

Spatio-temporal model checking using topochecker

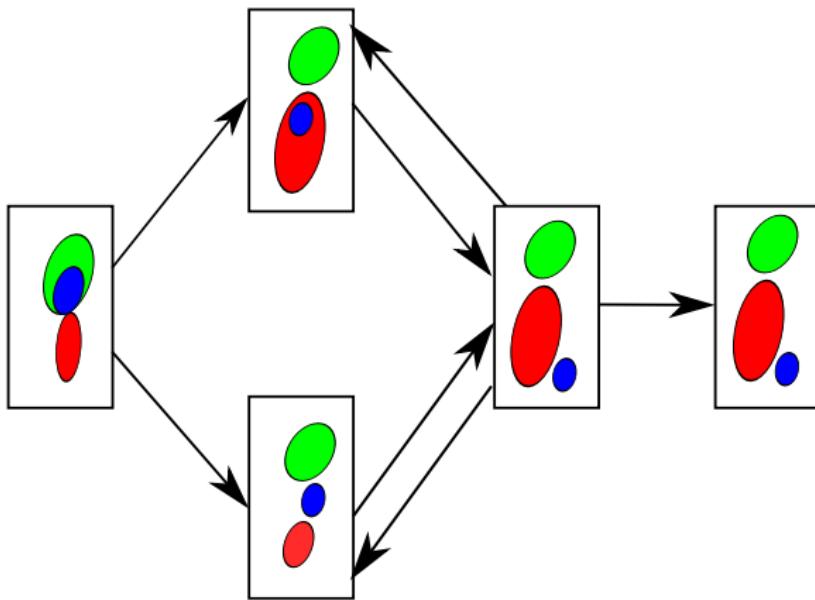
Vincenzo Ciancia, Diego Latella, Michele Loreti, Mieke Massink

Bertinoro, June 23 2015

Specification

Spatio-temporal logics

Branching time spatio-temporal models



Branching time spatio-temporal models

The product of a Kripke frame and a closure space

$$\mathcal{M} = ((X, \mathcal{C}), (S, \mathcal{R}), \mathcal{V}_{s \in S})$$

X points in space, S states, \mathcal{C}, \mathcal{R} , spatial and temporal neighbourhood/successor relations.

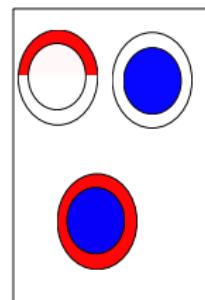
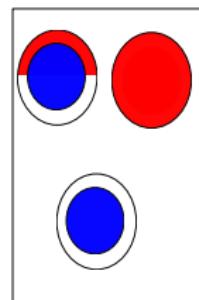
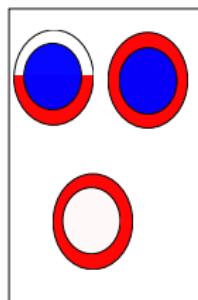
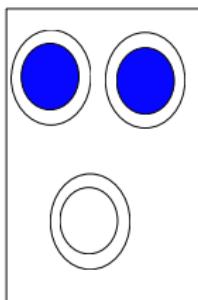
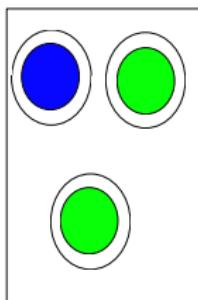
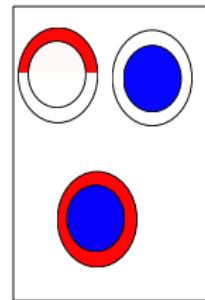
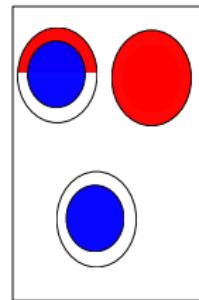
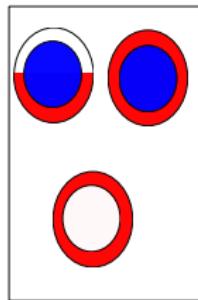
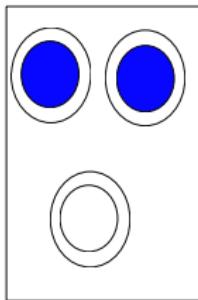
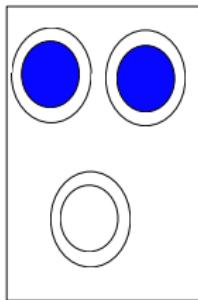
\mathcal{V} : assign to proposition p the pairs (x, s) where it is true

Syntax

| Grammar | | | topochecker |
|---------------|--------------------|--------------------|-------------|
| $\Phi ::=$ | \top | [TRUE] | TT |
| | p | [ATOMIC PREDICATE] | [p] |
| | $\neg\Phi$ | [NOT] | ! phi |
| | $\Phi \vee \Phi$ | [OR] | phi1 phi2 |
| | $\Phi \wedge \Phi$ | [AND] | phi1 & phi2 |
| | $\mathcal{N}\Phi$ | [NEAR] | N phi |
| | $\Phi S \Phi$ | [SURROUNDED] | phi S phi |
| | $A\varphi$ | [ALL FUTURES] | A ... |
| | $E\varphi$ | [SOME FUTURE] | E ... |
| | | | |
| $\varphi ::=$ | $X\Phi$ | [NEXT] | X phi |
| | $F\Phi$ | [EVENTUALLY] | F phi |
| | $G\Phi$ | [GLOBALLY] | G phi |
| | $\Phi U \Phi$ | [UNTIL] | phi1 U phi2 |

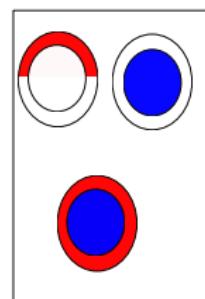
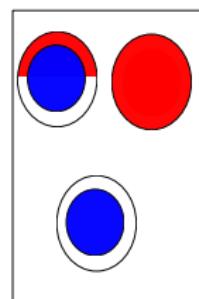
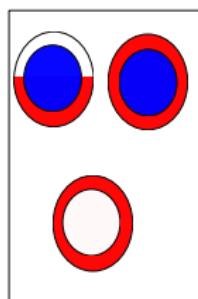
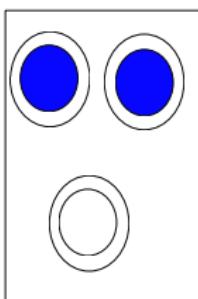
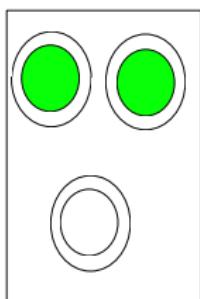
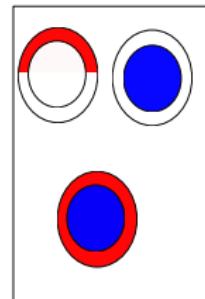
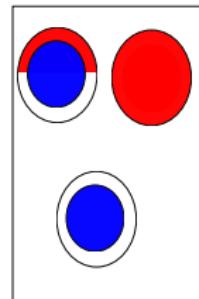
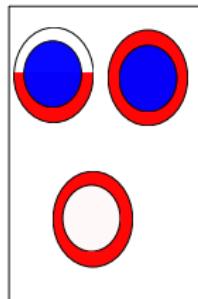
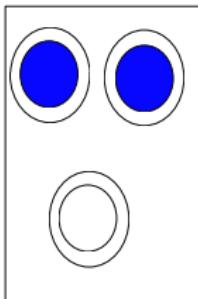
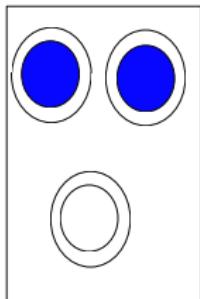
Eventually surrounded by ϕ

EF (*blue* \mathcal{S} *red*)



Surrounded by eventually ϕ

blue S (EF red)



Basics of topochecker

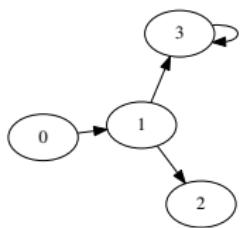
Model definitions

Graphs as models

Dot file format

```
digraph{
    0; 1; 2; 3;
    0 ->1; 1 ->2; 1 ->3; 3 ->3;
}
```

Graphs as models

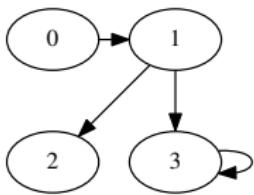


Graphs as models

Dot file format

```
digraph{
    0 [pos = "1,1!"];
    1 [pos = "2,1!"];
    2 [pos = "1,0!"];
    3 [pos = "2,0!"];
    0->1; 1->2; 1->3; 3->3;
}
```

Graphs as models



Valuation of propositional letters

CSV with three columns: Kripke state, point in space, list of propositions

0 , 0 , a

0 , 1 , b

0 , 2 , a

0 , 3 , a , b

Valuation of propositional letters

CSV with three columns: Kripke state, point in space, list of propositions, optional quantitative values

0 , 0 , a=1 . 0

0 , 1 , b=2 . 0

0 , 2 , a=3 . 0

0 , 3 , a=10 . 0 , b=5 . 0

Atomic propositions are quantitative constraints

```
[x < 100]
```

```
[x >= 115] & [x < 190]
```

```
[x >= 115] & (! [y > 10])
```

Images are spatial models

A node for each pixel

An edge for each adjacent pair

Implemented: 4-adjacency: n-s-w-e

Colours as atomic propositions

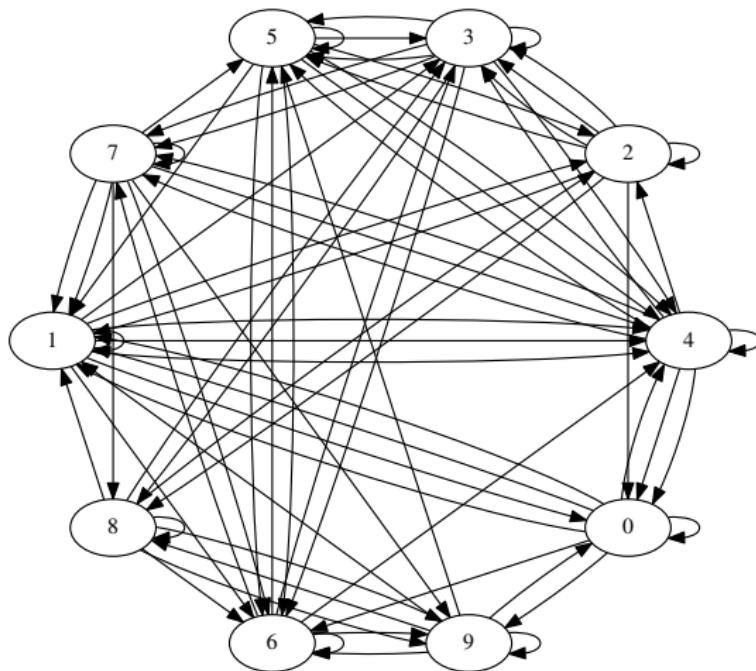
RGB components are quantitative propositions

```
[Red = 100]
& [Blue = 100]
& [Green = 0];

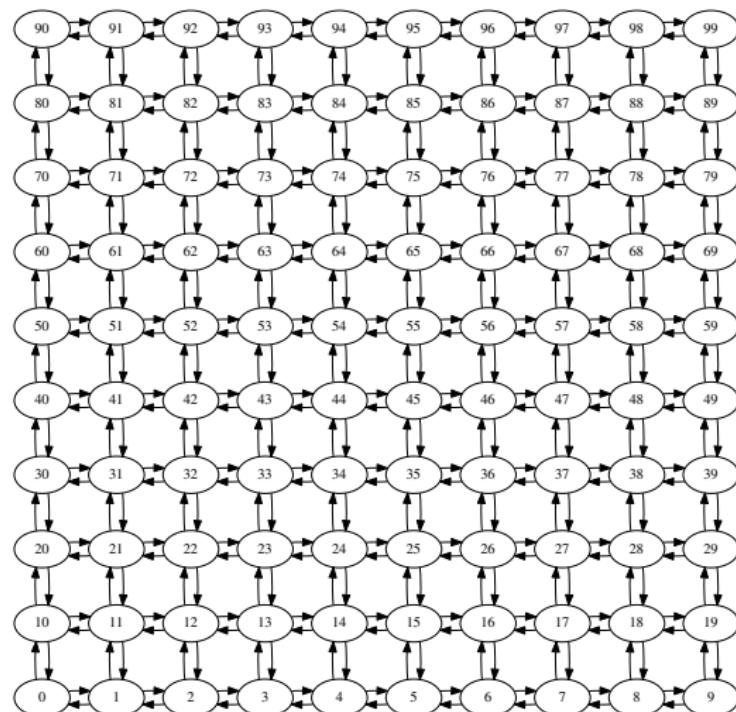
[Red > 20] & [Blue = 10];

[Green > 100];
```

Kripke.dot



space.dot



eval.csv

```
...
0,95,b
0,96,b
0,97,b
0,98,b
0,99,b
1,0,b
1,1,b
...
```

Topochecker sessions

```
Kripke "kripke.dot"
Space "space.dot"
Eval "eval.csv";

Let phi = [a] S [b];

Output "output/state" "0","3";

Check "0xFF0000" A F phi;
```

Running topochecker

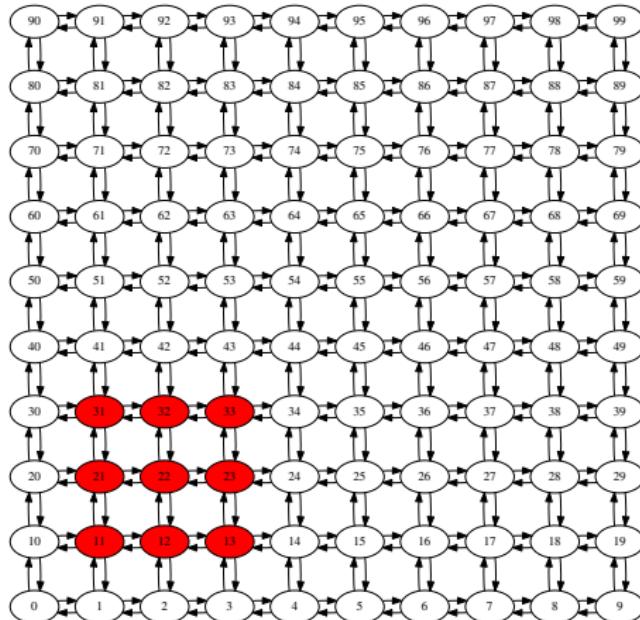
```
/path/to/topochecker foo.topochecker
```

Resulting files

```
$ ls output/  
state-0.dot  state-3.dot
```

Result

neato -Tx11 output/state-0.dot



Multiple outputs

```
Kripke "kripke.dot"
Space "space.dot"
Eval "eval.csv";

Let phi = [a] S [b];

Output "output/state" "0","3";
Check "0xFF0000" A F phi;

Output "output2/state" "0";
Check "0x00FF00" E X phi;
```

Repeated execution and caching

```
$ ls
ccfad490e0c46621ef4215dec64ff0d5cdac5f9d2d2fe6fe08e
110a9fc457ec8_842662cb094d8af5bf6f92b8245fb5ef9e3ec
4272adcc2b7538b0adf4a613392.fmla

ccfad490e0c46621ef4215dec64ff0d5cdac5f9d2d2fe6fe08e
110a9fc457ec8_842662cb094d8af5bf6f92b8245fb5ef9e3ec
4272adcc2b7538b0adf4a613392.slice

...
eval.csv kripke.dot space.dot test.topochecker
```

Complexity

Global k -passes algorithm (k very small)

Complexity: $\mathcal{O}(|S_n + S_e| \cdot |X_n + X_e| \cdot |\phi|)$

Efficiency: 10000 states, 10000 points of space, 4 edges per node, ~ 3 subformulas, ~ 300 millions of cells

Computation time 28 seconds, central memory used: ~ 1.6 gigabytes

If it fits memory it'll be fine

Enemy is *free space*, not *computation time*

(after all it's spatial model checking :-))

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Enemy is *free space*, not *computation time*

(after all it's spatial model checking :-))

Break

(10 mins)

Theory

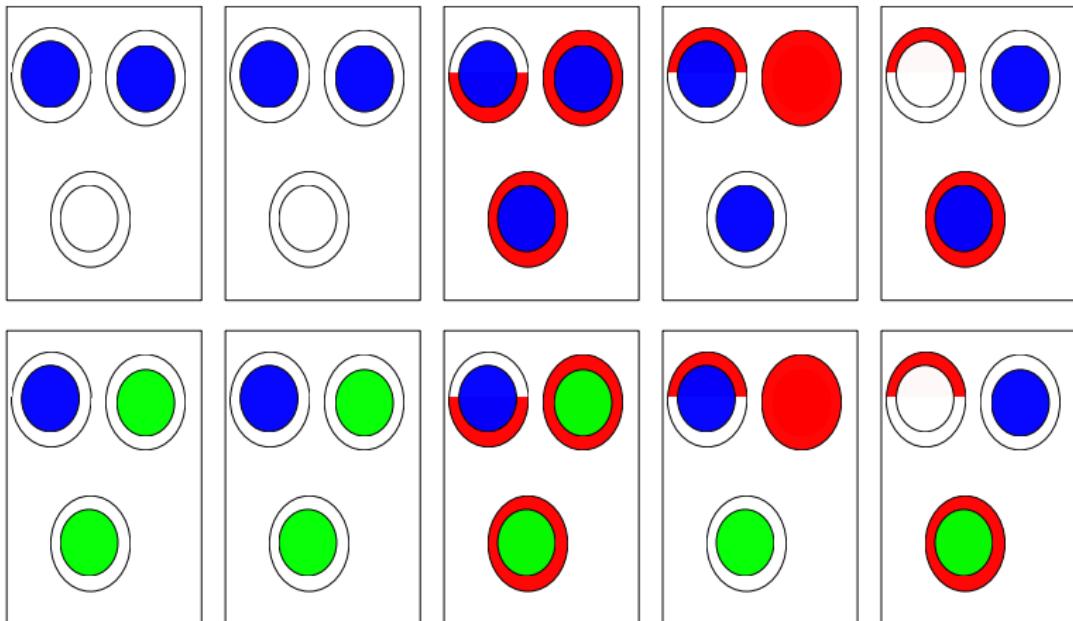
Formal semantics

Satisfaction

For each point x (of space) and state s :

$$(x, s) \models \phi$$

$\text{EF} (\text{blue} \mathcal{S} \text{red})$



Syntax

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Interpretation

$$\mathcal{M} = ((X, \mathcal{C}), (S, \mathcal{R}), \mathcal{V}_{s \in S})$$

$$\mathcal{M}, x, s \models \top$$

$$\mathcal{M}, x, s \models p \iff x \in \mathcal{V}_s(p)$$

$$\mathcal{M}, x, s \models \neg\Phi \iff \mathcal{M}, x, s \not\models \Phi$$

$$\mathcal{M}, x, s \models \Phi \vee \Psi \iff \mathcal{M}, x, s \models \Phi \text{ or } \mathcal{M}, x, s \models \Psi$$

$$\mathcal{M}, x, s \models \mathcal{N}\Phi \iff x \in \mathcal{C}(\{y \in X \mid \mathcal{M}, y, s \models \Phi\})$$

$$\mathcal{M}, x, s \models \Phi \mathcal{S} \Psi \iff \exists A \subseteq X. x \in A \wedge \\ \forall y \in A. \mathcal{M}, y, s \models \Phi \wedge \\ \forall z \in \mathcal{B}^+(A). \mathcal{M}, z, s \models \Psi$$

Interpretation

$$\mathcal{M} = ((X, \mathcal{C}), (S, \mathcal{R}), \mathcal{V}_{s \in S})$$

$$\begin{array}{lcl} \mathcal{M}, x, s \models A\varphi & \iff & \forall \sigma \in \mathcal{P}_s. \mathcal{M}, x, \sigma \models \varphi \\ \mathcal{M}, x, s \models E\varphi & \iff & \exists \sigma \in \mathcal{P}_s. \mathcal{M}, x, \sigma \models \varphi \end{array}$$

$$\begin{array}{lcl} \mathcal{M}, x, \sigma \models X\Phi & \iff & \mathcal{M}, x, \sigma(1) \models \Phi \\ \mathcal{M}, x, \sigma \models \Phi U \Psi & \iff & \exists n. \mathcal{M}, x, \sigma(n) \models \Psi \text{ and} \\ & & \forall n' \in [0, n). \mathcal{M}, x, \sigma(n') \models \Phi \end{array}$$

where \mathcal{P}_s are the paths rooted in s in the Kripke structure

Example: stability of patterns

```
pattern2steps = pattern & A X pattern
```

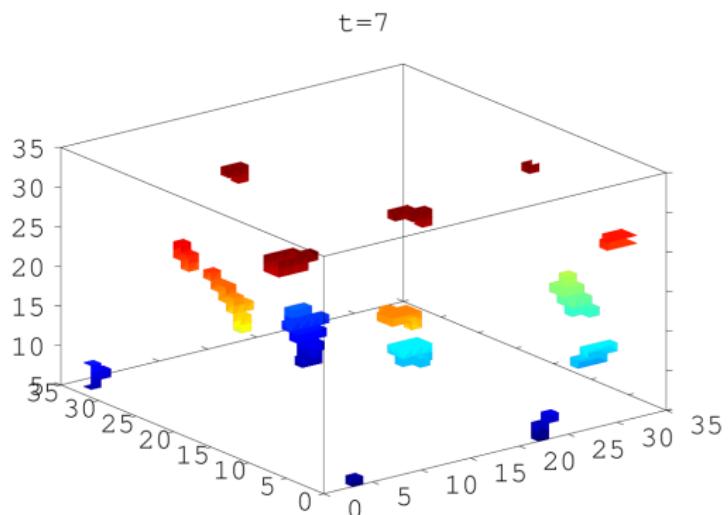
```
pattern3steps = pattern & A X pattern2steps
```

```
...
```

```
pattern10steps = pattern9steps & ...
```

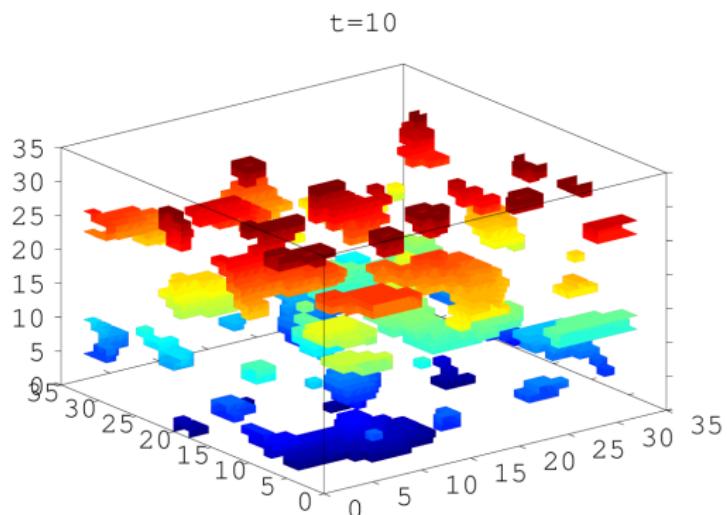
Areas of low concentration of A in 3D over time

Points where pattern persists for at least 9 steps



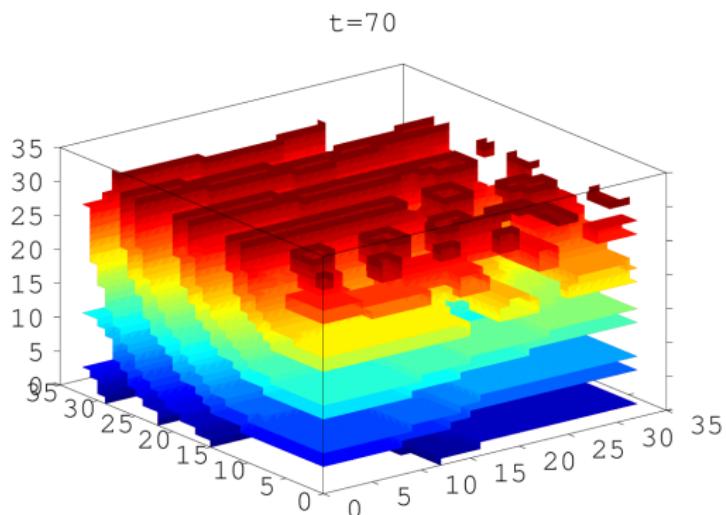
Areas of low concentration of A in 3D over time

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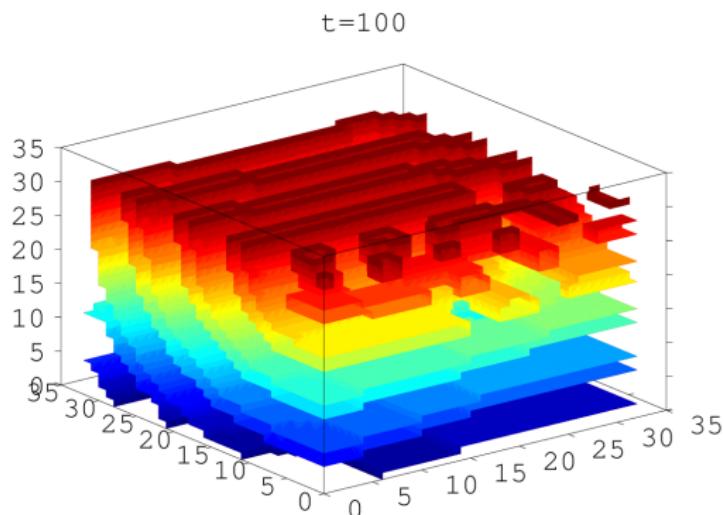
Areas of low concentration of A in 3D over time

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Areas of low concentration of A in 3D over time

Points where pattern persists for at least 9 steps

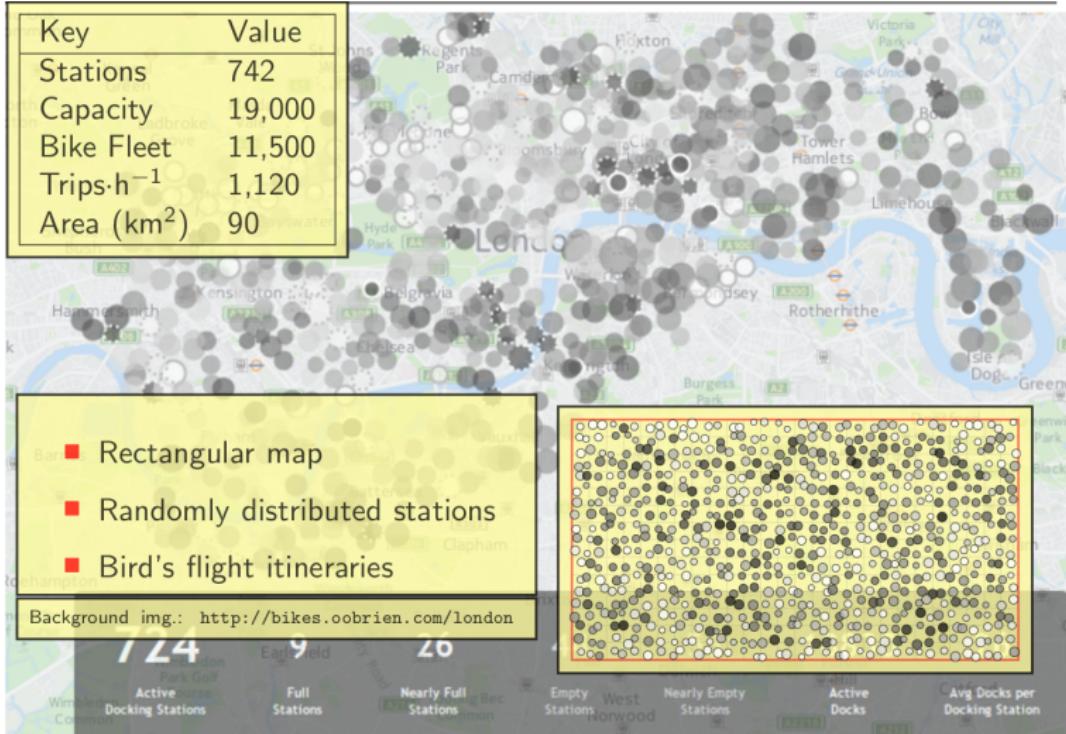


Case study

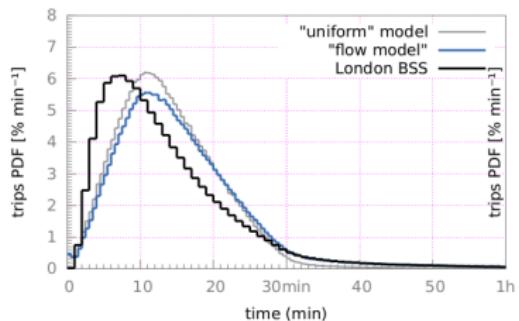
Bike sharing systems

[Ciancia, Latella, Massink, Paskauskas - SASOWS2015]

Bike sharing



Bike sharing



Uniform Multi-agent, uniform OD

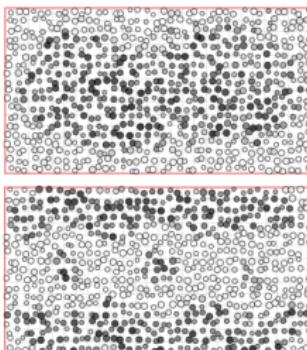
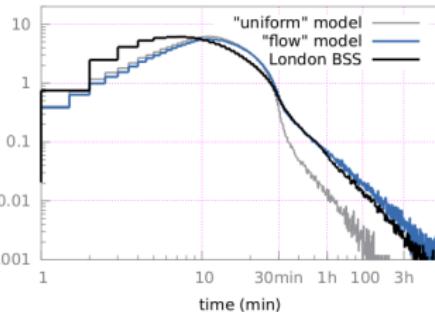
- Trips(> 30)min= 2%

Flow Multi-agent, non-uniform OD

- Trips(> 30)min= 7.7% Bingo!

Expected Trips(> 30)min= 0%

Soft control: dissolve clusters



Model checking

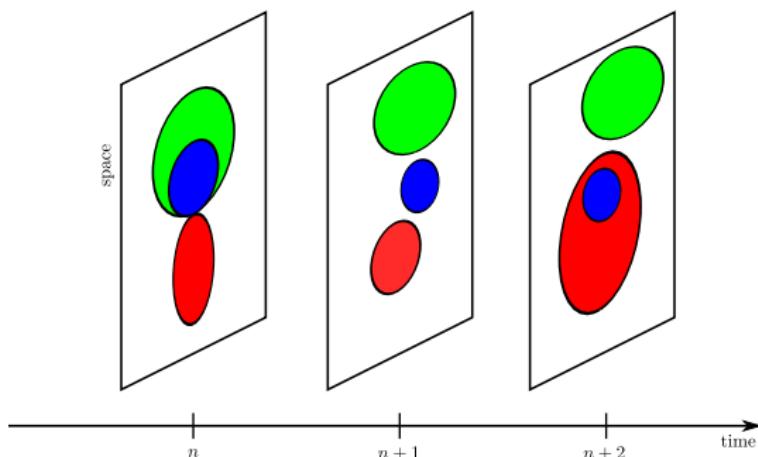
Use a simulator to produce possible spatio-temporal **traces**

Analyse traces using STLCS

(ongoing: *statistical* model checking)

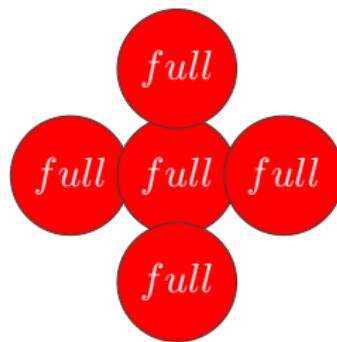
Model

Kripke model: linear



Spatial patterns

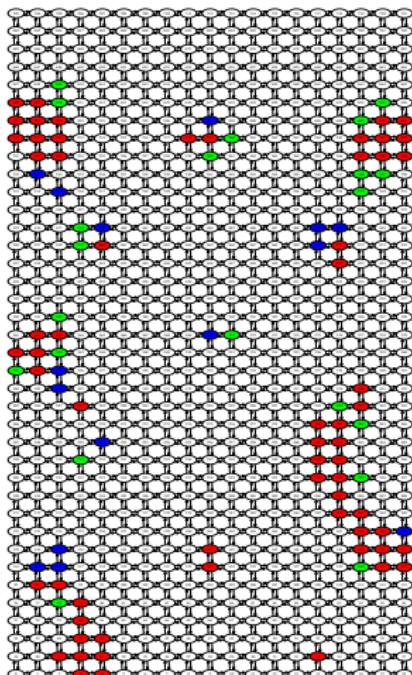
Cluster of full stations



Center of a cluster

```
Let full = [vacant == 0];
Let cluster = I full;
```

Persistent clusters



$\text{cluster} \triangleq I_{\text{full}}$

$\text{cluster2steps} \triangleq \text{cluster} \& (\text{A} \times \text{cluster})$

$\text{cluster3steps} \triangleq \text{cluster} \& (\text{A} \times \text{cluster2steps})$

eventually, cluster (green)

eventually, cluster that persists for two steps (blue)

eventually, cluster that persists for three steps (red)

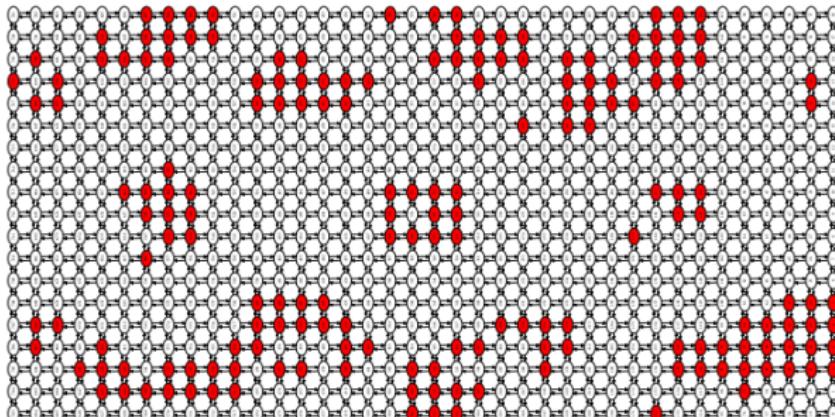
User dissatisfaction

Upon bumping on a full station, cycle to a nearby one or wait

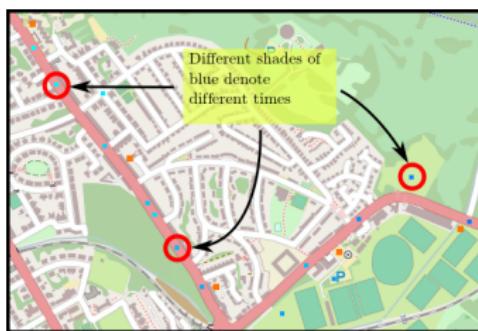
Rare event: User bumps to a full station, followed by bumping to a full station, followed by bumping to a full station, . . .

Formula to express this event:

```
unlucky3steps = full & (N(AX(full &  
                           (N(AX(full & N(AX full))))))))
```



Example: GPS traces



see tutorial

Outlook

Current research

Spatial propagation

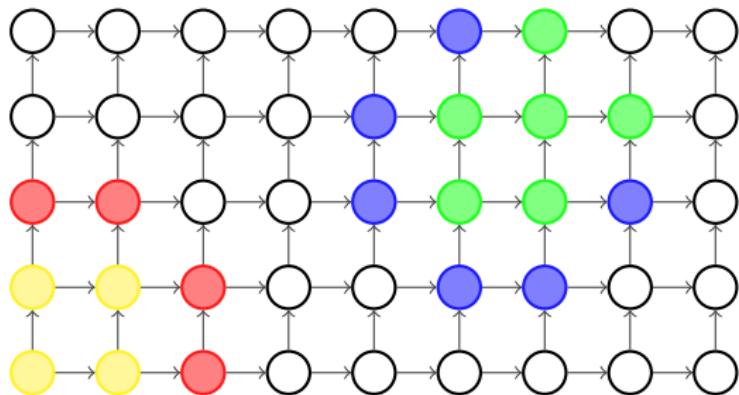
Directed graphs distinguish between “reaching” and “being reached”

Using a (spatial-)path based semantics, operators may be defined in both directions

Redefine $\phi_1 \mathcal{S} \phi_2$ using paths (currently a theorem)

Define operators that explore space in the opposite direction

Spatial propagation



Each yellow point satisfies $yellow \mathcal{S} red$

Each purple point satisfies $red \mathcal{P} white$

Statistical spatio-temporal model checking

V. Ciancia, D. Latella, M. Massink, A. Vandin

Models coming from probabilistic simulations

Boolean spatio-temporal model checking

Turn boolean values into probabilities!

Statistical spatio-temporal model checking

Repeat experiment several times

count occurrences

get a probability and a confidence interval for each point of spacetime

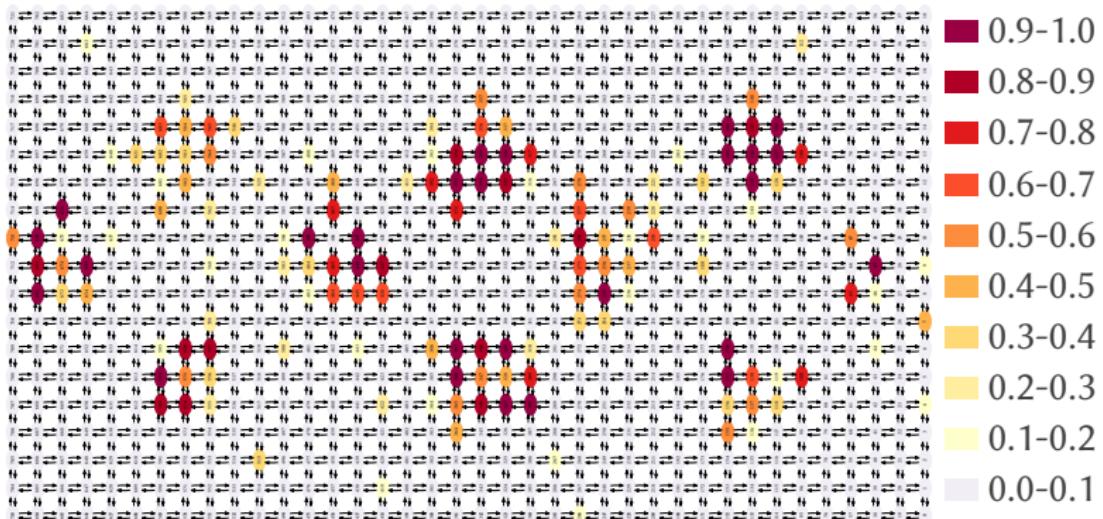
Tool support

A “server mode” in topochecker

Several queries for the same model

MultiVESTA: multiple (thousands!) observables, automatic orchestration of the simulator and model checker

Heat map (confidence intervals not shown)



Medical images as models

G. Belmonte, V. Ciancia, D. Latella, M. Massink

Just like images, but k -dimensional!

Anisotropic

Only one atomic proposition (intensity)

Distance operators

At most distant k , distance between k_1 and k_2

[Handbook of Spatial Logics]

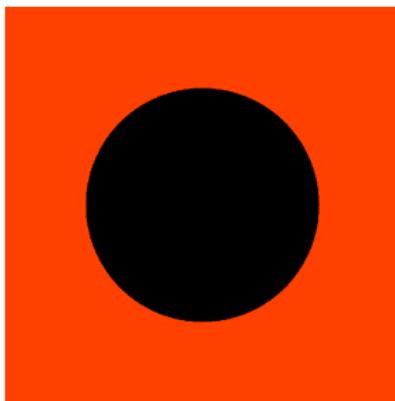
[Nenzi, Bortolussi - VALUETOOLS 2014]

Bounded surrounded operator

[Nenzi, Bortolussi, Ciancia, Loreti, Massink - RV2015]

Distance transform

Use *distance transforms* for linear or quasi-linear model checking



Euclidean and shortest-path distance

Graphs: naturally augmented with *weights*, and *shortest-path* distance

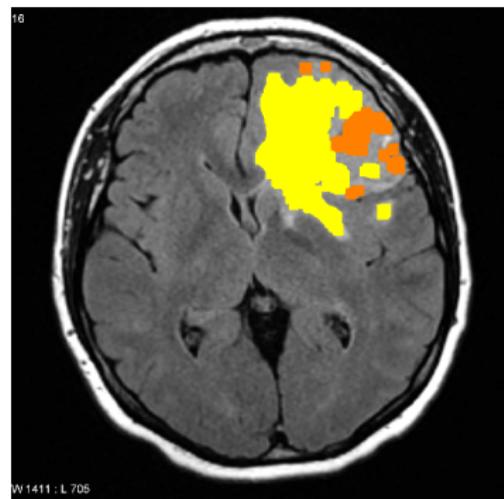
Images: naturally augmented with *positions*, and *Euclidean* distance

What models?

Topological spaces abstract metric spaces

Closure spaces abstract <?>

Task: detect tumor and oedema



Filtering noise

```
Let lt = [x > 90] & [x < 120];  
  
Let tumor = N (N (N  
    (I (I ((I (I (I lt))))))));
```

Detecting closeness

```
Let ut = [x >= 115] & [x < 190];
Let lt = [x > 90] & [x < 120];

Let lt1 = N (N (N (I (I (I (I (I lt)))))));
Let ut1 = N (N (N (I (I (I (I ut))))));

Let utdst = MDDT (ut1, <=50.0);

Let reach(a,b) = !( (!b) S (!a) );

Let tum1 = lt1 & reach(lt1,utdst);
Let oed1 = ut1 & reach(utdst,tum1);

...
```

Ugly, but on the right track!

Medical image analysis *is* logically structured

Just better than the human eye!

Parameter finding [R. Grosu, S. A. Smolka, F. Corradini, A. Wasilewska, E. Entcheva, E. Bartocci - CACM 2009]

Collective logic

Collective formulas

| | | | |
|--------|-------|--------------------|---------|
| Ψ | $::=$ | \top | [TRUE] |
| | | $\neg\Psi$ | [NOT] |
| | | $\Psi \wedge \Psi$ | [AND] |
| | | $\Phi \prec \Psi$ | [SHARE] |
| | | $\mathcal{G}\Phi$ | [GROUP] |

Individual formulas

| | | | |
|--------|-------|-------------------------|----------------|
| Φ | $::=$ | p | [ATOMIC PROP.] |
| | | \top | [TRUE] |
| | | $\neg\Phi$ | [NOT] |
| | | $\Phi \wedge \Phi$ | [AND] |
| | | $\mathcal{N}\Phi$ | [NEAR] |
| | | $\Phi \mathcal{P} \Phi$ | [PROPAGATION] |
| | | $\Phi \mathcal{S} \Phi$ | [SURROUNDED] |

Collective satisfaction?

$\mathcal{M}, A \models \Psi$
 A is a *set* of points!

Semantics

$$\mathcal{M}, A \models_C \top$$

$$\mathcal{M}, A \models_C p \iff A \subseteq \mathcal{V}(p)$$

$$\mathcal{M}, A \models_C \neg\psi \iff \mathcal{M}, A \not\models_C \psi$$

$$\mathcal{M}, A \models_C \psi_1 \wedge \psi_2 \iff \mathcal{M}, A \models_C \psi_1 \text{ and } \mathcal{M}, A \models_C \psi_2$$

$$\mathcal{M}, A \models_C \phi \prec \psi \iff \mathcal{M}, \{x \in A \mid \mathcal{M}, x \models \phi\} \models_C \psi$$

$$\begin{aligned} \mathcal{M}, A \models_C \mathcal{G}\phi &\iff \exists B \subseteq X. A \subseteq B \wedge \\ &\quad \wedge B \text{ is path-connected} \wedge \\ &\quad \wedge \forall z \in B. \mathcal{M}, z \models \phi \end{aligned}$$

Derived operators

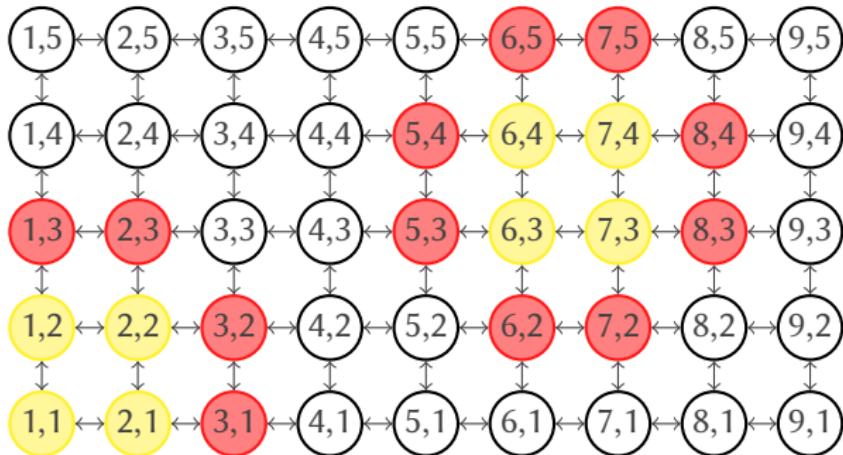
$$\forall \phi \triangleq \neg\phi \prec \mathcal{G}\perp \quad [\text{FORALL, INDIVIDUALLY}]$$

$$\exists \phi \triangleq \neg(\forall \neg\phi) \quad [\text{EXISTS}]$$

$$\emptyset \triangleq \forall \perp \quad [\text{EMPTY}]$$

$$\phi_1 \text{CS} \phi_2 \triangleq \mathcal{G}(\neg\phi_2 \wedge (\phi_1 \mathcal{S} \phi_2)) \quad [\text{COLLECTIVELY SURROUNDED}]$$

Collectively surrounded



$M, \{(6, 4), (7, 3)\} \models \text{yellow CS red}$

$M, \{(1, 1), (2, 1), (2, 2), (1, 2)\} \models \text{yellow CS red}$

$M, \{(6, 4), (2, 1)\}) \not\models \text{yellow CS red}$

Thanks for listening!