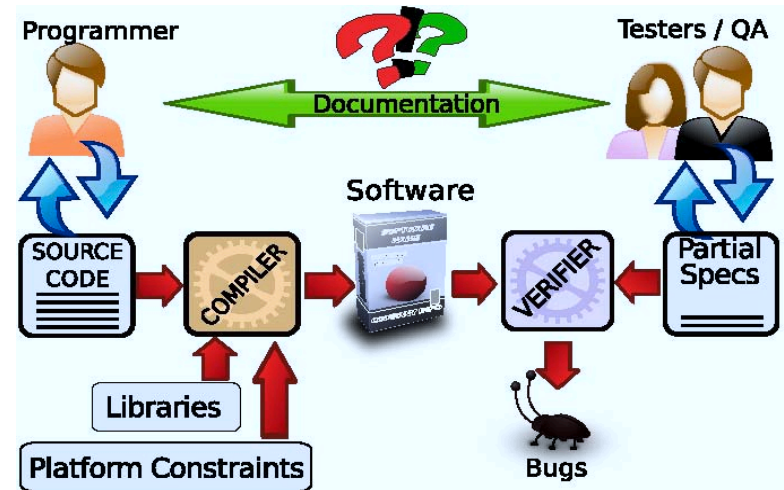
Software Design Methodology

❑ What has changed:

- ◆ Programming languages
- ◆ Libraries
- ◆ Verification technology

❑ What has not changed:

- ◆ Programming is done by experts
- ◆ Fully specified by conventional programming
- ◆ Verification phase is distinct from design



Can we leverage modern analysis tools and increased computing power to revolutionize the task of programming?



Synthesis: A Plausible Solution ?

- Classical: Mapping a high-level (e.g. logical) specification to an executable implementation
 - ◆ Theoretical foundations: Church (1960s)
 - ◆ Derivation of programs from constructive proofs (e.g. Kestrel)
 - ◆ Synthesis from temporal logic specs: Clarke/Emerson (1980s)
 - ◆ Refinement in model-based design
 - ◆ Ongoing progress, but many challenges remain...

- Recent shift in focus: Integrating different styles of specifications in a consistent executable

Sketch: Program completion

Ref: Solar-Lezama et al (PLDI 2010)

```
Err = 0.0;
for(t = 0; t < T; t += dT){
  if(stage == STRAIGHT){
    if(t > ??) stage = INTURN;
  }
  if(stage == INTURN){
    car.ang = car.ang - ??;
    if(t > ??) stage = OUTTURN;
  }
  if(stage == OUTTURN){
    car.ang = car.ang + ??;
    if(t > ??) break;
  }
  simulate_car(car);
  Err += check_collision(car);
}
Err += check_destination(car);
```

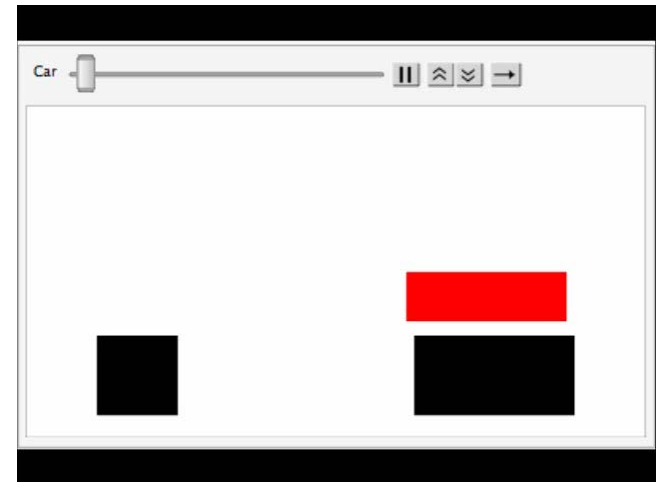
When to start turning?

Backup straight

How much to turn?

Turn

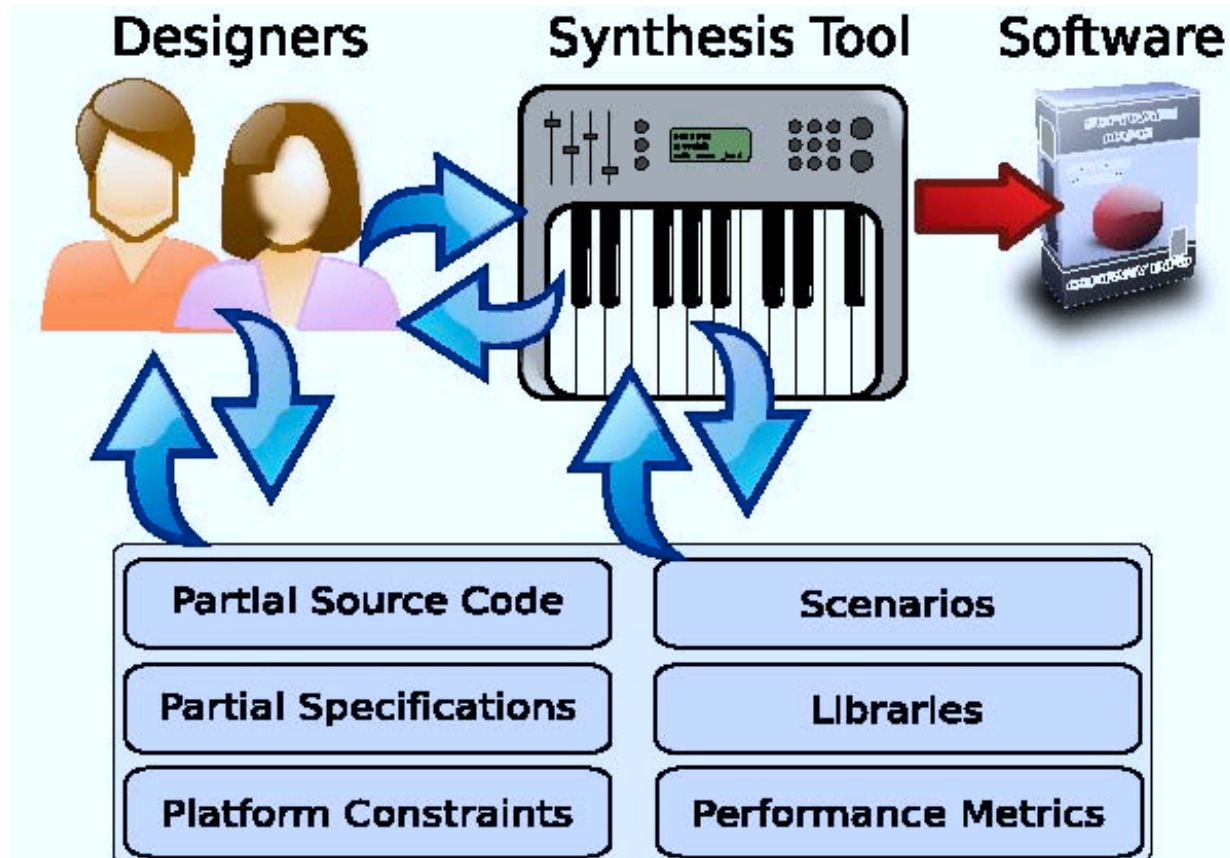
Straighten



Enables programmers to focus on high-level solution strategy

ExCAPE Vision

Harnessing computation to transform programming:
Programming made easier, faster, cheaper

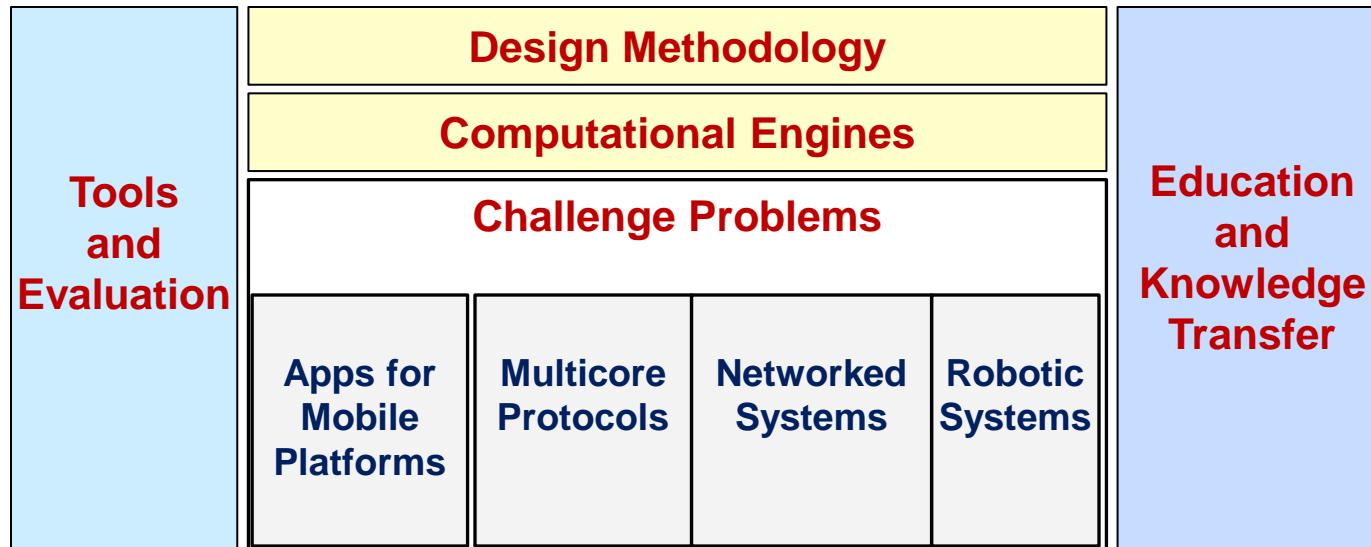


Synthesis Tool: Intelligent Assistance



- ❑ Designer expresses "what", possibly using multiple input formats
- ❑ Synthesizer discovers new artifacts via integration and completion
- ❑ Synthesizer solves computationally demanding problems using advanced analysis tools
- ❑ Interactive iterative design
- ❑ Integrated formal verification

Research Organization



Talk Outline

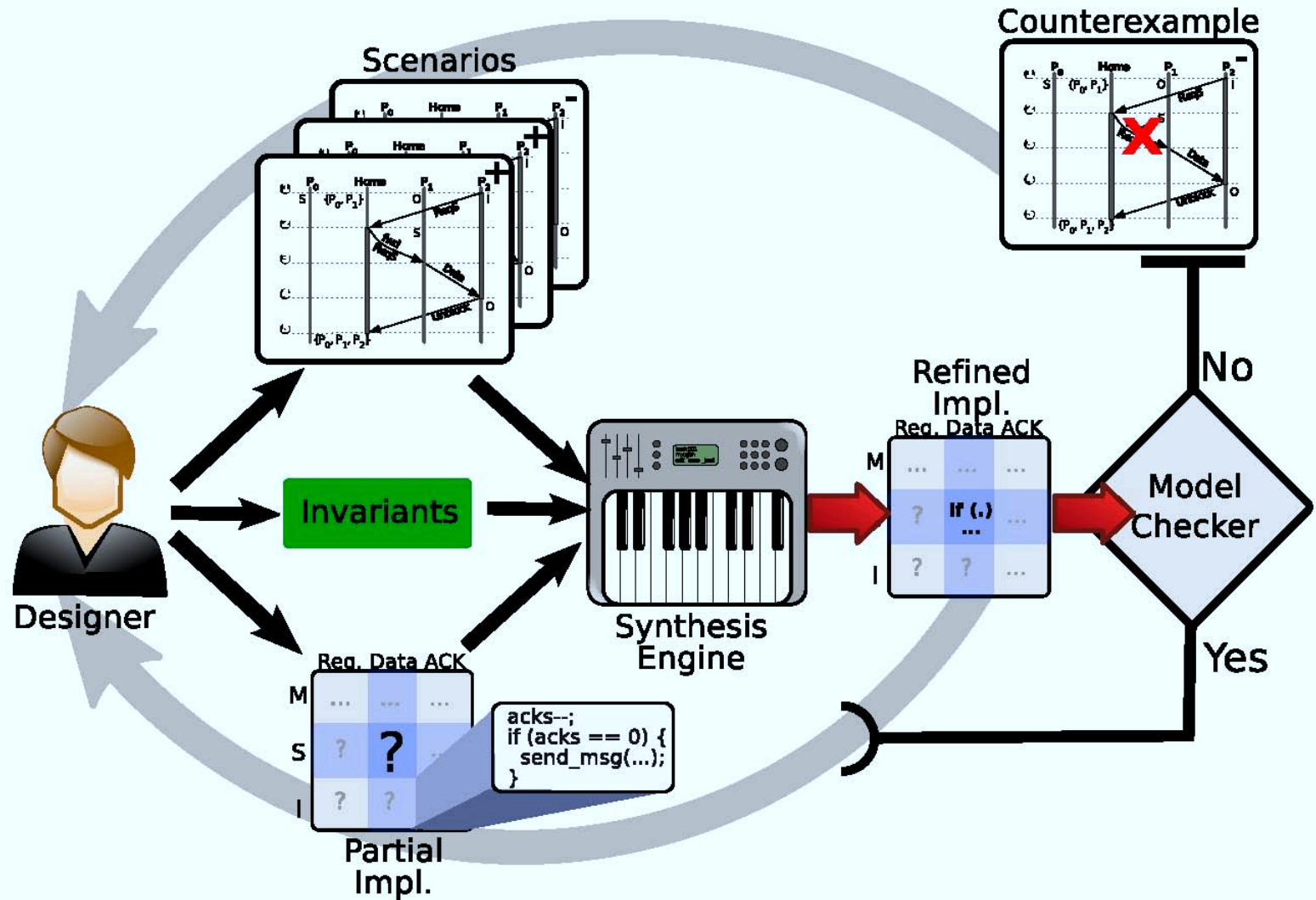
- ❑ Design tool for distributed protocols
- ❑ Synthesis for programming robots
- ❑ Synthesis to support online education
- ❑ Summary of ExCAPE activities

Goal: Simplify Protocol Design

- ❑ Design challenging due to asynchronous model of communication
- ❑ Cache coherence protocols, Distributed coordination algorithms
- ❑ Successful application domain for formal verification / model checking
- ❑ Correctness involves both safety and liveness properties
- ❑ Proposed solution: Allow programmers flexibility

Protocol = **Skeleton based on Extended-Finite-State-Machines**
 + High-level requirements
 + Example behaviors

TRANSIT for Distributed Protocol Design



Computational Problem

□ Inputs:

- ◆ Variable types and corresponding expression grammar
- ◆ For each process,
 1. Control states of EFSM
 2. List of all variables , input/output messages
 3. Set of concrete examples + symbolic constraints
- ◆ High-level requirements (invariants and temporal logic formulas)

□ Solution strategy:

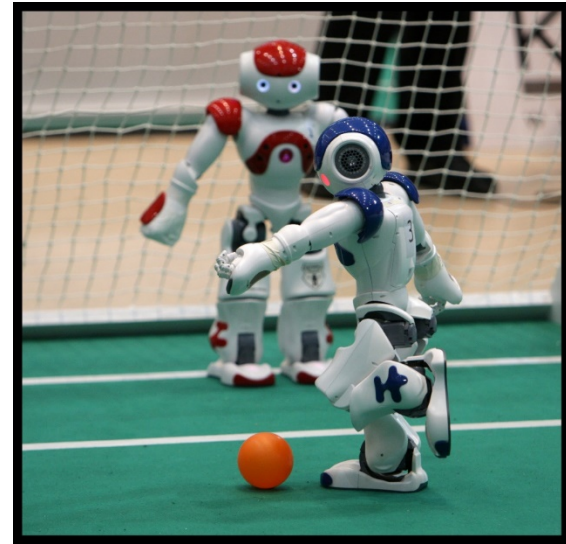
- ◆ **Expression Inference:** For each EFSM transition, generate expressions for guards and updates. Solution uses Counter-example-guided-inductive synthesis using SMT solver Z3
- ◆ Check if resulting protocol meets all requirements, using a model checker (Murphi) and if not, report a counter-example

Challenging Case Study: SGI Origin protocol

- ❑ Source: Laudon and Lenoski; The SGI Origin: A CCNUMA highly scalable server; ISCA 1997
- ❑ Directory-based MESI protocol that handles multiple concurrent requests to same requests over unordered network
- ❑ Textual description directly leads to protocol skeleton, and symbolic (incomplete) descriptions of most of the transitions
- ❑ During debugging, programmer focuses on local fixes of countexamples and adds concrete examples
- ❑ Final iteration required 30 min synthesis time (with 5 Million states explored by Murphi)
- ❑ SMT solver / model checker in the loop is feasible for programming

Synthesis for Robot Programming

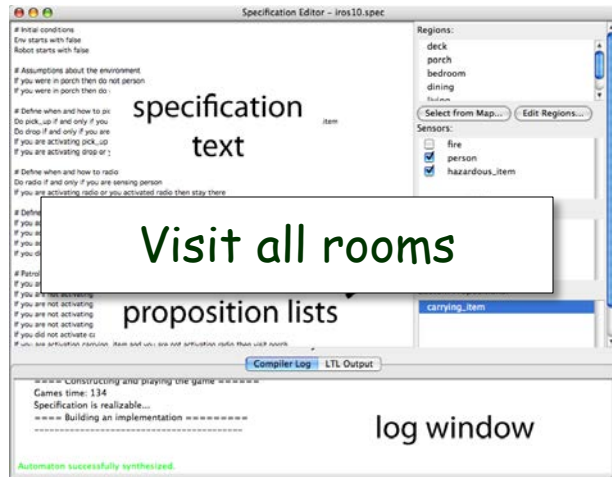
Goal: Allow end-users to program robotic behaviors



Robotic controllers: Research Challenges

- ❑ How to consistently integrate physical constraints, sample trajectories, safety rules, and language/temporal-logic requirements?
- ❑ How to explain infeasible requirements? How to suggest potential fixes?
- ❑ How to program a synthesis engine with completion strategies that take into account the physical and continuous nature of robotics (power, safety, environment traversability)?
- ❑ How to address optimality and performance?
- ❑ How to evaluate human-robot interaction?
- ❑ How to generate control that ports across different robots (different dynamics, control capabilities, safety considerations)?

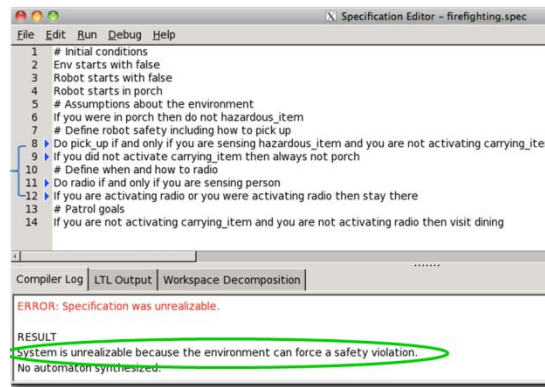
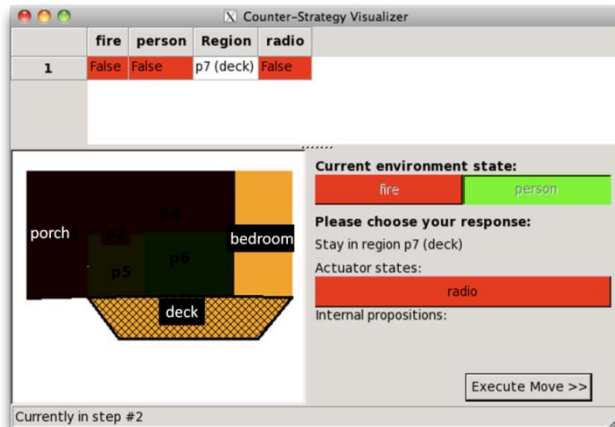
LTLMoP: Robot control from structured English



Feasible specification



Unsynthesizable specification

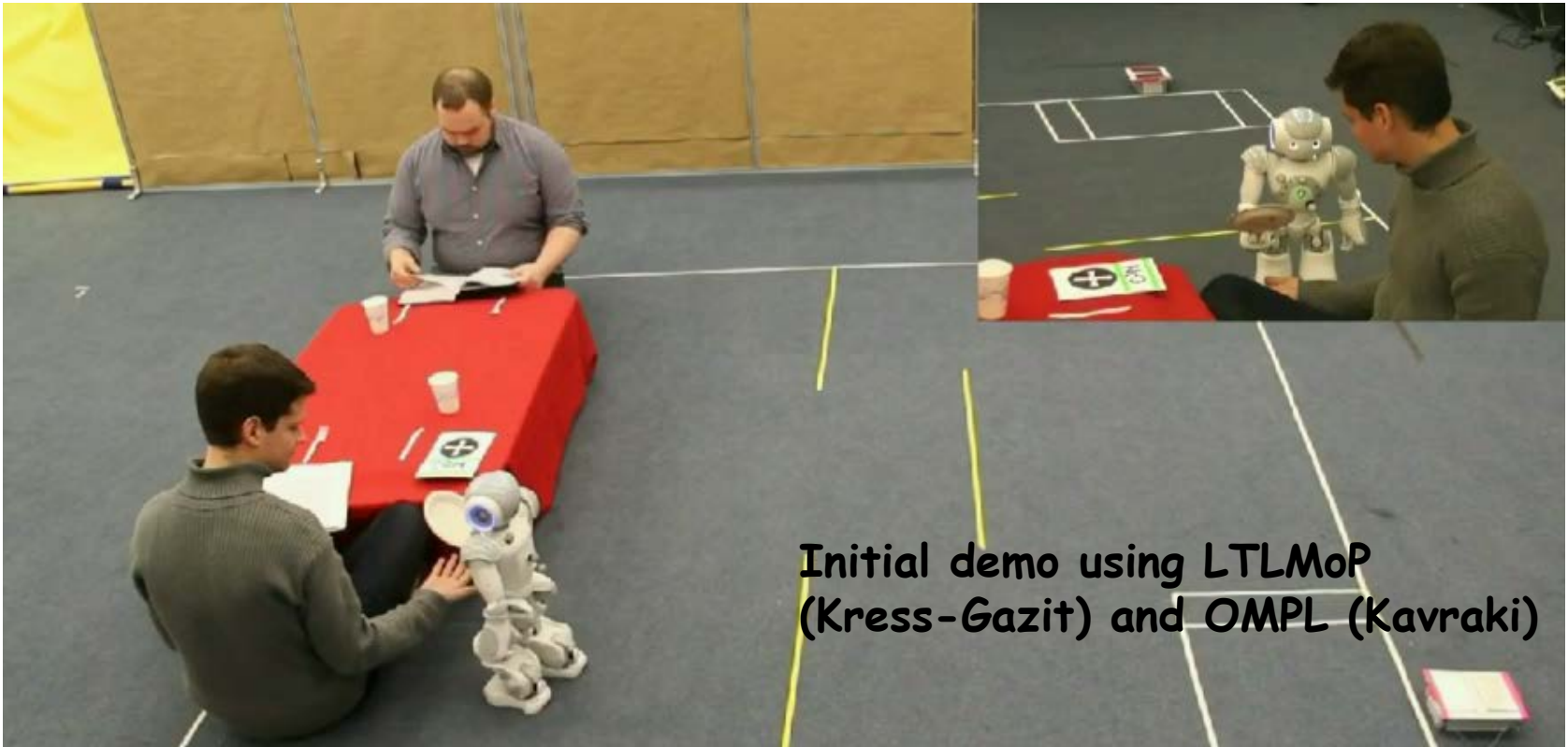


Research Results

- ❑ Improving the scalability of core engine for mapping Temporal Logic formulas to Controllers:
 Synthesis with identifiers (Kress-Gazit, Seshia)
- ❑ Synthesis of cost-optimal plans (Kress-Gazit)
- ❑ Motion planning in partially unknown environments (Kavraki, Vardi)
- ❑ Synthesis of controllers with robust performance in presence of uncertainties
 Theory of robustness for hybrid systems (Tabuada)
- ❑ Accuracy in mapping discrete actions to continuous-time trajectories with durations (Kress-Gazit)
- ❑ Automatic generation of environment assumptions (Alur, Topcu)

Ongoing Case Study: Robotic Waiter

- ❑ Challenges: Scalability (items, costumers), uncertainty in sensing and actuation, optimality of behavior, fault recovery
- ❑ Future plans: exploit symmetries, robust synthesis, task specific abstractions



Initial demo using LTLMoP (Kress-Gazit) and OMPL (Kavraki)

Synthesis for Online Education

- Emerging opportunity: MOOCs



- Challenge: Personalized feedback on assignments

- ◆ Manual feedback by TAs (not scalable)
- ◆ Grading by peers (not reliable)
- ◆ Evaluation on test cases (how to translate failed tests to errors?)

- Application for ExCAPE tools for synthesis

- ◆ Introductory programming assignments (Solar-Lezama, MIT)
- ◆ Scheduling problems in Embedded Systems course (Seshia, UC Berkeley)
- ◆ DFA construction in Theory of Computation (with Hartmann, UC Berkeley)
see automatatutor.com

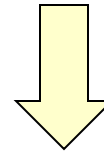
Sample Problem: Derivative of a Polynomial

```
def computeDeriv(poly):  
    result = []  
    for i in range(len(poly)):  
        result += [i * poly[i]]  
    if len(poly) == 1:  
        return result # return [0]  
    else:  
        return result[1:] # remove the leading 0
```

Autograder Output on a Student Solution

```
1 def computeDeriv(poly):
2     deriv = []
3     zero = 0
4     if (len(poly)==1):
5         return deriv
6     for e in range(0, len(poly)):
7         if (poly[e]==0):
8             zero += 1
9         else:
10            deriv.append(poly[e]*e)
11
12    return deriv
```

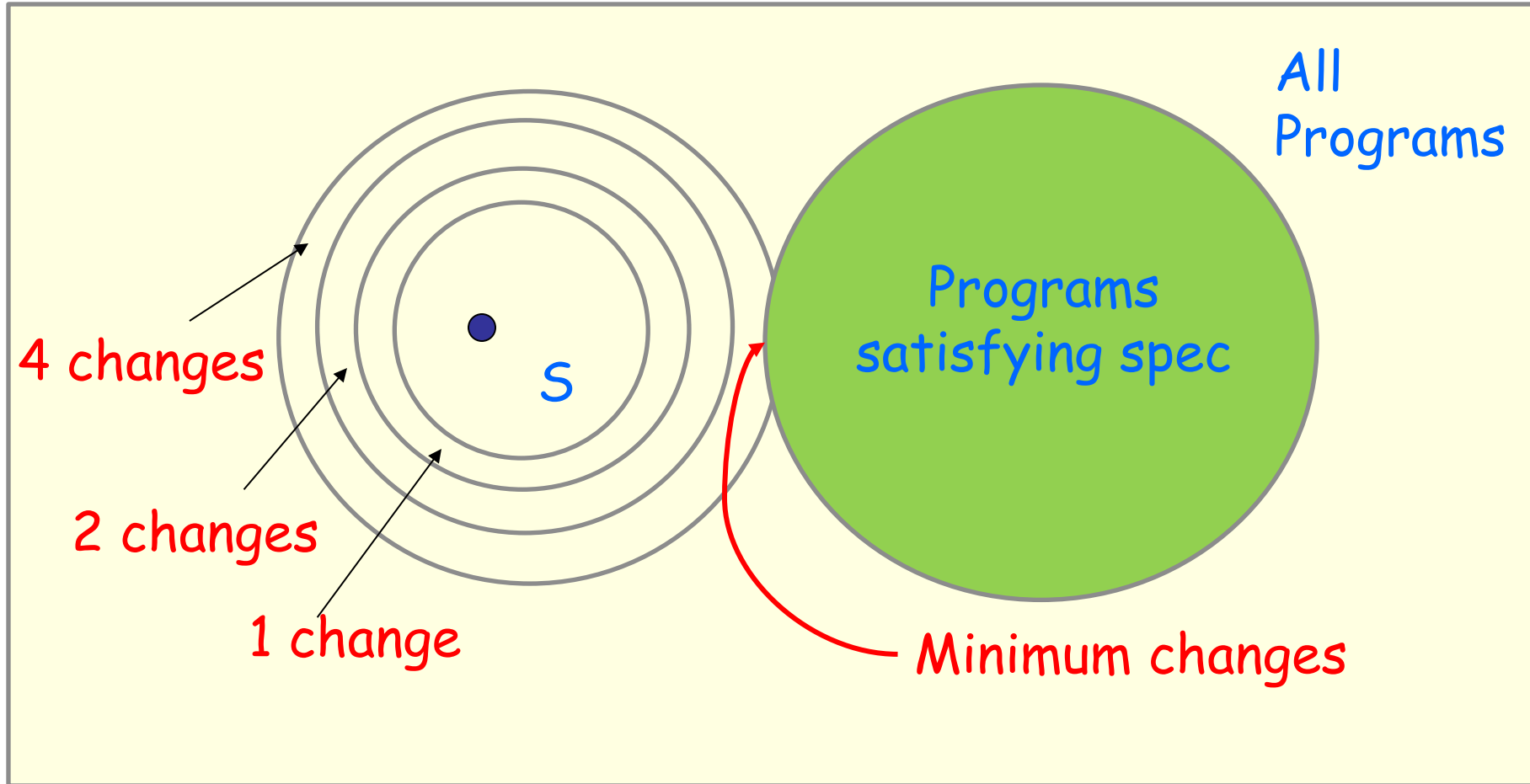
Student Solution
+ Reference Solution
+ Error Model



The program requires **3** changes:

- In the return statement **return deriv** in **line 5**, replace **deriv** by **[0]**.
- In the comparison expression (**poly[e] == 0**) in **line 7**, change (**poly[e] == 0**) to **False**.
- In the expression **range(0, len(poly))** in **line 6**, replace **0** by **1**.

Computational Engine: Sketch Synthesis Tool



S: Student Solution

Autograder Experiments (MIT 6.00)

Benchmark	TestSet	Generated Feedback	Percentage	AvgTime(s)
prodBySum-6.00	268	218	81.34%	2.49
oddTuples-6.00	344	185	53.78%	2.65
compDeriv-6.00	103	88	85.44%	12.95
evalPoly-6.00	13	6	46.15%	3.35
compBal-stdin-6.00	52	17	32.69%	29.57
compDeriv-6.00x	918	753	82.03%	12.42
evalPoly-6.00x	541	167	30.87%	4.78
oddTuples-6.00x	1756	860	48.97%	4.14
iterPower-6.00x	2875	1693	58.89%	3.58
recurPower-6.00x	2938	2271	77.30%	10.59
iterGCD-6.00x	2988	2052	68.67%	17.13
hangman1-6.00x	351	171	48.72%	9.08
hangman2-6.00x	218	98	44.95%	22.09

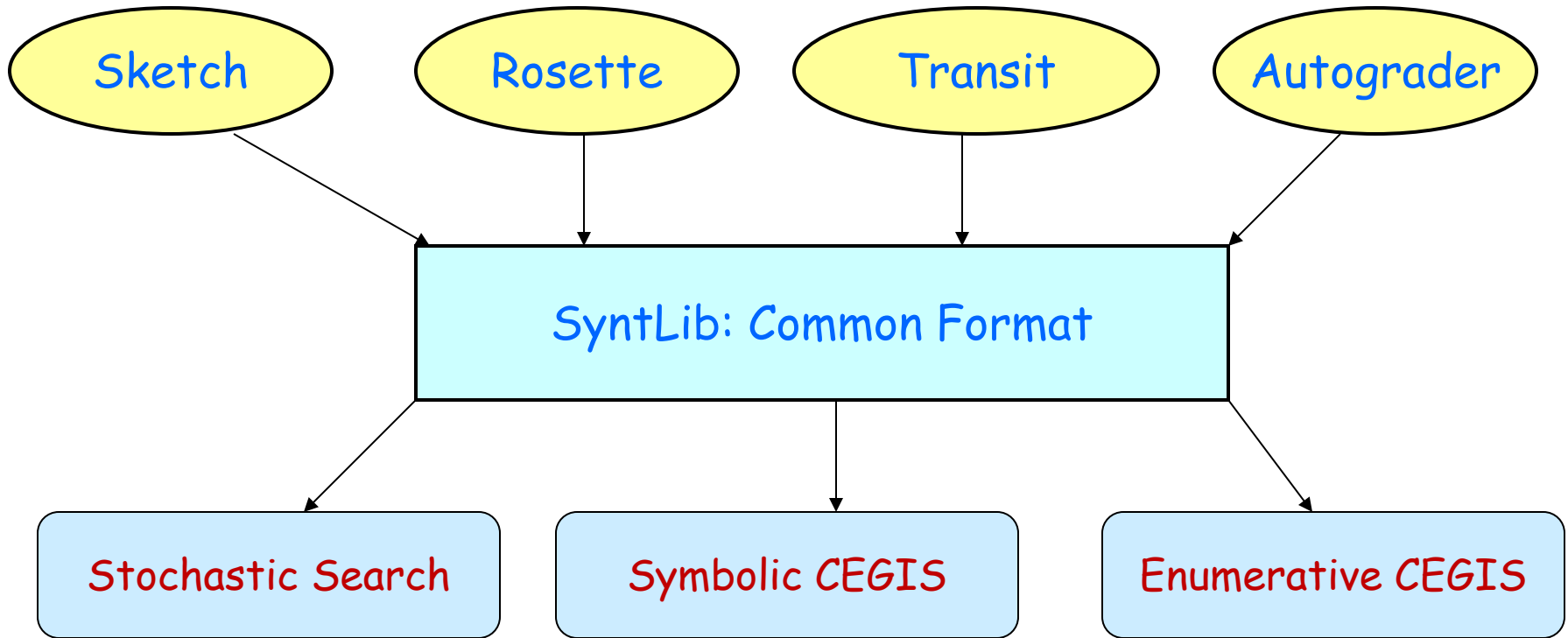
64%

9.9s

Theory / Methodology / Tools / Application domains

- ❑ Rosette: Framework for developing synthesis-enhanced DSLs (Bodik)
- ❑ Enhancements to Sketch to support modularity (Solar-Lezama)
- ❑ Bridging the gap between reactive synthesis and supervisory control (Lafortune, Tripakis, Vardi)
- ❑ Verified LLVM Infrastructure (Martin, Zdancewic)
- ❑ Platform-based design for software synthesis (Sangiovanni-Vincetelli)
- ❑ Synthesis of logic for avoiding concurrency bugs (Lafortune)
- ❑ Component-based synthesis for probabilistic systems (Vardi)
- ❑ Theory of regular functions for quantitative analysis (Alur)
- ❑ Automated cloud configuration using synthesis (Alur, Loo, Parthasarathy)
- ❑ Route Shepherd for configuration of routing protocols (Loo)
- ❑ Synthesis of control + scheduling for wireless control networks (Pappas)
- ❑ Programming for mobile platforms (Foster, Solar-Lezama)
- ❑ User studies for improving programming notations (Hartmann)

Template-based Synthesis Modulo Theories



Based on input format for SMTLib 2

Problem: Given a formula ϕ in an SMT theory with an extra function symbol f , and context-free language L for templates, find an expression e in L such that $\phi[f/e]$ is valid

Basis for synthesis competition (to be held at CAV 2014)

Education and Outreach

- ❑ ExCAPE Summer School: June 13–16, Berkeley; 125 registrants
 - Tutorials: Reactive synthesis (Vardi)
 - Constraint-based program synthesis (Bodik)
 - Synthesis for cyber-physical systems (Tabuada)
 - + Talks
- ❑ ExCAPE Webinar: Monthly talks on diverse topics
- ❑ Sponsored workshops
 - SYNT (at CAV 2013, by Solar-Lezama)
 - Synthesis for robotics (at RSS 2013, by Kavraki and Kress-Gazit)
 - Special session on synthesis at ACC 2013 (by Lafortune)
- ❑ Graduate course at Berkeley: Program synthesis for everyone
- ❑ K-12 programs: CURIE @ Cornell

Rotating Postdoc Program

- Each ExCAPE postdoc has two mentors, at two different institutions

- Year 2012-13:
 - Ruediger Ehlers (Robotics)
 - Mentors: Kress-Gazit (Cornell), Seshia (UC Berkeley)

- For the upcoming year:
 - Xiaokang Qiu (UIUC), Apps for mobile platforms
 - Mentors: Foster (Maryland), Solar-Lezama (MIT)
 - Indranil Saha (UCLA), Robotics
 - Mentors: Pappas (Penn), Seshia (UC Berkeley)
 - Christos Stergiou (UC Berkeley), Multicore protocols
 - Mentors: Martin (Penn), Tripakis (UC Berkeley)
 - Damian Zufferey (IST Austria), Networked systems
 - Mentors: Loo (Penn), Parthasarathy (UIUC)



EXCAPE
Expeditions in Computer Augmented
Program Engineering



- ❑ Paradigm shift in synthesis:

 - Old: Allow more concise, high-level description

 - New: Designer uses multiple, natural formats,
Synthesis tool assists in discovering tricky logic

- ❑ Paradigm shift in design tools:

 - Old : Any compiler transformation must be polynomial-time

 - New: Computational intractability not a show-stopper

- ❑ Common theme: Guided search in a space of programs to find one that meets multiple design goals

 - A bit like model checking, but can be interactive!