

# TEST DATA GENERATION: A HYBRID APPROACH USING CUCKOO AND TABU SEARCH

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# ROAD MAP

- Motivation
- Existing Approaches
- Proposed Approach
- Experimental Analysis
- Discussion
- Conclusion

# MOTIVATION

- Software Testing – Key Part of SDLC
- SQS Compact Paper 2011: > 50 billion euros on testing
- NIST's National Impact Estimates (2002-03): \$60 billion
- Cost can be drastically reduced, by tackling the inefficiencies of the existing approaches.

# TEST DATA GENERATION

- The generation of test cases during the testing phase of software development
- Why automate it?
  - To reduce the cost of resources, both human and material
  - To reduce the enormous amount of time spent in identifying the test cases
  - To increase the reliability of testing

# EXISTING APPROACHES

- Random Testing
  - Low efficiency in case of large codes
- Concolic Testing
  - Inability to test nondeterministic programs
- Search Based (Optimization) Testing
  - By far, the most successful
  - But suffer from time and cost optimality issues
- Adaptive and Heuristics Based Approaches
  - Ant Colony Optimization
  - GA – Problems of blind search and slow convergence
  - GA with Tabu Search – Combines local + global optimization
    - The best in terms of node coverage and time optimality till now

# PROPOSED APPROACH

## A Meta-Heuristic Approach Inspired by Nature

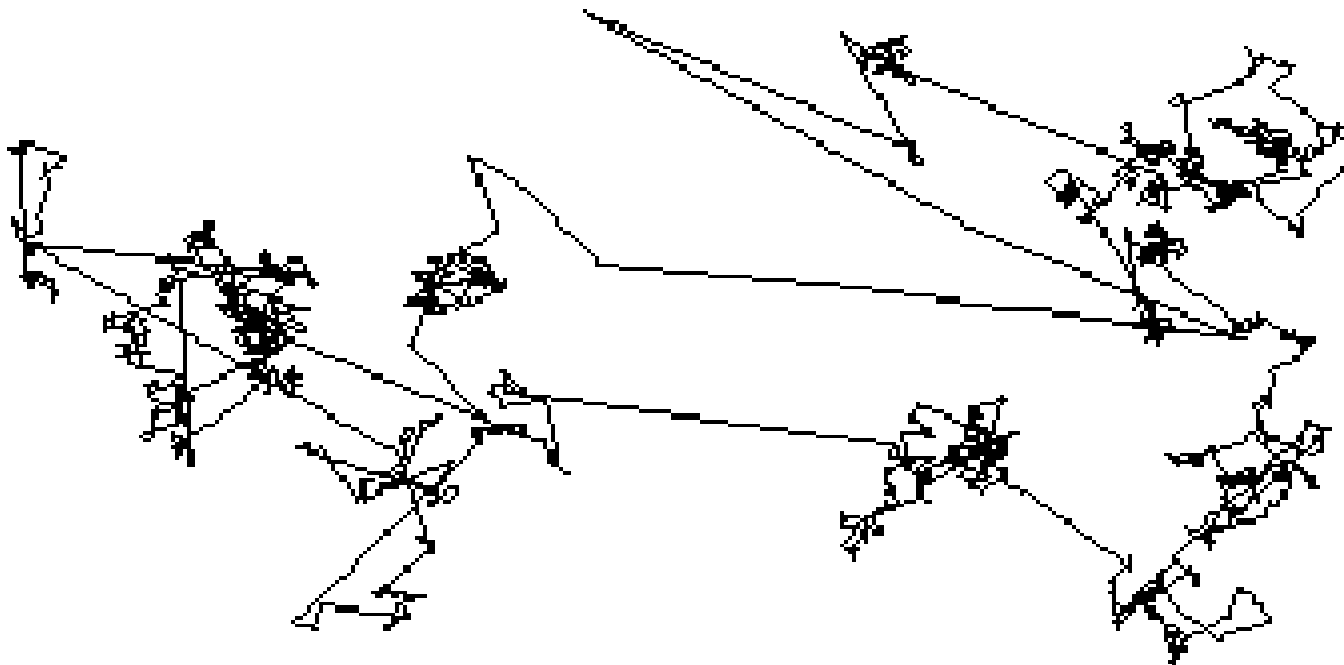
- Cuckoo Search
  - Found to be more generic and robust for many optimization problems
- Levy Flights
  - Ensures best overall coverage of search space
- A Variation of Tabu Search
  - Ensures movement from locally optimal to globally optimal solutions

# CUCKOO SEARCH

- Imitation of the behaviour of cuckoos in nature
  - Cuckoos dump their eggs in other birds' nests
  - So we basically tried to put this evil behaviour to good use!
- Rules, as described by Yang and Deb, the proponents of Cuckoo Search:-
  - Each cuckoo lays one egg at a time, and dumps its egg in a randomly chosen nest.
  - The best nests with high quality of eggs will carry over to the next generations.
  - The number of available host nests is fixed, and the egg laid by a cuckoo is discovered by the host bird with a certain probability. In this case, the host bird can either throw the egg away or abandon the nest, and build a completely new nest.

# LEVY FLIGHT

- A random walk where the random step length is drawn from a levy distribution.
- The random walk via levy flight is more efficient in exploring the search space as its step length is much longer in the long run.





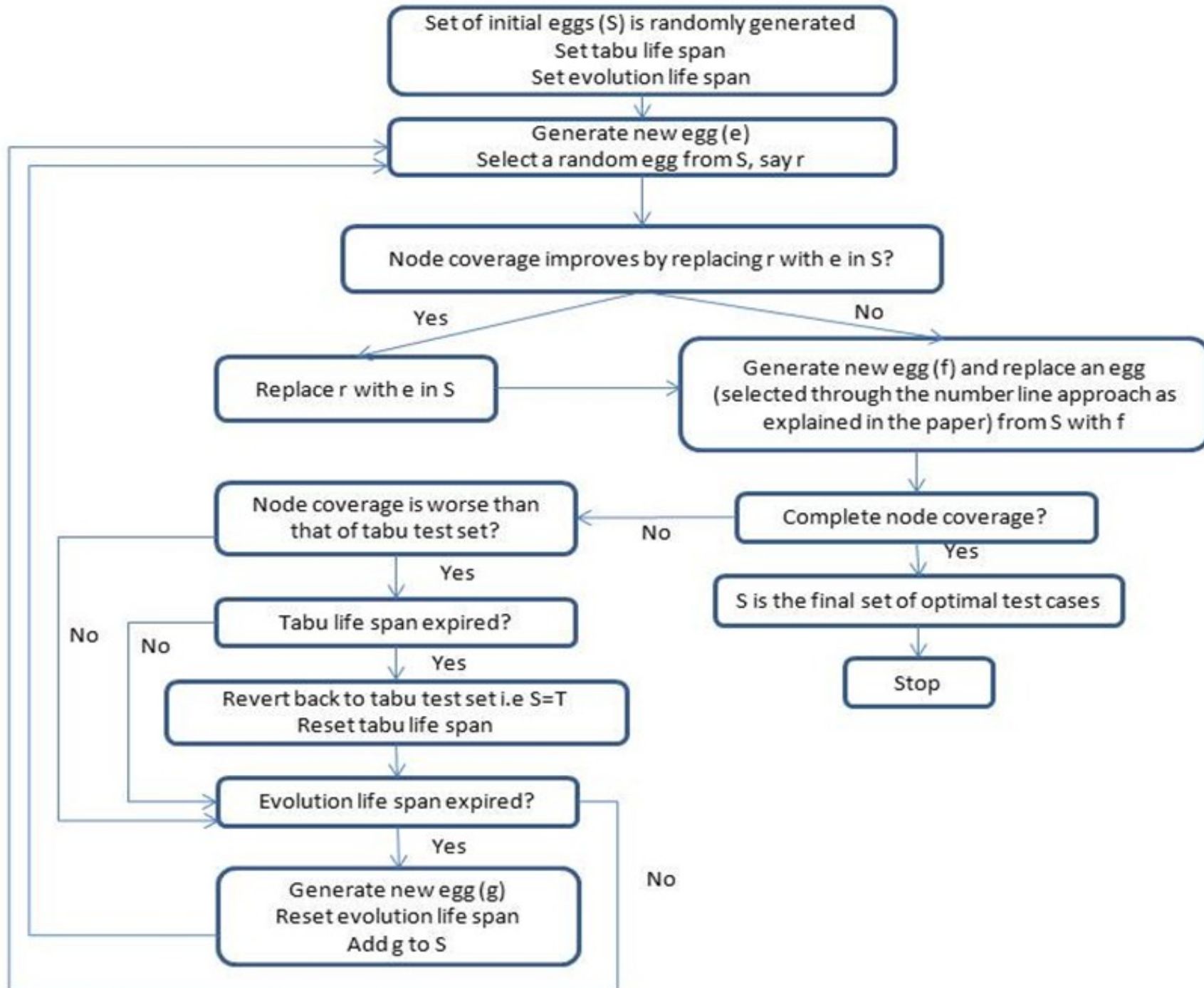
## LEVY FLIGHT (CONTD...)

- Some of the new solutions should be generated by Levy walk around the best solution obtained so far, thus speeding up the local search.
- However, a substantial fraction of the new solutions should be far enough from the current best solution, thus ensuring that the system will not be trapped in a local optimum.

# TABU SEARCH

- A mathematical optimization method
- Improves the performance of a local search by marking the previously visited solutions as “tabu”.
- It ensures that the algorithm does not get stuck in a locally optimum solution, thereby enabling faster convergence to the globally optimal solution.

# METHODOLOGY



# NOTATIONS USED

- $M$  = Total number of nodes in Control Flow Graph
- $N$  = Current number of input test cases
- $I$  = Current input test case set
- $t$  = Tabu life-span
- $e$  = Evolution life-span
- $T$  = Tabu test case set
- $n(S)$  = Number of nodes covered by a set of test cases  $S$ /Node Coverage
- $E_i$  = Individual test case (A cuckoo egg)

# THE ALGORITHM

- Before initiating the algorithm, it needs some input data for assistance.
- The user needs to input values for  $N$ ,  $M$ ,  $t$  and  $e$
- These values are used by the algorithm, and might vary from program to program.
- With the initial input values, a test case that satisfies the constraints set by input values is randomly generated.

## THE ALGORITHM (CONTD...)

- Say, the initial test case consists of 3 eggs - E1, E2 & E3. (Generated based on initial parameters set by user) Also, we initially set  $T=1$  i.e. good tabu list is initial test case set
- Generate a new random egg  $E_i$  using levy flight.
- Select at random, an egg from  $I$  (say E2).
- If  $n(\{E1, E2, E3\}) < n(\{E1, E_i, E3\})$

Replace E2 by  $E_i$  in  $I$

Else

Nothing

EndIf

## THE ALGORITHM (CONTD...)

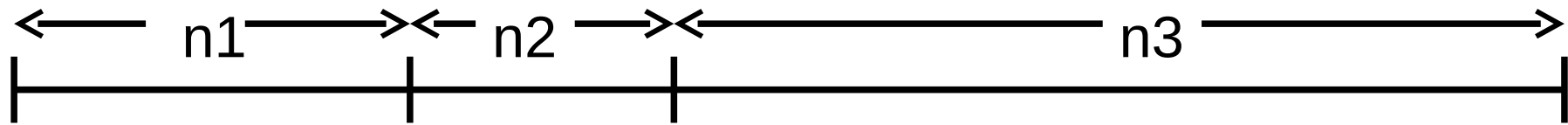
- Generate a new egg, say  $E_j$ , using levy flight.
- Replace one of the eggs from  $I$  with  $E_j$ .  
(The probability of a particular egg from  $I$  to be replaced depends on the number of test cases covered due to the egg's presence in  $I$ )

Let

$$n(\{E_j, E_i, E_3\}) = n_1$$

$$n(\{E_1, E_j, E_3\}) = n_2$$

$$n(\{E_1, E_i, E_j\}) = n_3$$



Generate a random number in the range  $(0, n_1+n_2+n_3)$ .

According to the range in which the random number falls, select the corresponding test case for the next step.



If  $e == 0$

$I = T$

$N = N + 1$

    Reset  $e$

EndIf

If  $n(I) \leq n(T)$

    If  $t == 0$

$I = T$

        Reset  $t$

    Else

$T = I$

    EndIf

EndIf

If  $n(I) == M$

    Output I

    Stop

Else

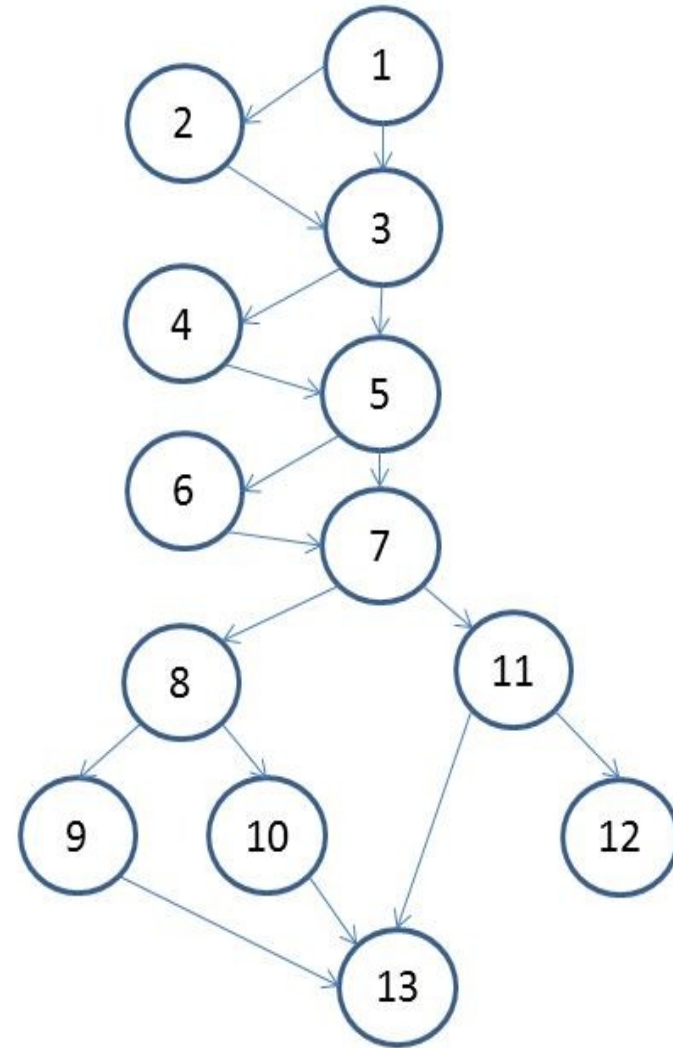
    Continue

EndIf

# EXPERIMENTAL RESULTS

# TRIANGLE PROBLEM

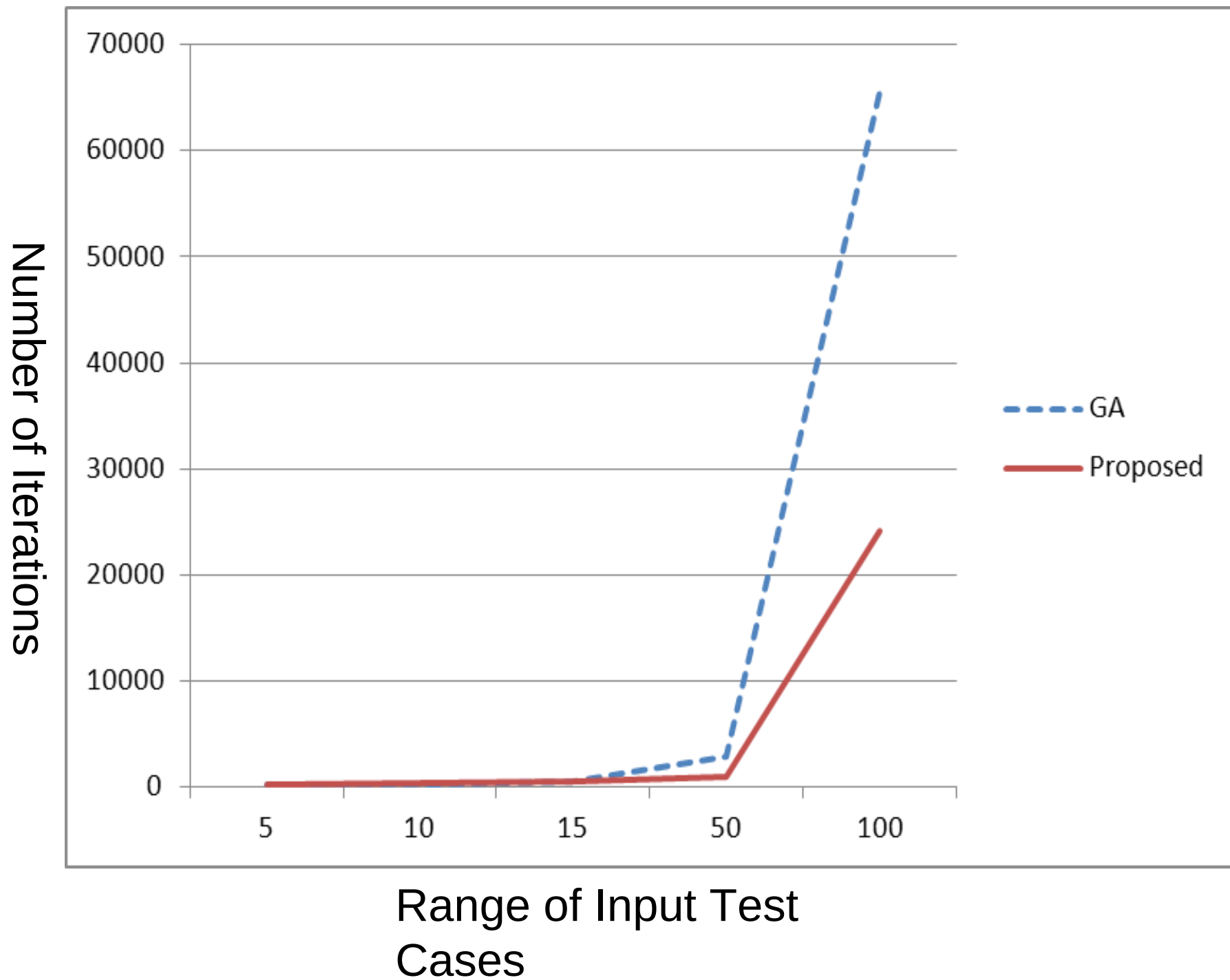
```
int triType(int a, int b, int c){  
1 int type=PLAIN;  
1 if(a<b)  
2     swap(a,b);  
3 if(a<c)  
4     swap(a,c);  
5 if(b<c)  
6     swap(b,c);  
7 if(a==b){  
8     if(b==c)  
9         type=EQUILATERAL;  
10    else  
11        type=ISOSCELES;  
12 }  
13 else if(b==c)  
14     type=ISOSCELES;  
15 return type;  
16 }
```



# RESULTS

INPUT TEST CASE RANGE	GENETIC ALGORITHM		PROPOSED APPROACH	
	AVG NO OF TESTS	AVG NO OF UNCOVERED NODES	AVG NO OF TESTS	AVG NO OF UNCOVERED NODES
0-5	290	NONE	215	NONE
0-10	295	NONE	379	NONE
0-15	605	NONE	582	NONE
0-50	2860	NONE	1013	NONE
0-100	65535	1	24233	NONE

\*Shen X., Wang Q., Wang P., Zhou B., "Automatic generation of test case based on GATS algorithm", Granular Computing, GRC'09. IEEE International Conference, pp. 496-500, 2009.



# DISCUSSION

- The Cuckoo Search part of the algorithm is a close resemblance to the GA model
- The reproduction, crossover and mutation are modeled through Cuckoo search
- However, the implementation is considerably different, thus giving a completely different perspective towards optimization
- The variation of Tabu search, in combination with Levy flights, ensures that iterations are not wasted in traversing the local space for more than a certain amount of time
- This ensures faster convergence to the optimal solution
- This also ensures 100% node coverage in the CFG

# DISCUSSION CONT...

- Currently, there is no global selection criterion for evolution and tabu lifespan
- However,  $t=20$  and  $e=1000$  have been shown to work for the problems our work concentrated on



# CONCLUSION

- The hybrid approach involving Cuckoo and Tabu Search has been shown to work better than GA as well as the combination of GA and Tabu Search.
- A change of perspective of software testing researchers towards optimizations through Cuckoo Search may result in drastic reduction in costs and time involved in this phase of SDLC