

# Harnessing the power of GPUs for model checking

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## On-The-Fly State Space Exploration

### Construct a state space, given a model of a concurrent system [3]

Model = set of interacting finite-state Labelled Transition Systems

### New hash-table design for GPUs, with fine-grained parallelism

Elements are placed in buckets using *warp-the-line* technique

### Threads work in groups to generate state successors

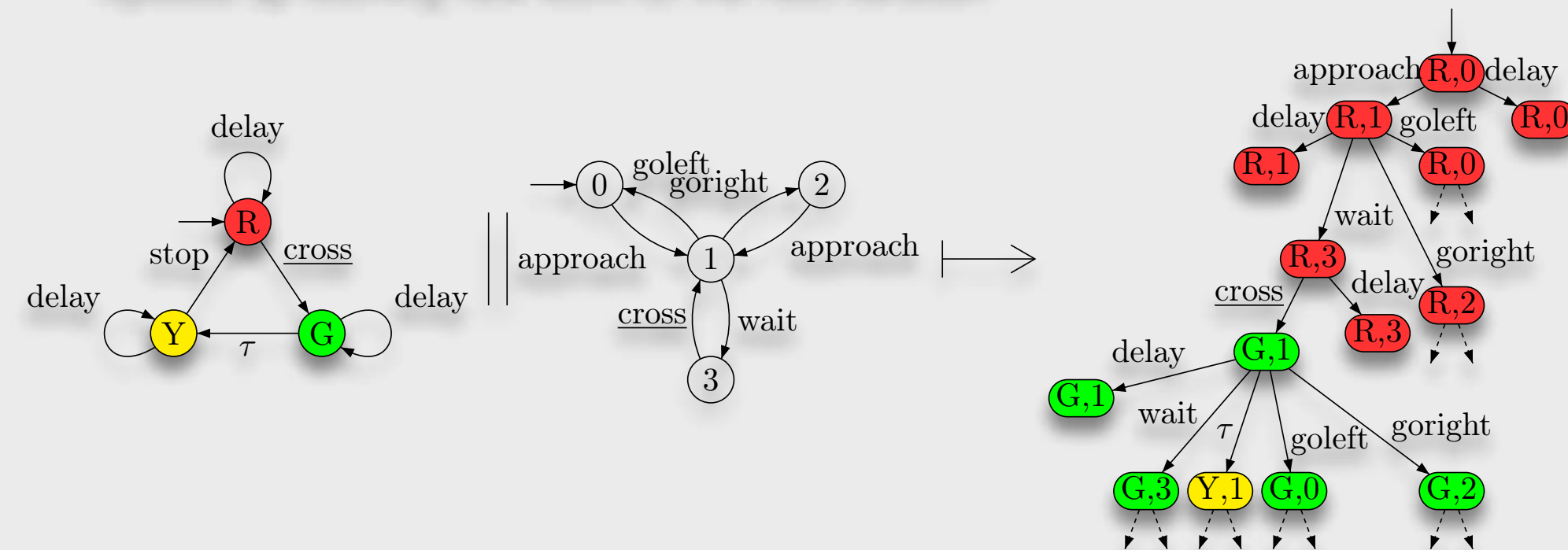
Parallelism at state-level

### Block-local shared memory used for state caches

Local duplicate detection reduces global hash table access

### Work forwarding per block from one search iteration to the next

Speeds up fetching new work for the next iteration



10-100x speedup

## State Space Decomposition

### Decompose explicit graph into Strongly Connected Components &

### Decompose graph of Markov Decision Process into Maximal End Components [2]

### Decomposition based on Forward/Backward Breadth-First Search

Uses *trimming* to remove trivial components in each iteration

### In each iteration, many BFSs can be performed in the search regions in parallel

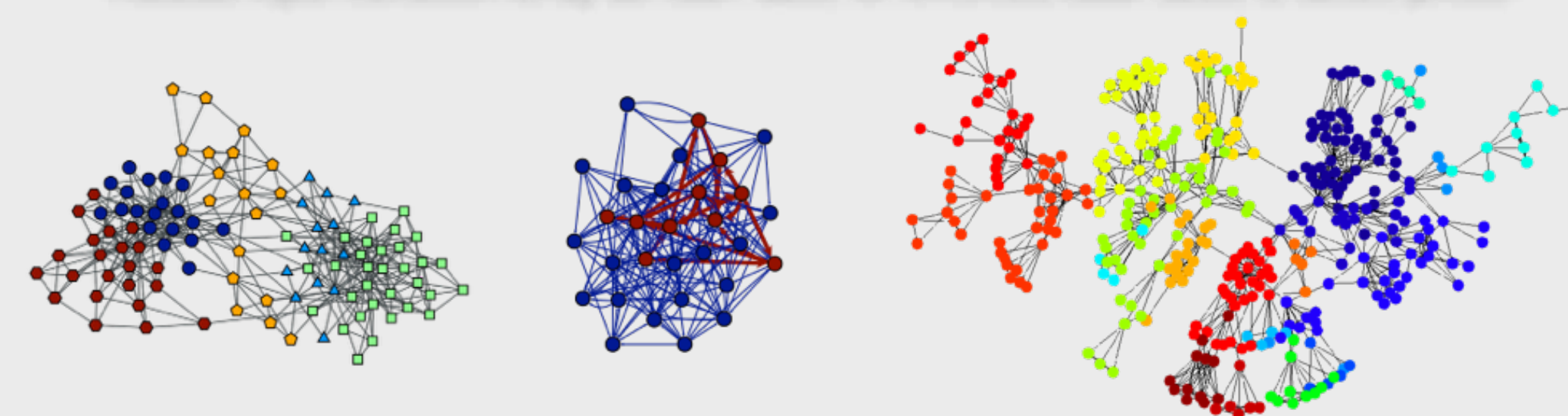
Achieves massive parallelism

### Novel combined forward/backward thread kernel

Combines both procedures in one state scan

### New simplified pivot selection for each search region at the start of an iteration

Reuses input transition array as hash table for enforced data races to select pivots



15-79x speedup

## Probability Computations

### Perform numerical computations for probabilistic model checking [1, 4]

Needed to check if a probabilistic property holds in a discrete or continuous time Markov Chain

### Solving systems of linear equations and performing matrix-vector multiplication

Parallel matrix-vector multiplication used in Jacobi method for solving equation systems

### Parallel termination checking achieves significant speedup

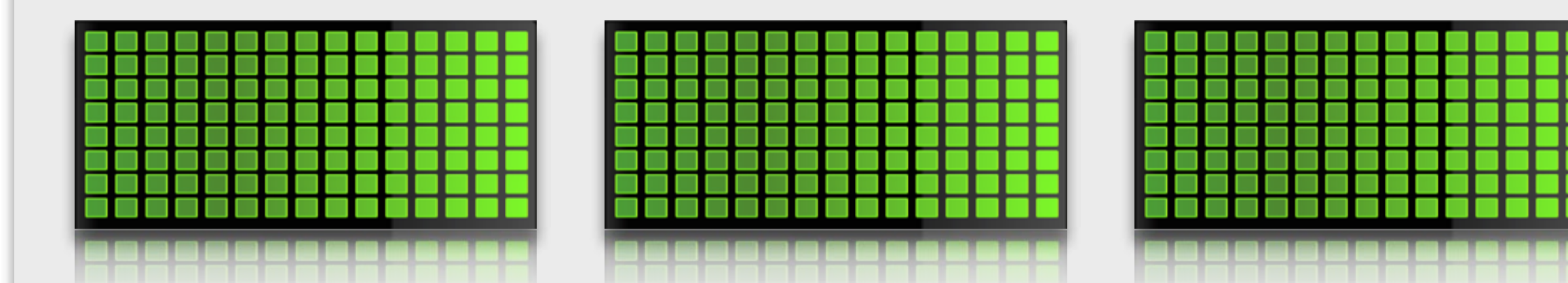
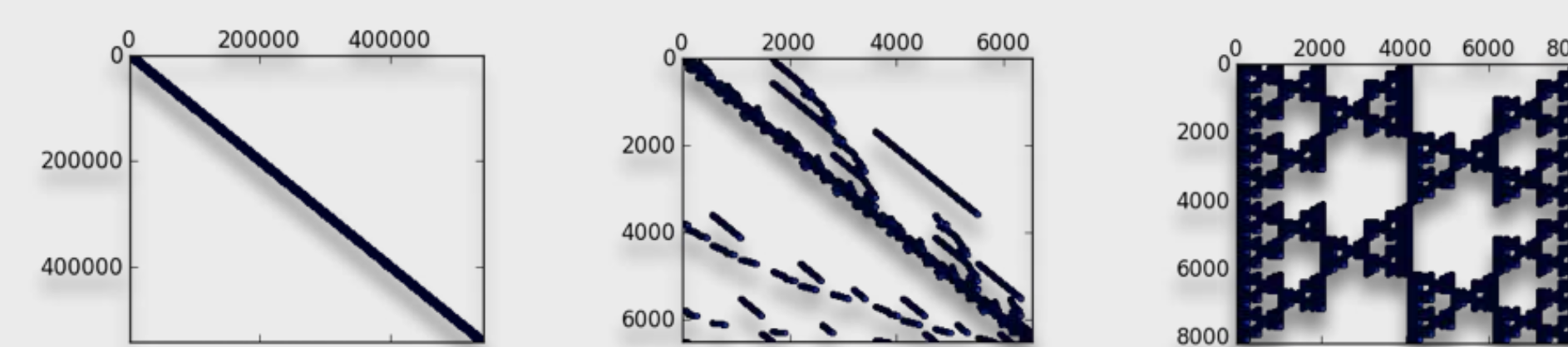
Fast checking if next iteration is needed

### Novel restructuring of input ensures coalesced memory access by threads

Faster reading of input reduces multiplication run time up to four times

### States / transitions are grouped in segments of 16 and 32 states

Coincides with a half and a full *warp* of threads



20-35x speedup

## References

- [1] *Parallel Probabilistic Model Checking on General Purpose Graphics Processors*  
D. Bošnački, S. Edelkamp, D. Sulewski, and A.J. Wijs  
*International Journal on Software Tools for Technology Transfer* 13(1) 21-35 (2011)
- [2] *GPU-Based Graph Decomposition into Strongly Connected and Maximal End Components*  
D. Bošnački, J.-P. Katoen, and A.J. Wijs  
in *Proceedings of the 26th International Conference on Computer Aided Verification (CAV'14)*, volume 8559 of LNCS, pp. 309-325 (2014)
- [3] *GPUexplore: Many-Core On-The-Fly State Space Exploration Using GPUs*  
A.J. Wijs and D. Bošnački  
in *Proceedings of the 20th International Conference on Tools and Algorithms for the Construction and Analysis of Systems (TACAS'14)*, volume 8413 of LNCS, pp. 233-247 (2014)
- [4] *Improving GPU Sparse Matrix-Vector Multiplication for Probabilistic Model Checking*  
A.J. Wijs and D. Bošnački  
in *Proceedings of the 19th International SPIN Workshop on Model Checking of Software (SPIN'12)*, volume 7385 of LNCS, pp. 98-116 (2012)

Tools available at <http://www.win.tue.nl/~awijs>

