

### INTRODUCTION

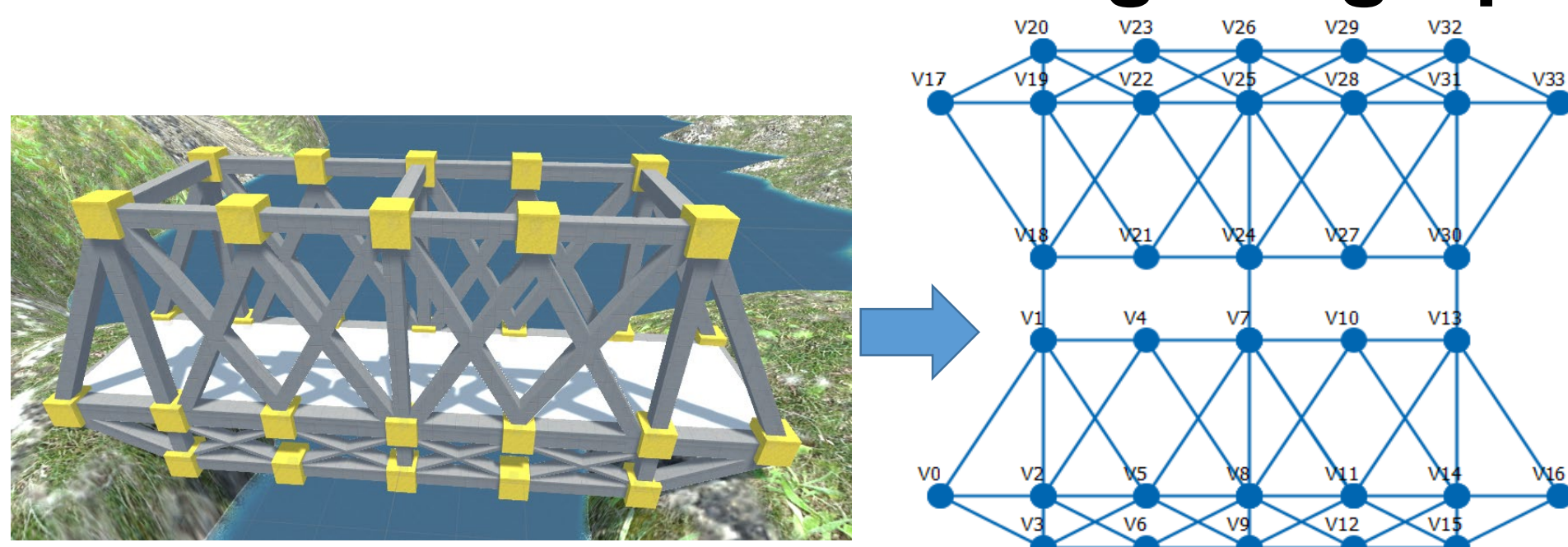
The project goal is to develop a Training And Control System (STACS) for human operators to oversee a team of autonomous bridge inspection robots to safely, cheaply, and reliably inspect steel truss bridges. We have developed and iterated prototypes of this software, and are developing training exercises designed to teach human operators to work with the simulated robotic team to accomplish a bridge inspection task. Optimal routing for a team of climbing robots to inspect every member of the bridge is NP-Hard. We show that we can use genetic algorithms to produce near optimal routes in realistic time.



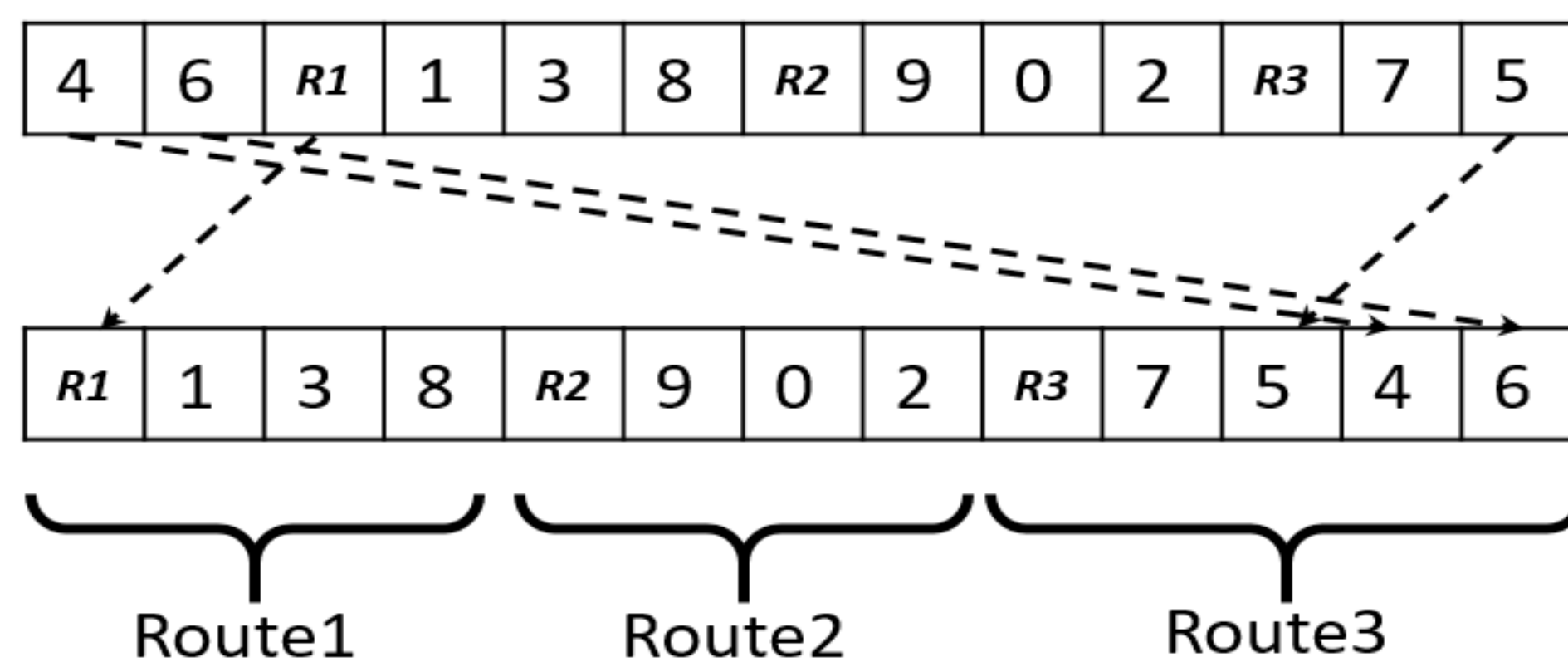
Screenshot from the STACS2 interface with 5 climbing robots and one UAV.

Dr. Hung La's climbing robot

### METHODS – Convert bridge to graph



### Run GA with encoding below and find route



### RESULT 1

We can find routes within 2% of optimal on model bridge for one robot. Speedup with additional robots is close to linear

|         | 1-CPP Optimal | 1-CPP GA | 2-CPP GA | 5-CPP GA |
|---------|---------------|----------|----------|----------|
| Result  | 51,268        | 51,974   | 26,634   | 11,682   |
| Speedup | -             | -        | 1.951    | 4.449    |

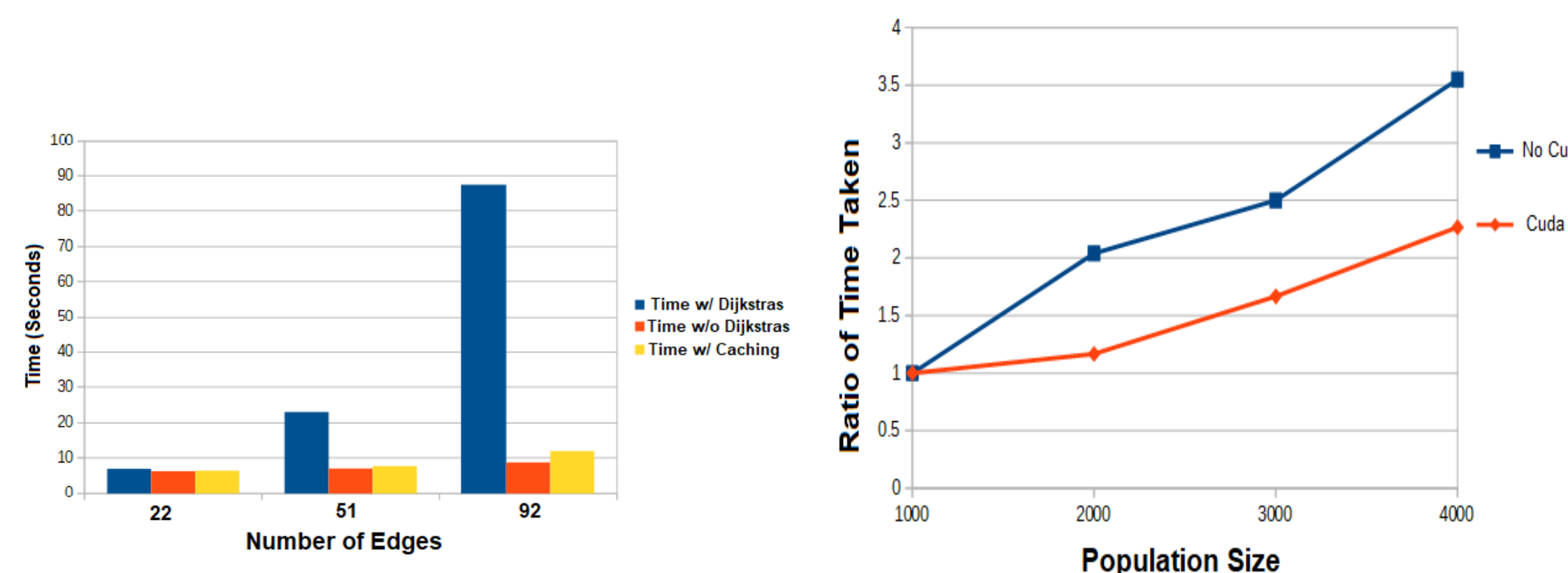
### RESULT 2

We are within 7% of a theoretical lower bound in finding routes on benchmarks problems in the literature. Speedup is still close to linear! 5 robots take about 1/5 the time for inspecting a bridge

| Problem  | V  | E  | Lower Bound | Best k = 1 | Percent Above Lower Bound | Best k = 2 | Speedup k = 2 | Best k = 5 | Speedup k = 5 |
|----------|----|----|-------------|------------|---------------------------|------------|---------------|------------|---------------|
| gdb1     | 12 | 22 | 252         | 270        | 7.143 %                   | 130        | 2.077         | 53         | 5.094         |
| gdb2     | 12 | 26 | 291         | 298        | 2.405 %                   | 146        | 2.041         | 63         | 4.73          |
| gdb3     | 12 | 22 | 233         | 246        | 5.579 %                   | 120        | 2.05          | 49         | 5.02          |
| gdb9     | 27 | 51 | 219         | 236        | 7.763 %                   | 119        | 1.983         | 53         | 4.453         |
| gdb10    | 12 | 25 | 252         | 260        | 3.175 %                   | 128        | 2.031         | 53         | 4.906         |
| gdb11    | 22 | 45 | 356         | 374        | 5.056 %                   | 192        | 1.948         | 77         | 4.857         |
| gdb12    | 13 | 23 | 334         | 356        | 6.587 %                   | 173        | 2.058         | 70         | 5.086         |
| gdb17    | 8  | 28 | 84          | 89         | 5.952 %                   | 44         | 2.023         | 19         | 4.684         |
| gdb18    | 9  | 36 | 158         | 164        | 3.797 %                   | 80         | 2.05          | 32         | 5.125         |
| gdb19    | 8  | 11 | 45          | 47         | 4.444 %                   | 23         | 2.043         | 10         | 4.7           |
| val4     | 41 | 69 | 343         | 381        | 11.079 %                  | 194        | 1.964         | 89         | 4.281         |
| val5     | 34 | 65 | 367         | 401        | 9.264 %                   | 219        | 1.831         | 105        | 3.819         |
| val7     | 40 | 66 | 249         | 273        | 9.639 %                   | 146        | 1.870         | 78         | 3.5           |
| val8     | 30 | 63 | 347         | 386        | 11.239 %                  | 202        | 1.911         | 88         | 4.386         |
| val9     | 50 | 92 | 278         | 309        | 11.151 %                  | 169        | 1.828         | 97         | 3.186         |
| Averages | -  | -  | -           | -          | 6.952%                    | -          | 1.981         | -          | 4.522         |

### RESULT 3

Caching intermediate computations speeds up time to find near optimal routing. We can get an order of magnitude improvement. Parallellizing the code to take advantage of the thousands of graphics cores in modern graphics cards also results in much faster runtimes and enables larger population sizes leading to improved solution quality as well as faster speeds



Caching

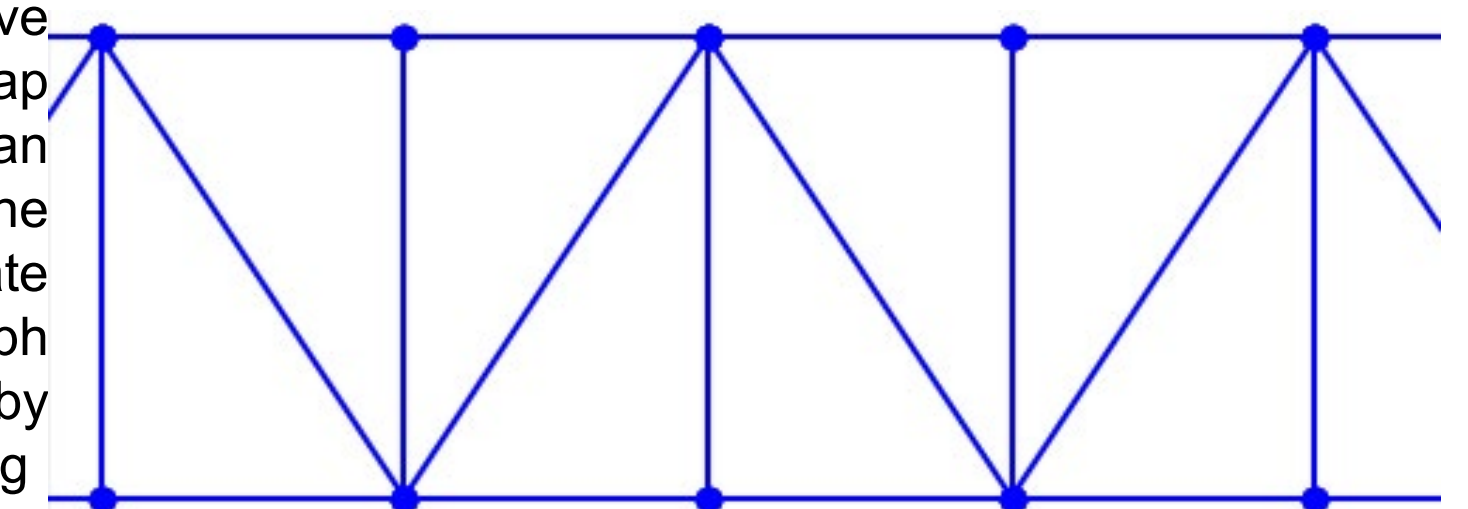
CUDA parallellization

### CONCLUSIONS

We have developed version two of the STACS prototype with climbing robots and UAVs for eddy current based steel inspection by climbing robots and visual camera based inspection by flying robots. We have shown that we can get linear speedup as we increase the size of the truss inspection robot team. Assuming a conservative inspection speed of 0.25 m/sec or .82 feet/sec, a team of 10 robots could inspect the 57,044 feet or nearly 11 miles of the roadbed truss of the Golden Gate bridge in less than 2.5 hours!



Software tools have been developed to map the truss structure of an existing bridge like the iconic Golden Gate bridge to the graph representation used by our optimizer for routing



### REFERENCES

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- D. Ahr, G. Reinelt, *New heuristics and lower bounds for the min-max k-chinese postman problem*, in: R. Möhring, R. Raman (Eds.), Algorithms ESA 2002, Springer Berlin Heidelberg, Berlin, Heidelberg, 2002, pp. 64–74.
- D. Ahr, G. Reinelt, *A tabu search algorithm for the minmax k-Chinese postman problem*, Computers & Operations Research 33 (12) (2006) 3403 465 – 3422, part Special Issue: Recent Algorithmic Advances for Arc Routing Problems.

### ACKNOWLEDGEMENTS

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