



STATIC ENERGY PREDICTION IN SOFTWARE: A WORST-CASE SCENARIO APPROACH

Marco Couto

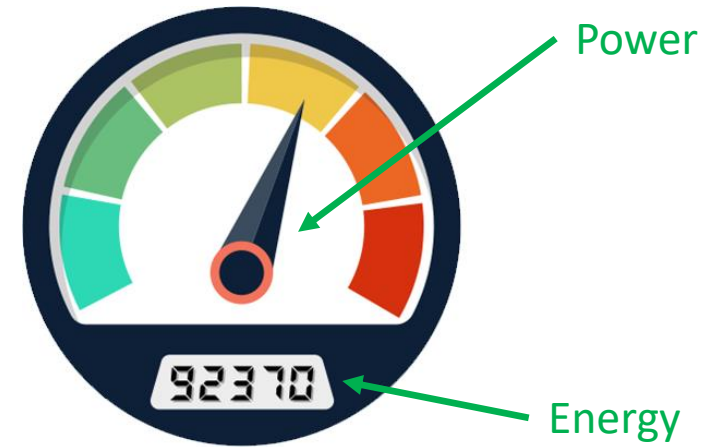
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MOTIVATION

ENERGY VS. POWER

- *Power* (w) - rate (or effort) at which that work is done
- *Energy* (J) - amount of work done
- *Power* can change constantly while *Energy* is the accumulation



$$\text{Energy} = \text{Power} \times \text{Seconds}$$



$$360,000 \text{ J} = 100\text{W} \times 3,600\text{s}$$

ENERGY EFFICIENT SOFTWARE

- Programmers problems:
 - How to analyze
 - How to interpret
 - How to improve
- Researchers problem:
 - How to provide information to developers



Mining questions about software energy consumption

- [MSR'14]

Integrated energy-directed test suite optimization

- [ISTA'14]

Seeds: A software engineer's energy-optimization decision support framework

- [ICSE'14]

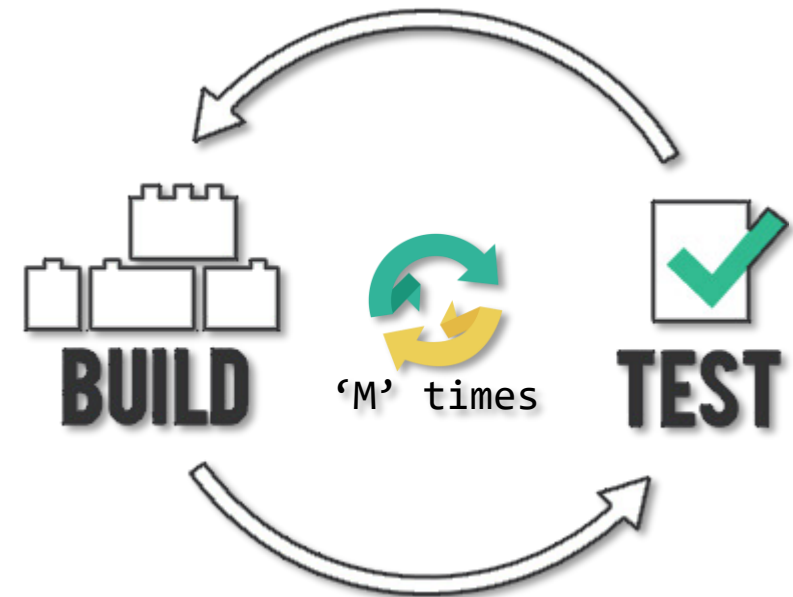


THE CHALLENGE

STATIC ENERGY ANALYSIS

WHY?

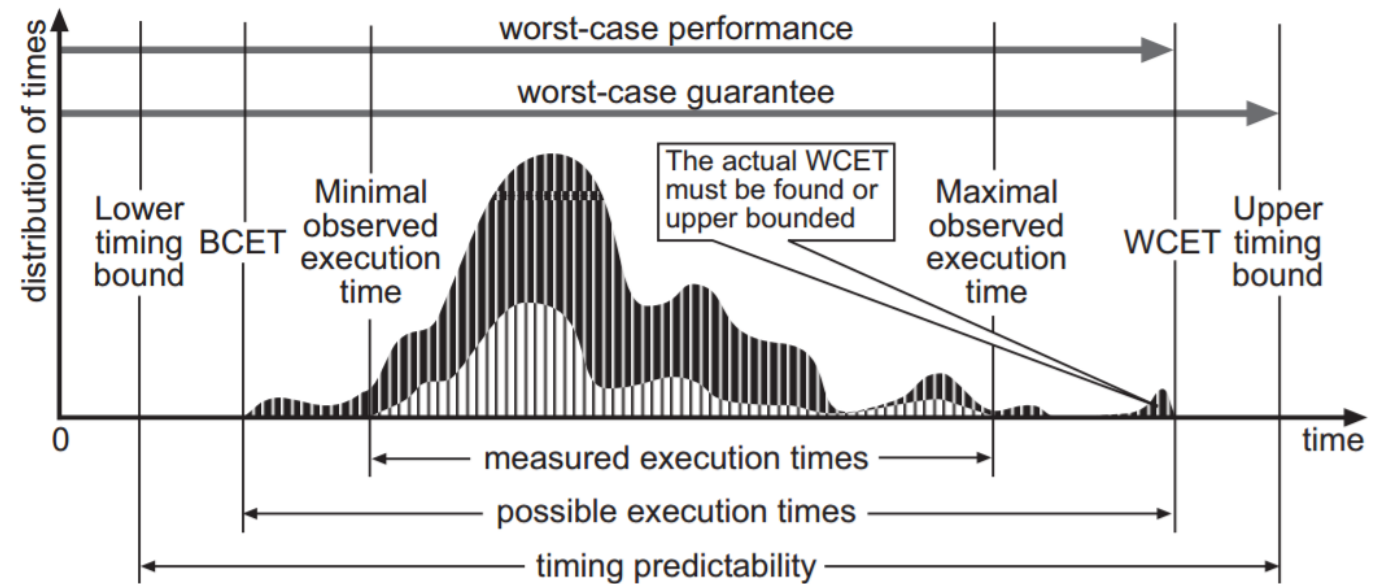
- Dynamic can be too costly
 1. Build application + tests
 2. Instrument app and/or tests
 3. Run tests
 4. Gather measurements and analyze them
 5. Repeat N times
- 'M' apps -> Repeat all 'M' times
- Are all cases covered?



STATIC ENERGY ANALYSIS

HOW?

- How is it done for execution time?
 - WCET - Worst Case Execution Time

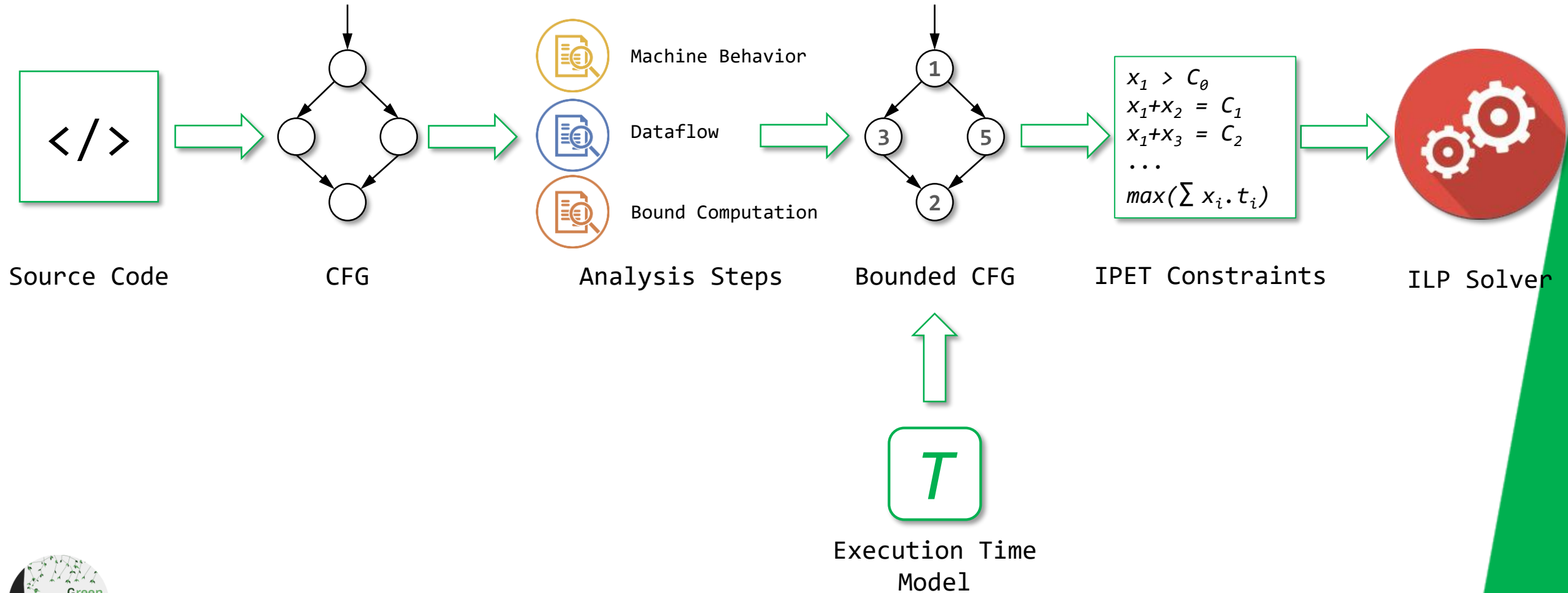


- Can we do the same for energy?

STATIC ~~ENERGY~~ EXECUTION TIME ANALYSIS

HOW?

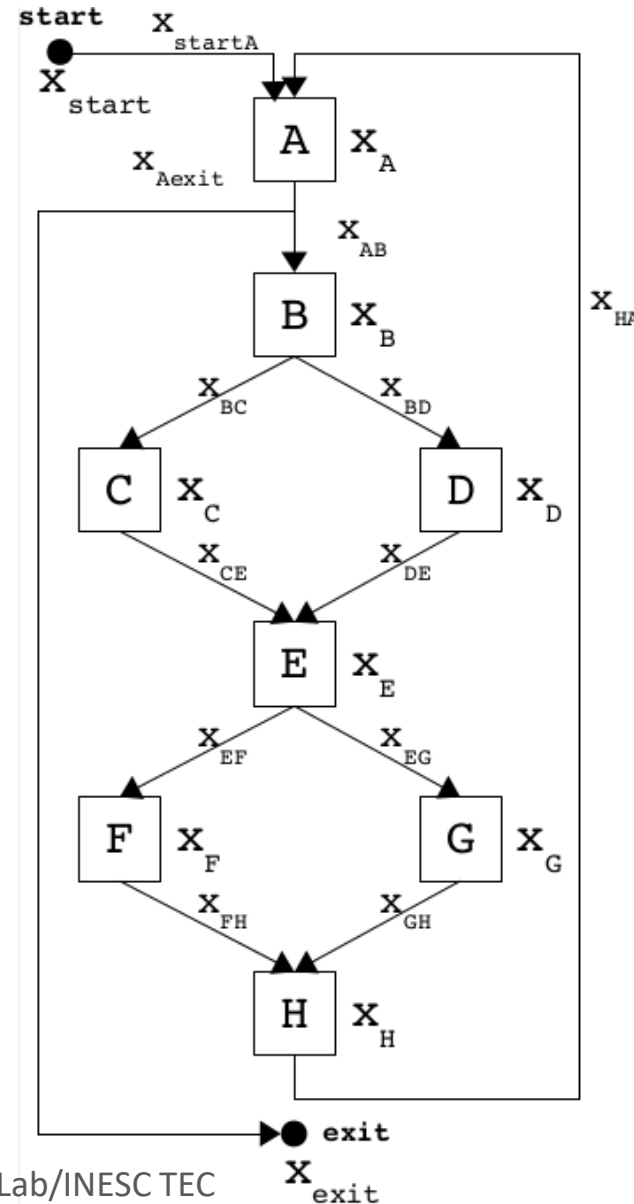
How exactly does WCET works?



IPET - IMPLICIT PATH ENUMERATION TECHNIQUE

A.K.A CONSTRAINT GENERATOR

- Each node has:
 - A count variable, 'x'
 - A cost variable, 't'
- Each edge has:
 - A count variable, 'x'
- 4 Simple but strong premises:
 1. Start and end nodes accessed exactly 1 time
 2. #x of node i = sum (#x of all pred. of i)
 3. #x of node i = sum (#x of all succ. of i)
 4. Loops must have na upper bound



//start and exit conditions

$$x_{start} = 1, x_{exit} = 1$$

//structural conditions

$$x_{start} = x_{startA}$$

$$x_A = x_{startA} + x_{HA} = x_{Aexit} + x_{AB}$$

$$x_B = x_{AB} = x_{BC} + x_{BD}$$

$$x_C = x_{BC} = x_{CE}$$

...

$$x_H = x_{FH} + x_{GH} = x_{HA}$$

$$x_{exit} = x_{Aexit}$$

//Loopbound constraint

$$x_A \leq 100$$

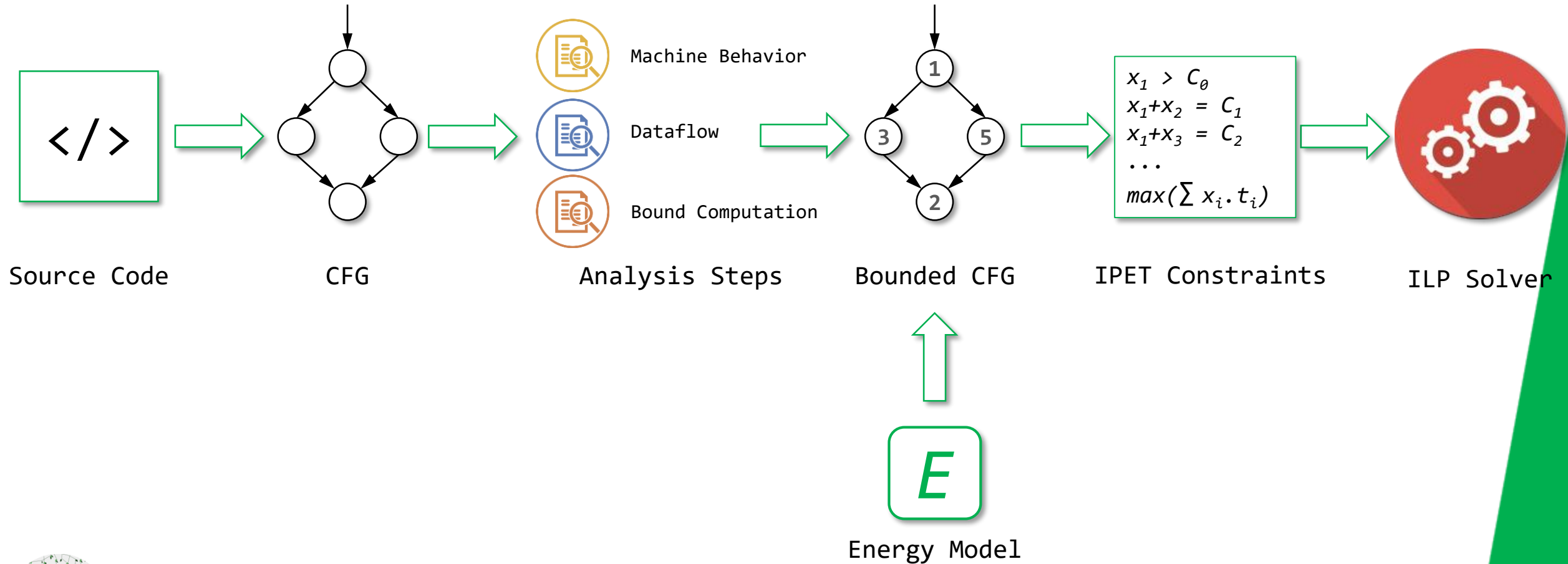
//WCET Expression

$$WCET = \max(x_A * t_A + x_B * t_B + \dots + x_H * t_H)$$

STATIC ENERGY ANALYSIS

HOW?

How exactly does WCEC works?





ENERGY MODEL

HOW TO BUILD IT?

BUILDING THE ENERGY MODEL

Estimating Mobile Application Energy Consumption using Program Analysis - [ICSE'13]

- Two types of instructions:
 - Path-Independent:
 - `x=1;`
 - `i++;`
 - `a=2*b;`
 - `return 0;`
 - Path-Dependent:
 - Allocations: `malloc(sizeof(int))` \neq `malloc(sizeof(double))`
 - System calls: `scanf("%d", &a)` \neq `scanf("%f", &a)`
 - Other functions: `strcmp(...)`, `atoi(...)`, `sizeof(...)`, ...
- Some instructions depend on others:
 - `'int x = z;'` depends on the declaration of `z`
 - `'printf("%d", a);'` assumes `a` has a previous assigned value



BUILDING THE ENERGY MODEL

Estimating Mobile Application Energy Consumption using Program Analysis - [ICSE'13]

- Path-Independent:
 - Execute **N** times
 - Repeat **M** times, measure each time and **sum** all
 - At the end: $energy = (sum/M/N) - dependencies$
- Path-Dependent:
 - Execute **N** times
 - Repeat **M** times, measure each time
 - At the end: $energy = max(all\ measures) - dependencies$



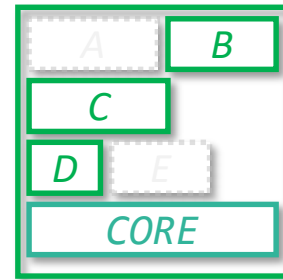
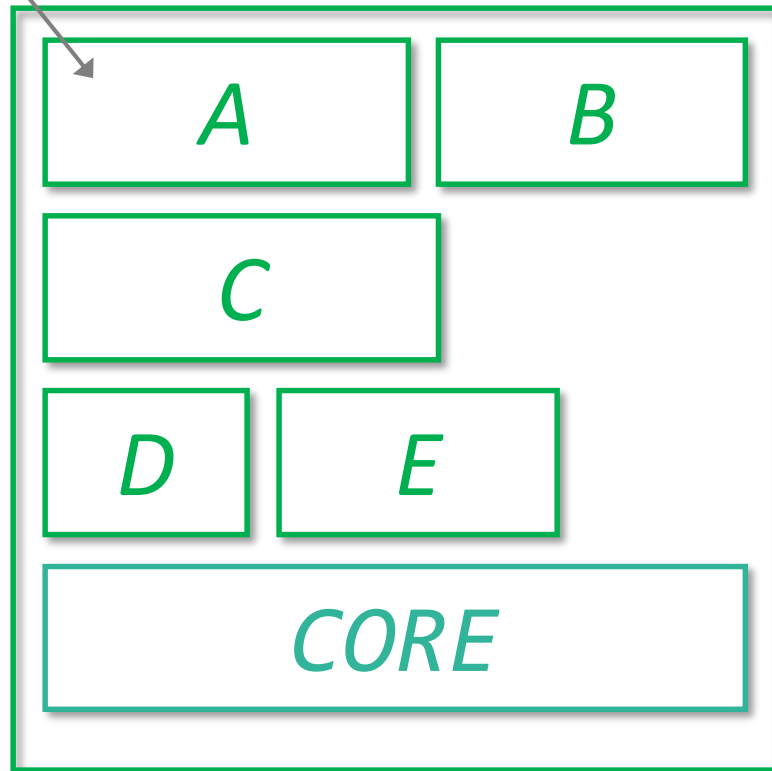


SOFTWARE PRODUCT LINES

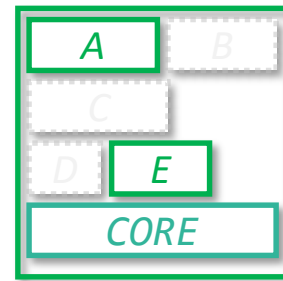
THE CASE STUDY

SOFTWARE PRODUCT LINE

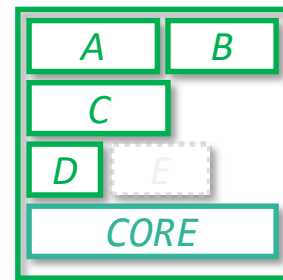
Feature



{B, C, D}



{A, E}



{A, B, C, D}

“(...) a set of related software products (...) generated from reusable assets.”

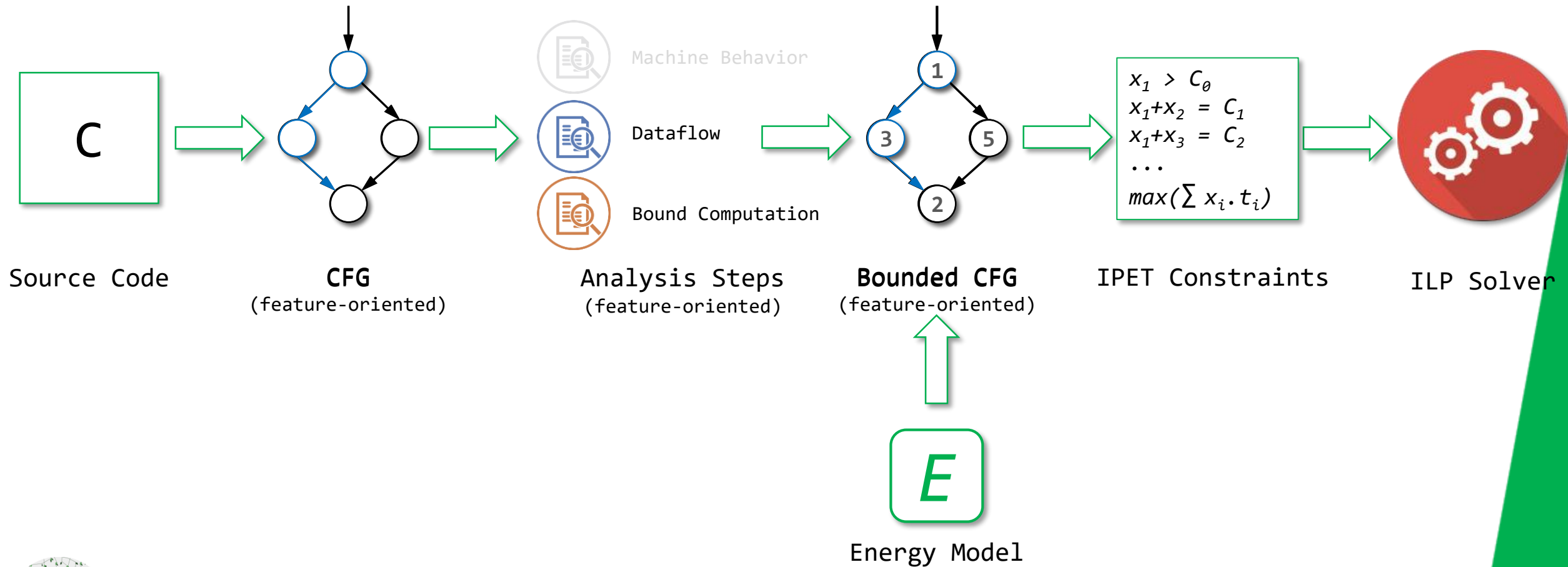
Product configuration



STATIC ENERGY ANALYSIS

THIS TIME, FOR SPL!

Intraprocedural Dataflow Analysis for Software Product Lines
- [AOSD '12]





RESULTS

PRELIMINARY RESULTS

- A SPL with 7 (exclusive) *features*

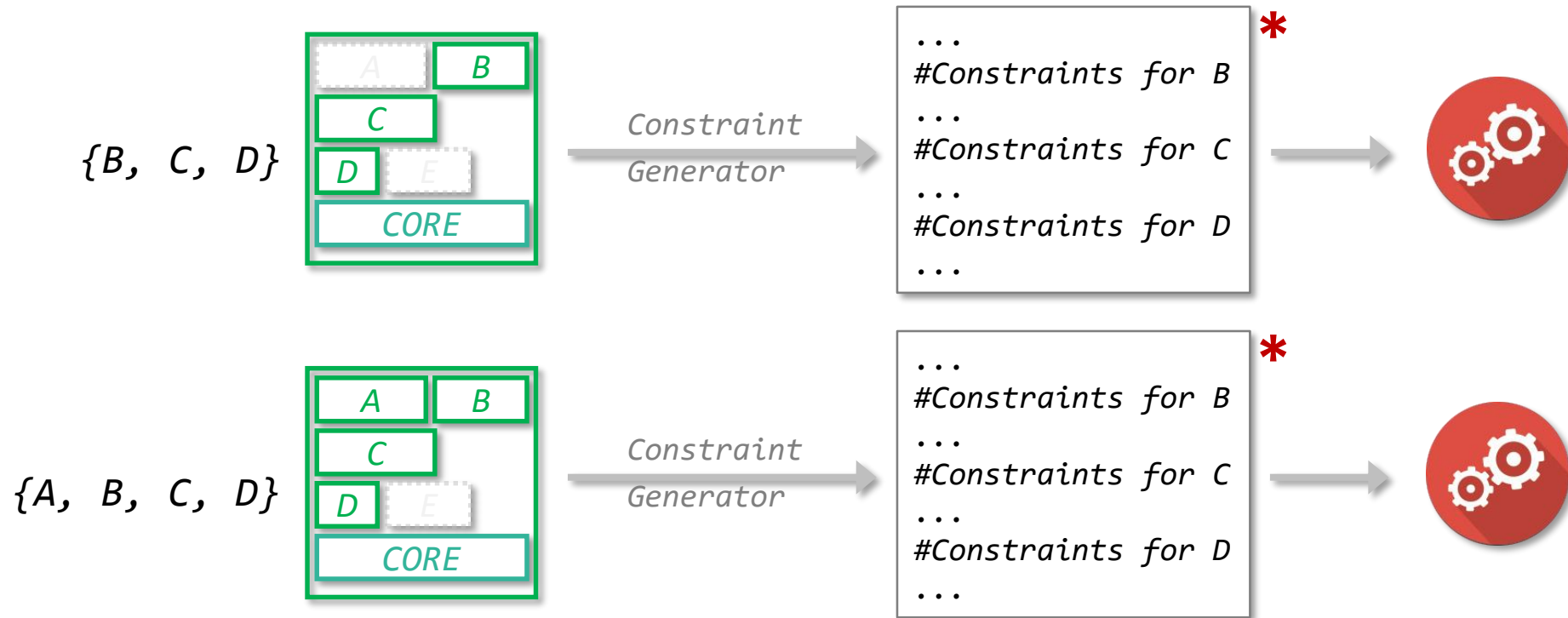
Product	Measured WCEC	Predicted WCEC	Difference	% Error	Exec. Time	Pred. Time
{Original_noZ3}	114,170 J	114,745 J	0,58 J	<u>0,50%</u>	13.873s	409.57s
{Original_Z3}	90,800 J	100,726 J	9,93 J	10,93%	11.572s	161.48s
{Unchecked}	87,934 J	100,723 J	12,79 J	14,54%	10.973s	165.69s
{Modified1}	64,906 J	66,540 J	1,63 J	2,52%	8.535s	35.98s
{Modified2}	64,466 J	70,082 J	5,62 J	8,71%	8.576s	29.08s
{No_Unnecessary_Intermediates}	58,866 J	64,934 J	6,07 J	10,31%	8.011s	13.24s
{Manual_Interchange}	56,800 J	67,062 J	10,26 J	<u>18,07%</u>	7.395s	13.66s

*Results submitted to SPLC'17 - Software Product Lines Conference, 21st edition:
"Products go green: Worst-Case Energy Consumption in Software Product Lines"*



WHAT NOW?

- This work was focused on accuracy
- Technique's performance could be improved...
 - Main reason: shared constraints are re-calculated for every *product*



***Constraints solved more than once!**

WHAT NOW?

- Accuracy can also be improved!
 - Include a machine behavior analysis
 - -> different energy consumptions per instruction
 - Consider lower abstraction level
 - For now, we analyzed C code
- Apply technique to different contexts
 - Mobile?
 - Embedded?
 - ???





STATIC ENERGY PREDICTION IN SOFTWARE:

A WORST-CASE SCENARIO APPROACH

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