

# **Deep Random Search for Efficient Model Checking of Timed Automata**

**Radu Grosu**

**Stony Brook University**

**Joint work with:**

**X. Huang, S.A. Smolka, W. Tan and S. Tripakis**

# Embedded Software Systems

- **Difficult to develop & maintain:**
  - **Concurrent and distributed** (OS, ES, middleware),
  - **Complicated by DS** improving performance (locks, RC,...),
  - **Mostly written in C** programming language.
- **Have to be high-confidence:**
  - **Provide the critical infrastructure** for all applications,
  - **Failures are very costly** (business, reputation),
  - **Have to protect** against cyber-attacks.

# What is High-Confidence?

Ability to guarantee that

$$S \stackrel{?}{|=} \varphi$$

system-software  $S$  **satisfies** temporal property  $\varphi$

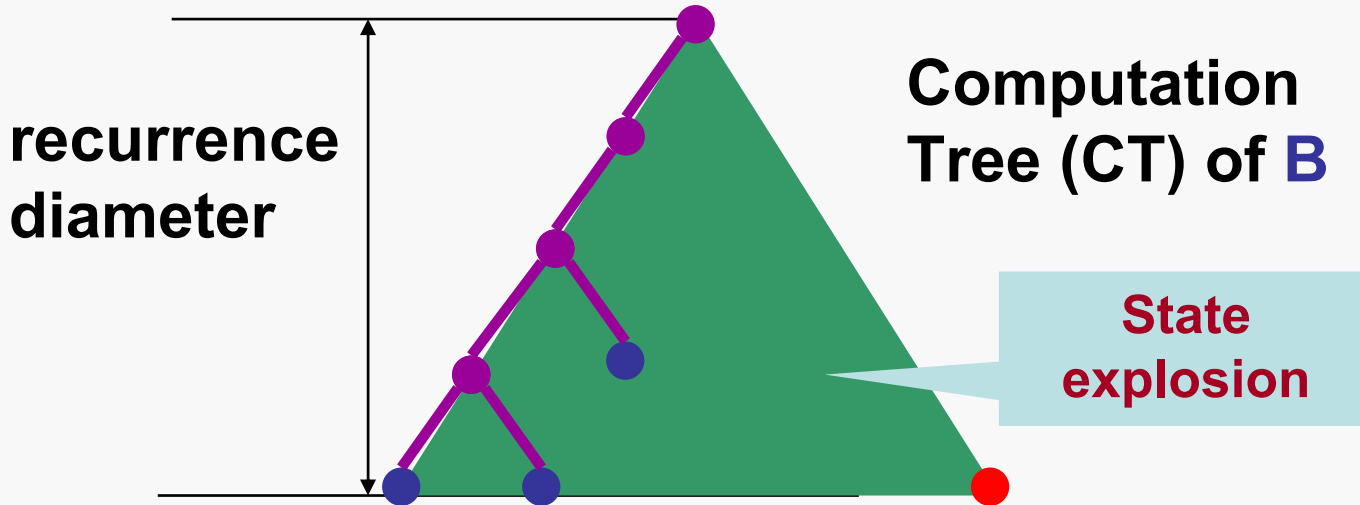
# Temporal Properties

- **Safety (something bad never happens):**
  - Airborne planes are at least 1 mile apart
  - Nuclear reactor core never overheats
  - Gamma knife never exceeds prescribed dose
- **Liveness (something good eventually happens):**
  - Core eventually reaches nominal temperature
  - Dishwasher tank is eventually full
  - Airbag inflates within 5ms of collision

# Automata-Theoretic Approach to SP

- **Every safety formula  $\varphi$**  can be translated to a **finite automaton  $A_{\neg\varphi}$**  such that  $L(\neg\varphi) = L(A_{\neg\varphi})$ .
- **State transition graph of  $S$**  can also be viewed as a **finite automaton  $A_S$**  (with all states accepting).
- **Satisfaction is reduced to language emptiness:**  
$$S \models \varphi \cong L(A_S) \subseteq L(A_{\varphi}) \cong L(A_S \times A_{\neg\varphi}) = \emptyset$$
- **Language emptiness is reduced to reachability:**  
is an accepting state reachable from an initial state?

# Checking Non-Emptiness: DFS

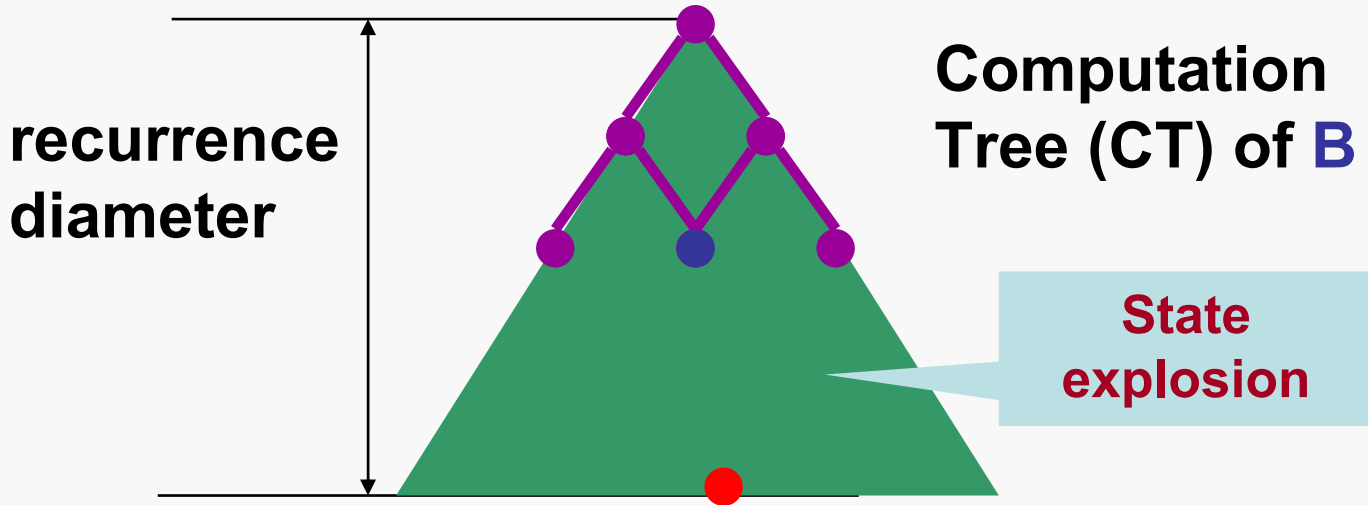


**Explore and all reachable states in the CT**

**Save all states**  
time efficient

**Save current path**  
memory efficient

# Checking Non-Emptiness: BFS



**Explore and all reachable states in the CT**

**Save all states: time efficient**

# Randomized Algorithms

- **Huge impact on CS:** (distributed) algorithms, complexity theory, cryptography, etc.
- **Takes of next step algorithm** may depend on **random choice (coin flip)**.
- **Benefits of randomization** include **simplicity, efficiency, and symmetry breaking**.

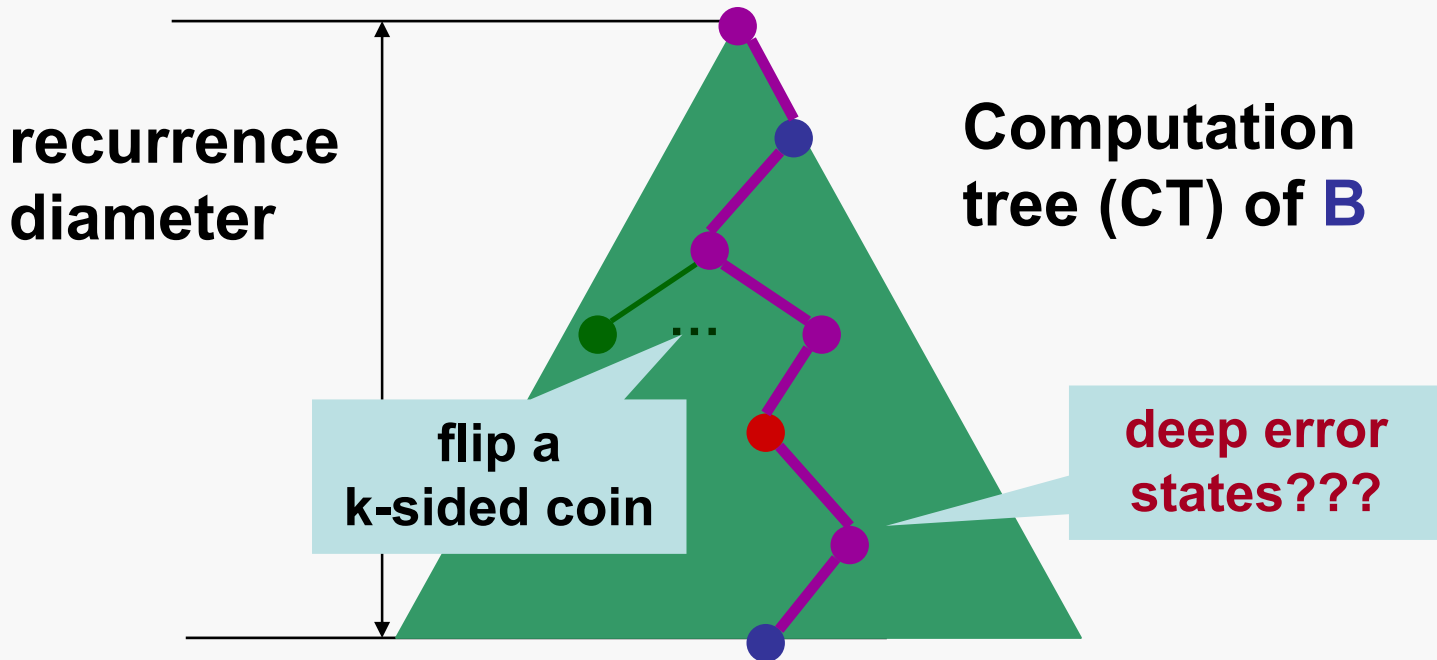


# Randomized Algorithms

- **Monte Carlo:** may produce **incorrect result** but **with bounded error probability**.
  - **Example:** Election's result prediction
- **Las Vegas:** always gives **correct result** but **running time is a random variable**.
  - **Example:** Randomized Quick Sort

# Monte Carlo Approach

[TACAS'05]

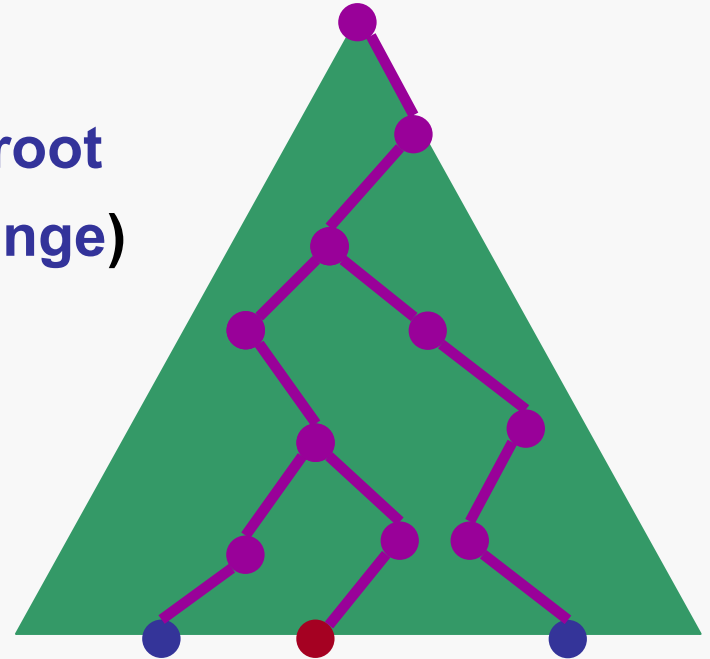


Explore  $N(\varepsilon, \delta)$  independent lassos in the CT

Error margin  $\varepsilon$  and confidence ratio  $\delta$

# DRS Las Vegas Approach

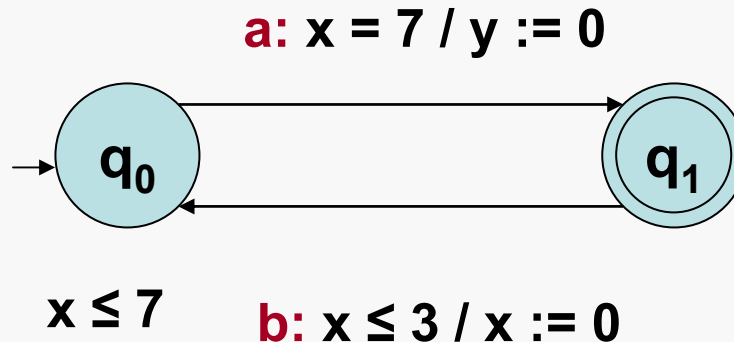
1. take one (several) **DRP** from the **root**
2. while (open nodes **o** are in the fringe)
  1. take a **DRP** from **o**
  2. if (accepting) **return** path
3. return null



**A deep random path (DRP)** is finished at **node o** if:

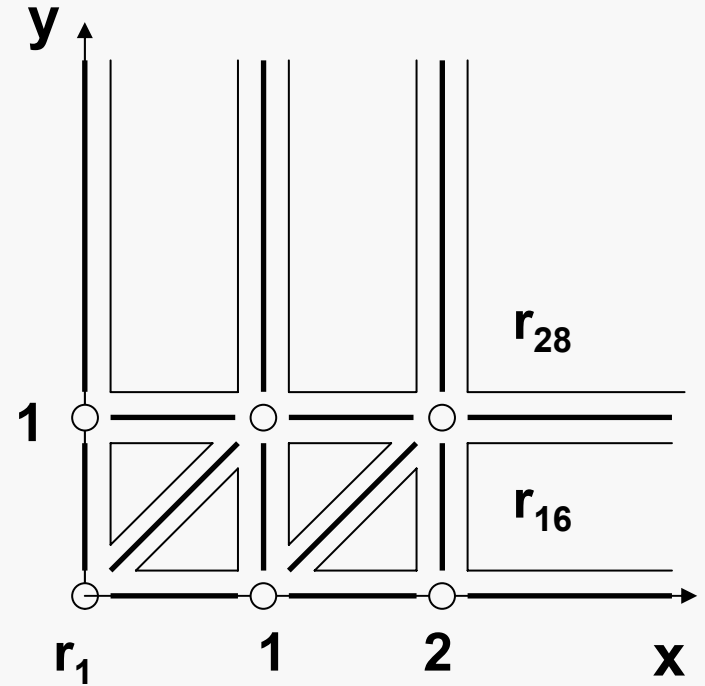
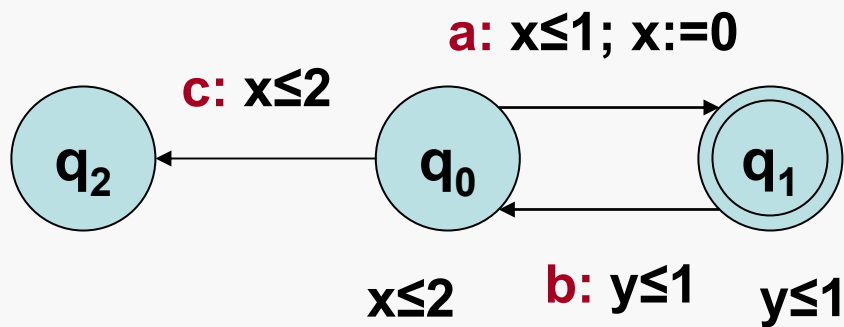
- the maximum depth is reached at **o**
- no unvisited node is a successor of **o**

# Timed Automata



- Finite set of **clocks**
- Finite set of **discrete states (modes)**
- Finite set of **accepting states (accepting modes)**
- Finite set of **edges**
  - **Guard:** convex clock polyhedron
  - **Reset:** set of clocks to be reset
- State **invariant** (convex clock polyhedron)

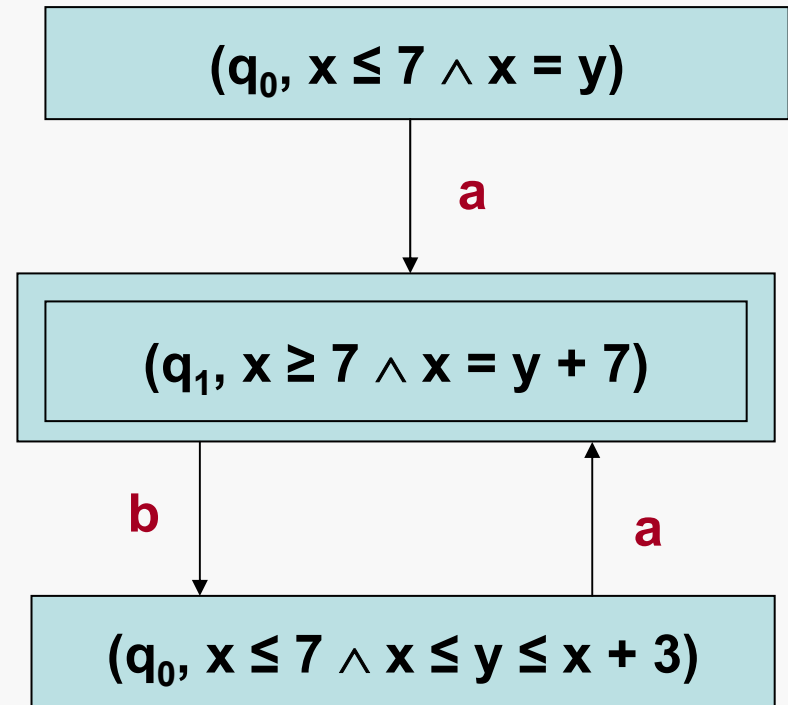
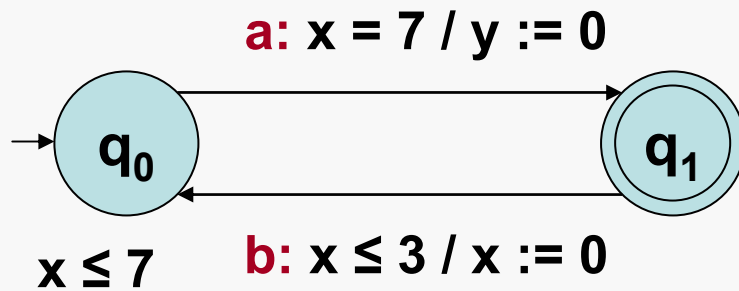
# TA and Clock Regions Reduction



**The number of clock regions is exponential in:**

- the number of clocks
- the largest clock-upper-bound constant

# TA and their Simulation Graph



# Experiments

- **DRS implementation:**
  - **Extension to** Open-Kronos MC for TA
- **Open-Kronos:**
  - **Input:** a system of TA and a bool exp (accepting states)
  - **Translation:** to a C-program compiled & linked to Profounder
  - **Profounder:** on-the-fly gen. of SG and DFS reachability anal.
- **Testbed:**
  - PC equipped with Athlon 2.6GHz
  - 1Gbyte RAM
  - Linux 2.6.5 (Fedora Core)

# MutExcl: Buggy Fischer Protocol

	Open Kronos				DRS		UPPAAL
proc	time	states	depth	time	states	depth	time
2	0.04	63	44	0.003	20	6	0.021
4	2.968	1227	1166	0.006	67	28	0.041
8	13.20	35409	2048	0.082	216	211	1.28
12	204	332253	2048	0.512	386	374	18.61
16	>12h	N/A	N/A	0.906	238	222	223 (oom)



# MutExcl: Correct Fischer Protocol

	Open Kronos		DRS	UPPAAL
proc	time	states	time	time
2	0.004	203	0.011	0.02
3	0.386	24949	0.513	0.03
4	943	3842501	1388	0.14
5	4h	oom	oom	2.01
6	4h	oom	oom	124
7	4h	oom	oom	>5h

# Philips Audio Protocol

	Open Kronos				DRS			UPPAAL
sender	time	states	depth	time	states	depth		time
1	0.004	72	71	0.003	16	12		0.026
4	3.259	46263	2048	0.007	30	26		0.041
8	422.2	1026446	2048	0.041	93	26		0.158
12	>12h	N/A	N/A	0.736	375	42		0.802
24	>12h	N/A	N/A	0.02	41	17		39.095
28	>12h	N/A	N/A	0.033	50	22		107 (oom)

# B&O Audio/Video Protocol

	Open Kronos				DRS			UPPAAL
sender	time	states	depth	time	states	depth		time
2	0.226	1285	1284	0.034	1659	1657		0.174
3	35.61	1135817	1997	10.76	166113	2318		1.05
4	53.532	1130669	1608	50.554	617760	2972		10.1
5	1200	oom	N/A	10m	6769520	4734		2m
6	1200	oom	N/A	37m	30316978	13376		12m (oom)

# Related Work

- **Random walk testing:**
  - Heimdahl et al: Lurch debugger.
  - P. Haslum: Monte Carlo MC by random walk.
- **Random walks to sample system state space:**
  - Mihail & Papadimitriou (and others)
- **Monte Carlo Model Checking of Markov Chains:**
  - Herault et al: LTL-RP, bonded MC, zero/one ET
  - Younes et al: Time-Bounded CSL, sequential analysis
  - Sen et al: Time-Bounded CSL, zero/one ET
- **Probabilistic Model Checking of Markov Chains:**
  - ETMCC, PRISM, PIOAtool, and others.
- **Sat Solvers:** randomization is not the main concern

# Conclusions

- **DRS is a complete randomized, MC algorithm for the classical problem of model checking safety properties.**
- **DRS allows to fine tune the initial number of random paths from the root and the maximum search depth.**
- **DRS is able to find extremely deep counterexamples while consistently outperforming Kronos and UPPAAL in the process.**
- **DRS is best suited to find counterexamples and not to prove their absence.**