

DTU



Program Analysis – Group 21

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Introduction

Is concolic testing more effective than random testing for verifying a function's output range?

Bonus Research Question: Can we improve the concolic analysis to verify a function's output range by skipping loops in the analysis?

Concolic Testing

- Input range constraints
- Use concolic analysis to explore execution paths
- Find symbolic return
- Evaluate symbolic return with range and path constraints
- Use z3 to create path constraints and generate inputs

Inputs	Path Constraints	Symbolic Return	Return Check
$q = 100,$ $cE = 3$ $cG = 2$ $e = 1$	$cG \geq 1 \wedge cG \leq 10$ $\wedge e \geq 1 \wedge e \leq 10$ $\wedge q > 0 \wedge cE > 0$ $\wedge e \leq cG$ $\wedge \neg(qC * cE \leq 120)$	$qC * cE - 2e$	$\neg(qC * cE - 2e \geq 0)$

Random Testing Tool

Pseudo-code:

- ▶ StartTime()
- ▶ while (output in range):
 - ▶ output = analyzedMethod.invoke(random_inputs())
- ▶ StopTime()

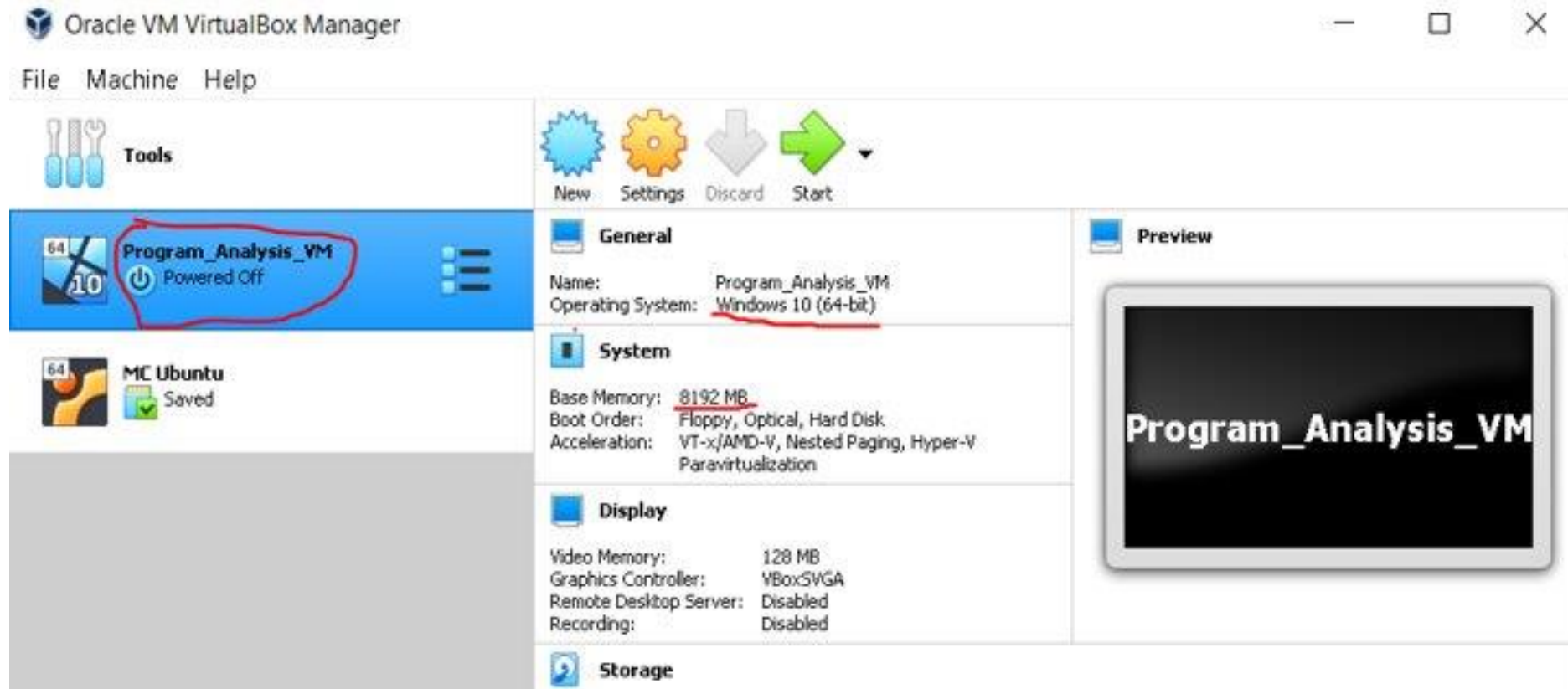


No memory tool

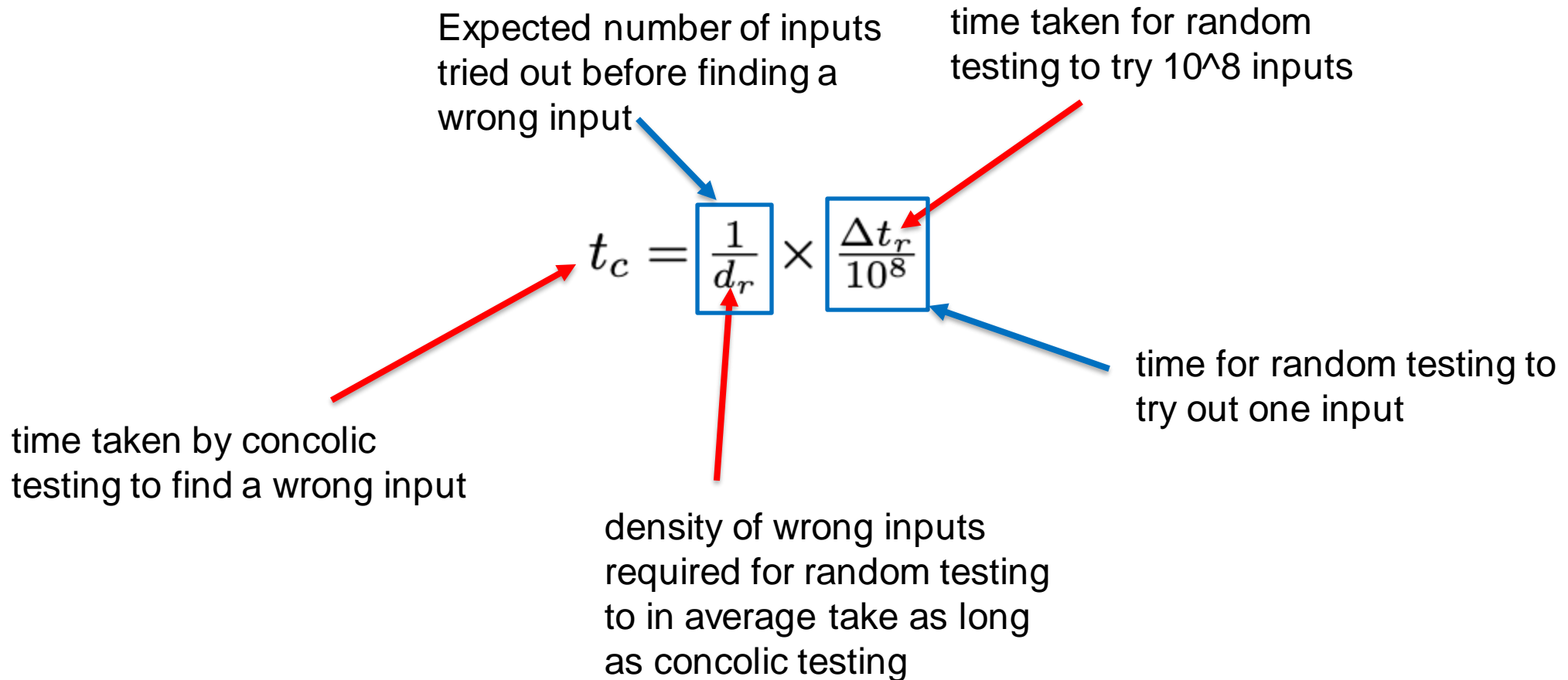
Quality of random inputs

Low sample variance

Testing environment



Evaluation – out of range



Evaluation – example functions

Calculate Efficiency

- 4 inputs
- No loop
- Ca. 100 out of range input combinations
- Output range: ≥ 0

No loop

- 3 inputs
- No loop
- Few out of range input combinations
- Output range: > 0

Short loop

- 2 inputs
- 10 iterations loop
- 6 out of range input combinations
- Output range: $\neq 0$

Long loop

- 2 inputs
- 1000 iterations loop
- 6 out of range input combinations
- Output range: $\neq 0$

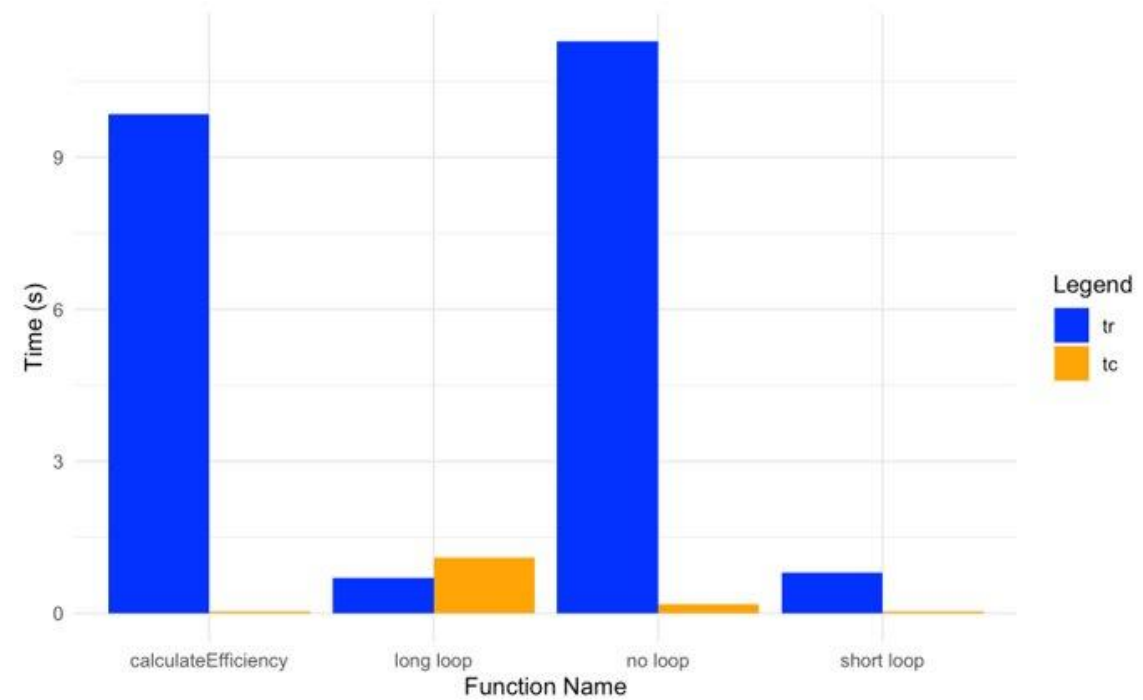
Evaluation – out of range

- Long loop is slow with concolic testing
- calculateEfficiency and no loop take longer per input using random testing
- Short loop and long loop take similar time per input using random testing

Function Name	Δt_r	tc	d_r
no loop	5.977	0.183	$\frac{327}{10^9}$
calculateEfficiency	7.698	0.034	$\frac{2264}{10^9}$
short loop	4.187	0.035	$\frac{1196}{10^9}$
long loop	4.084	1.098	$\frac{37}{10^9}$

Evaluation – out of range

- range 0 to 10000 for each input
- dependency on number of inputs a function takes



Evaluation – no out of range

The diagram illustrates the formula for calculating the input range i_r for random testing. The formula is $i_r = \sqrt{t_c \times \frac{10^8}{\Delta t_r}}$. The term $\frac{10^8}{\Delta t_r}$ is enclosed in a blue box. Annotations with arrows explain each part:

- input range for each of the two inputs that random testing can try out in the time taken by concolic testing** (points to i_r)
- time taken by concolic testing to return no out of range outputs possible** (points to t_c)
- inputs random testing can try out per second** (points to the blue box $\frac{10^8}{\Delta t_r}$)
- time taken for random testing to try 10^8 inputs** (points to Δt_r)

Evaluation – no out of range

Function Name	Δt_r	tc	i_r
short loop (fixed)	4.099	0.518	3554
long loop (fixed)	4.136	134.443	57013

Discussion of the technique and alternatives

Static analysis/abstract interpretation

Sign abstraction: only positive negative and zero in the analysis

Range abstraction: values of the variables in certain ranges, could lead to incorrect outputs because of over approximation

Pro: Complete

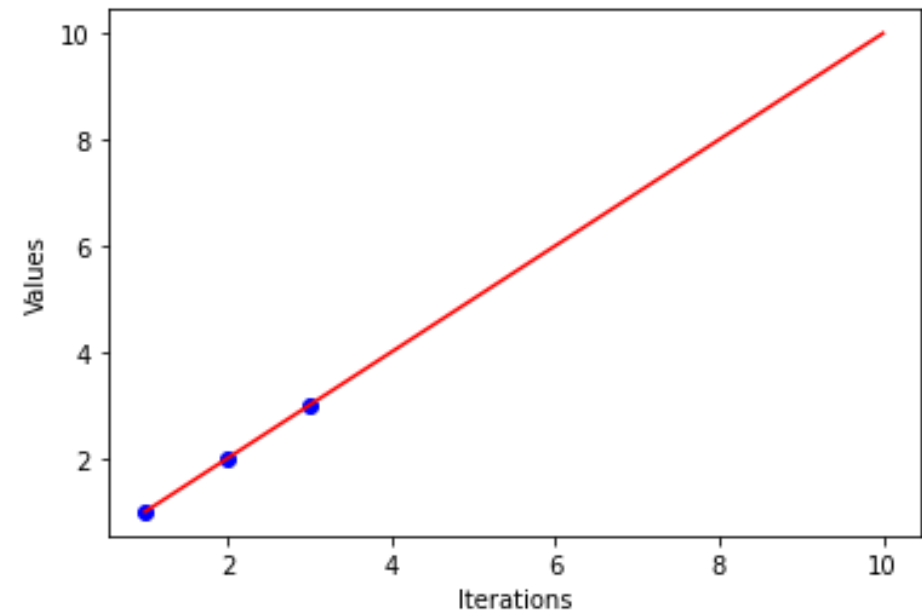
Cons: not feasible for complex programs, not sound

Bonus Research Question: Skip Loops

- The problem: Loops are largely increasing time expenditure
- Our plan: Skip loops in analysis
- This is impossible
- New Plan: Predict loop behaviour to skip loops

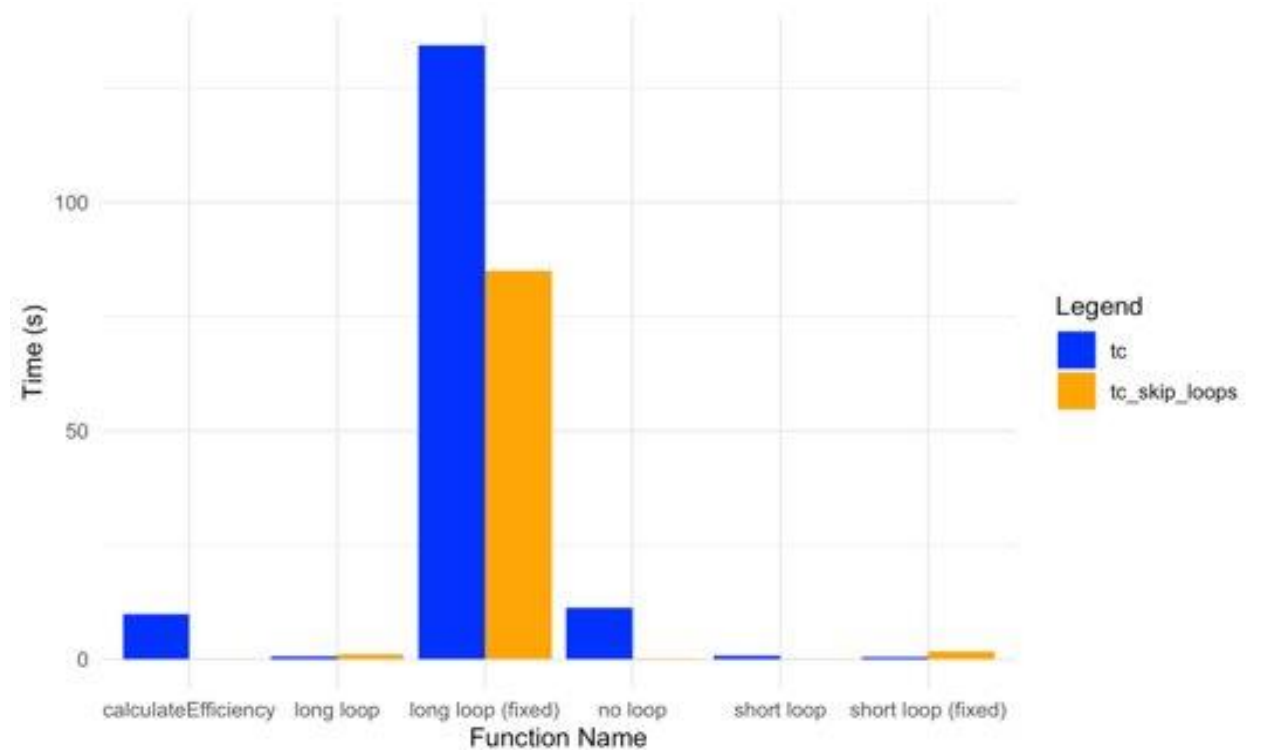
Skip Loops Approach and Implementation

- Use linear regression to skip loops
- Keep track of states at if statements
- Use states to predict iterations and outputs
- Skip loop and update path constraints

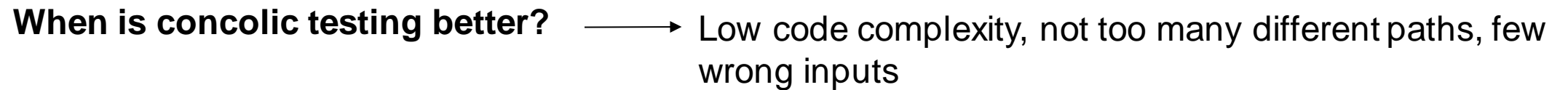
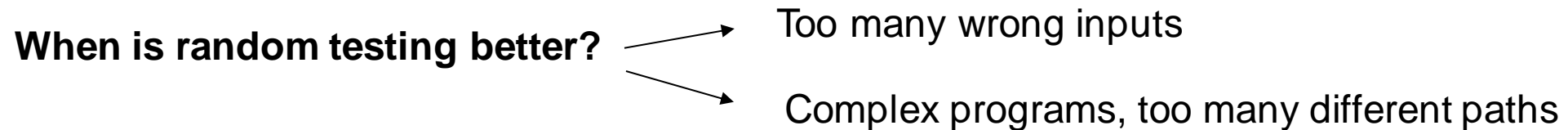
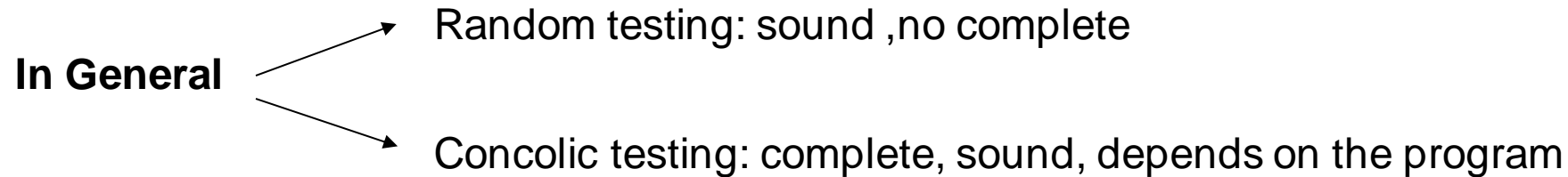


Skip Loops Evaluation

- Faster for longer loops vs random testing
- Only works for very simple functions
- Not sound and not complete
- Overall, not a good idea



Conclusion



Can we skip loops? NO —————> No accuracy, no soundness and completeness

Questions?