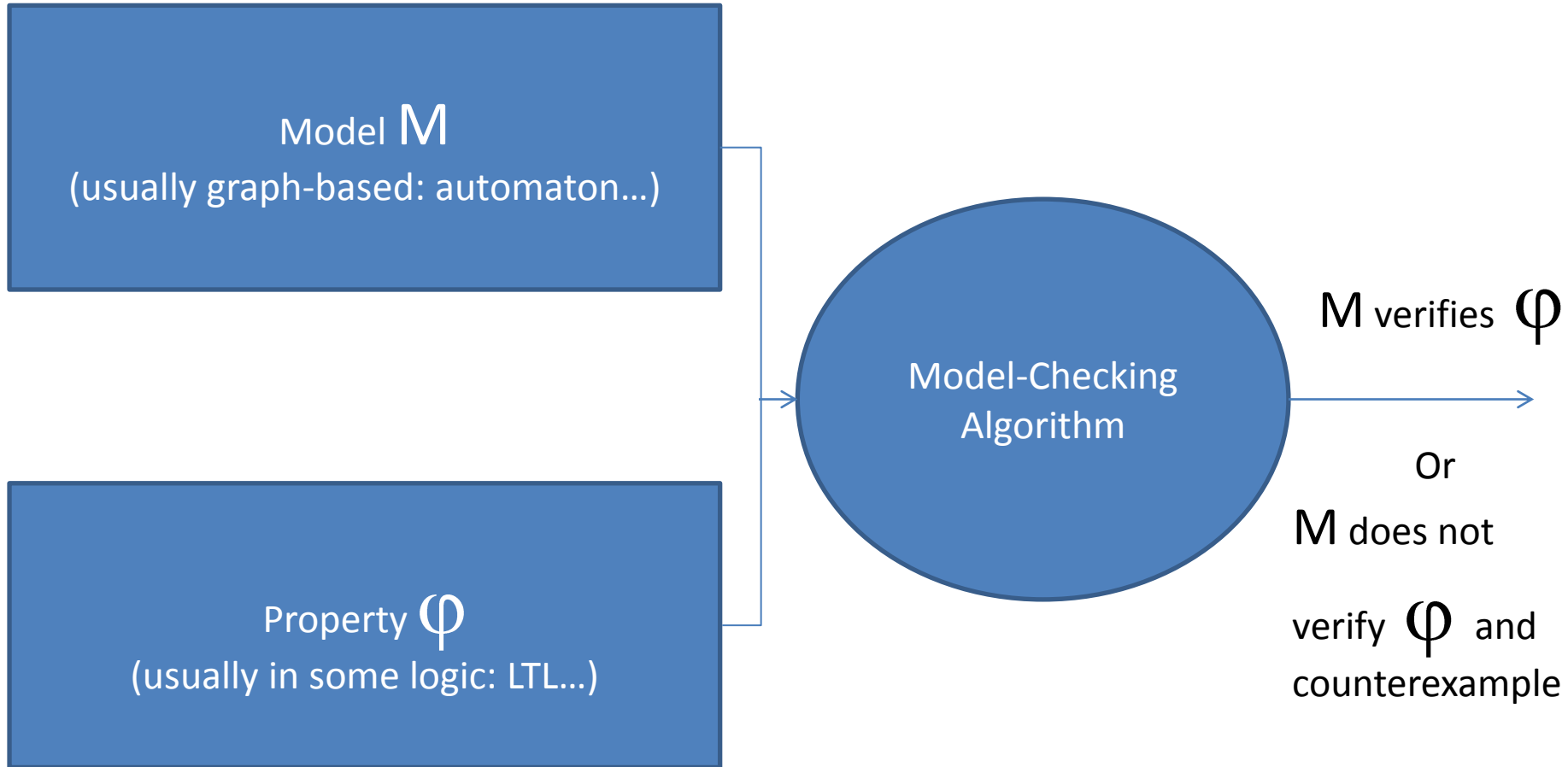


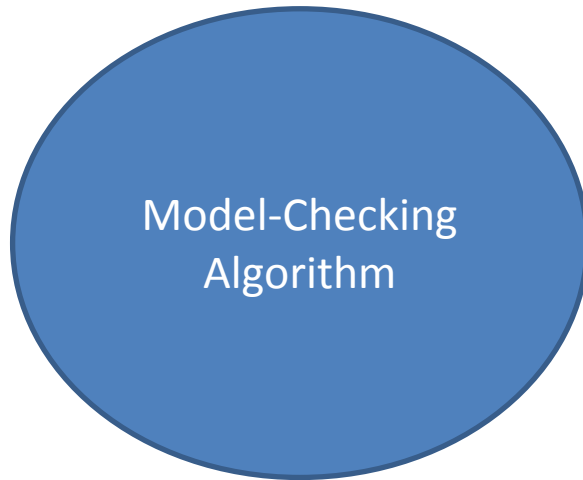
Overview of the ANR project

Model-Checking

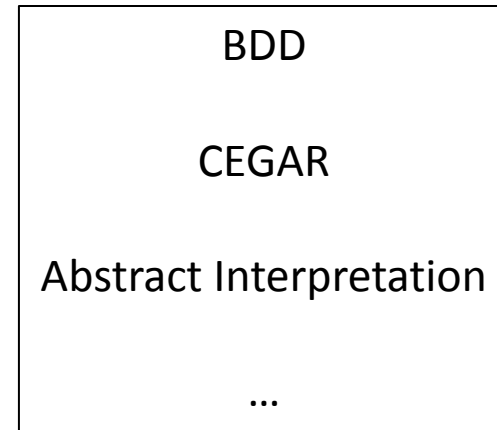


[Clarke - Emerson - Siffakis in the 80's]. Turing award 2007

Why Turing Award?



+



Model Reduction Techniques

Processor

Rocket, Planes



Model Checkers
(Blast, NuSMV, SPIN, PRISM...)



Verification, Bugs...

C program code

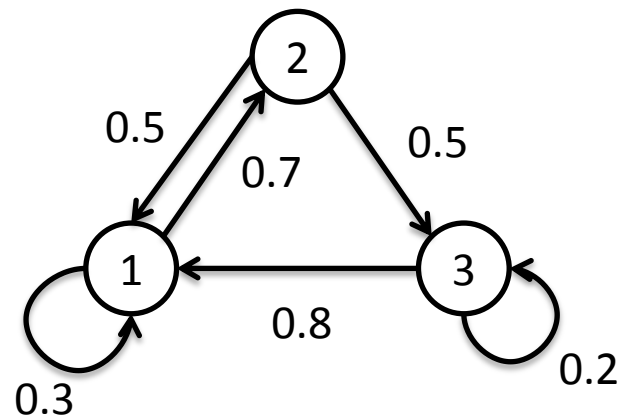
=> Model Reduction for Stochastic Systems

Stochastic Models:

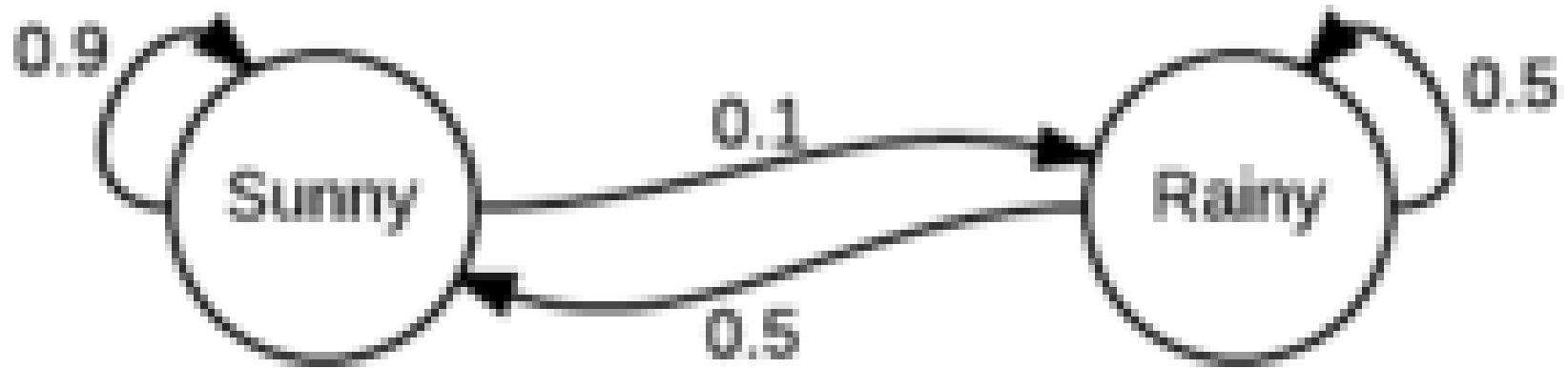
Markov Chains

- It can be represented as a matrix or labeled graph.
 - Nodes represent states.
 - Edges represent influences.
 - Stochastic values represent the **uncertainty** level.

$$M = \begin{pmatrix} 0.3 & 0.7 & 0 \\ 0.5 & 0 & 0.5 \\ 0.8 & 0 & 0.2 \end{pmatrix}$$



Markov Chains examples



$$P(X^{t=10} = \text{Rainy} \mid X^{t=0} = \text{Sunny}) = 0.15\dots$$

Bio-chemical context:

$P(\text{Concentration of Insulin is small after 1 hour} \mid \text{concentrations at } t=0)$?

Semantics and Logics

2 semantics: runs/samples vs distribution

Taking (infinitely) many **samples** following the transition probability:

Sunny sunny...
Sunny sunny...
Sunny sunny...
Sunny rainy....

Then average the samples.

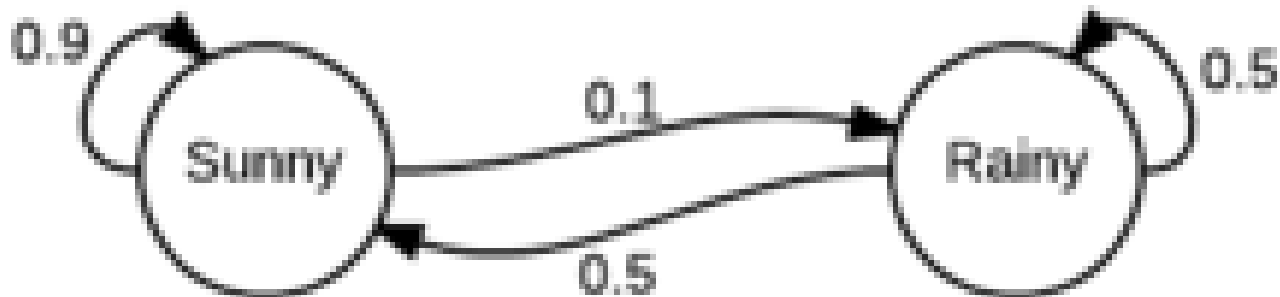
Initial **distribution**: Start from sunny (1,0)

After 1 step: (0.9,0.1)

After 2 steps: (0.855,0.145)

...

Proportion of samples ending in « sunny » after 2 steps = distribution of sunny after 2 steps



2 kinds of logics:

Path based logic:

Proportion of paths satisfying some constraints

Ex of Paths: sunny sunny...;
sunny rainy...

ex prop: path « eventually always sunny ».

$$P(\text{eventually always sunny}) = 0$$

=> Give rises to logics as PCTL(*)

Distribution based logic:

There is a sequence of probability distributions generated by model satisfying some property

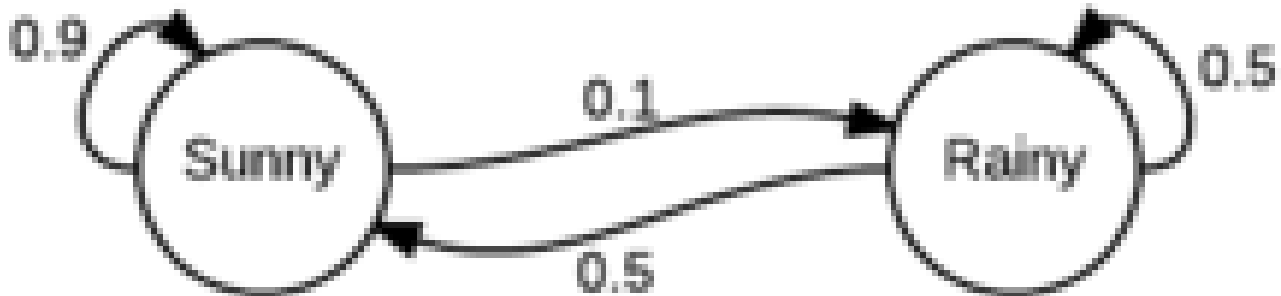
ex of sequence of probability:

(1,0) (0.9,0.1) (0.855,0.145)....
(0.5,0.5) (0.7,0.3) (0.78,0.12)....

Ex of prop:

$X_0[\text{sunny}] \geq 0.7 \Rightarrow \text{always } X[\text{sunny}] \geq 0.7.$

True.



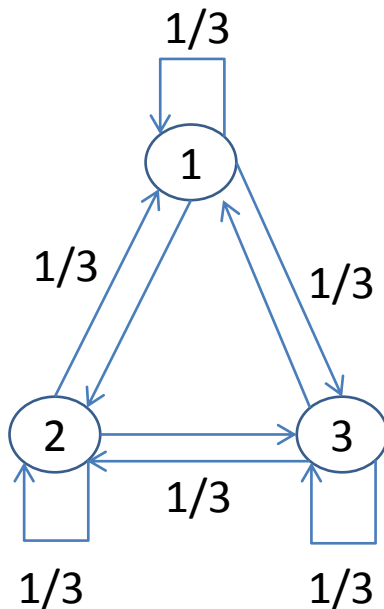
Uncomparable logics:

Distribution based logic

vs

Path based logic

$\Phi = \llcorner \text{next eventually } X[1] > 0.7 \llcorner$ cannot be expressed by PCTL*:



M does not satisfy Φ (from any initial distrib)

For instance, $P(\text{next eventually } 1) > 0.7$ is true for M
(from any state)

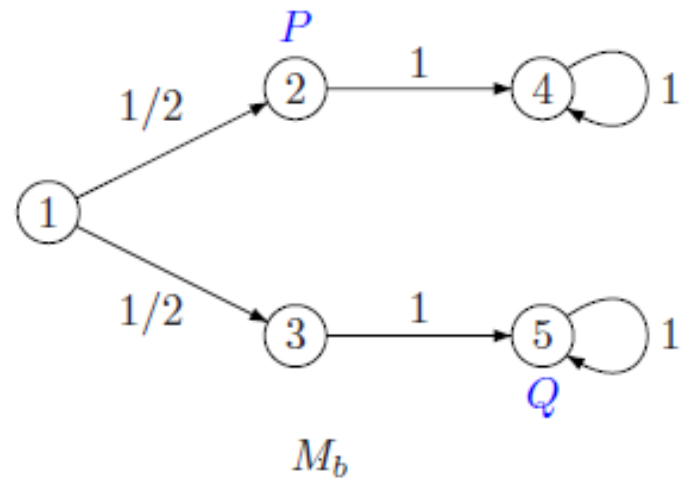
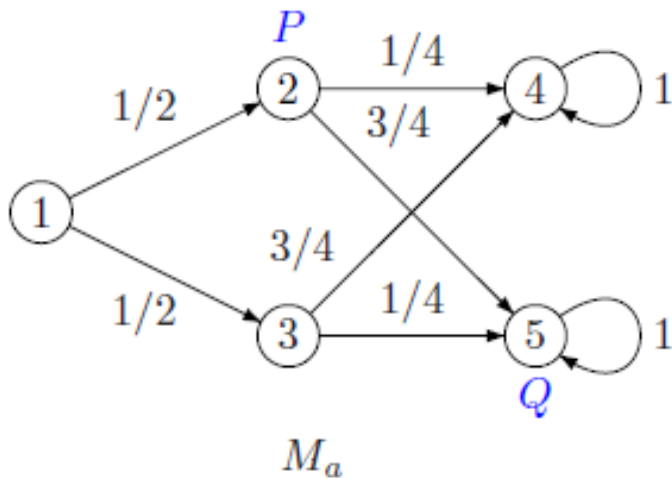
Uncomparable logics:

Path based logics

vs

Distribution based logics:

Some PCTL formula cannot be expressed by distribution based logics

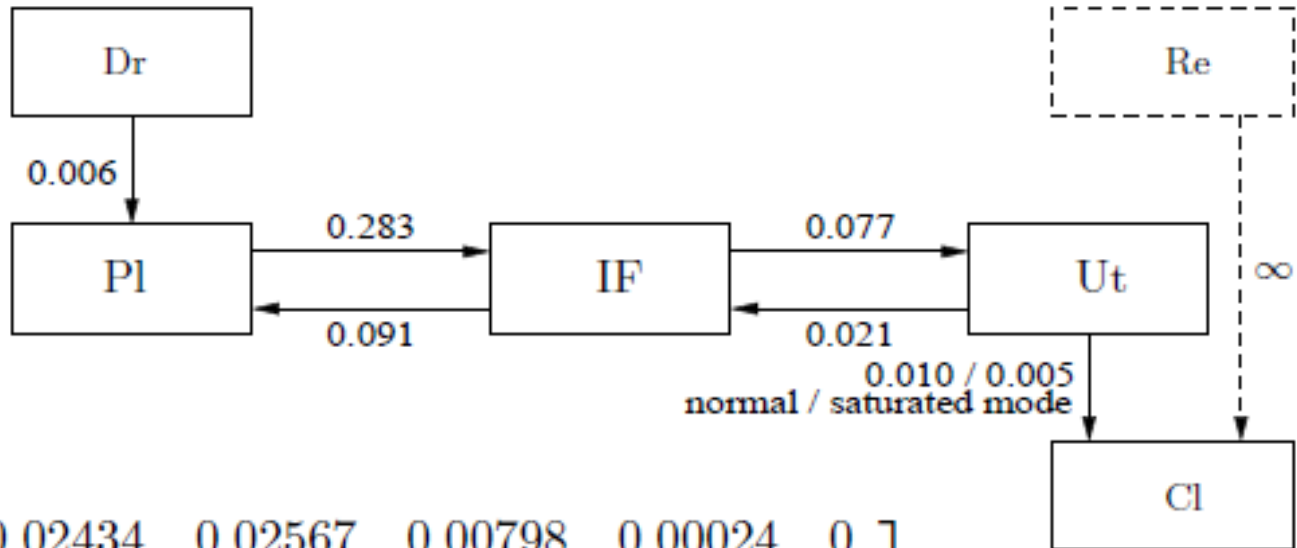


Same sequence of distribution for both chain from distribution $X[1]=1$.
But can be distinguished by formula of PCTL: $\text{Prob}(\text{Next } P \text{ Until } Q) > 1/9$.

Biochemical Context:

P(Concentration of Insulin is small after 1 hour | concentrations at t=0)

Insulin:



Body=3 parts:

$$N = \begin{bmatrix} 0.94 & 0.02434 & 0.02567 & 0.00798 & 0.00024 & 0 \\ 0.00 & 0.20724 & 0.48298 & 0.29624 & 0.01353 & 0 \\ 0.00 & 0.15531 & 0.42549 & 0.39520 & 0.02400 & 0 \\ 0.00 & 0.02598 & 0.10778 & 0.77854 & 0.08770 & 0 \\ 0.00 & 0.00000 & 0.00000 & 0.00000 & 1.00000 & 0 \\ 0.00 & 0.00000 & 0.00000 & 0.00000 & 1.00000 & 0 \end{bmatrix}$$

Distrib.
Based
logic

Model Checking of Stochastic Systems

Results on PCTL(*):

PCTL decidable in polynomial time for Markov Chains (even for MDPs)
[Hansson and Jonsson 94 + Bianco and de Alfaro 95]

PCTL^{*} decidable in exponential time for MC (doubly exp time for MDPs)

- ⇒ 1) up to 10^{10} states (e.g. [PRISM])
- ⇒ 2) not for distribution based logics

Results on distribution based logics:

[Ouaknine-Worrel'14]:

«Eventually $X[i] \geq p$ » is decidable for Markov Chains with 6 states.

(comes from decidability of **positivity** of the skolem problem).

In case all eigen values of M are distinct, **decidable for 10 states**.

«Eventually always $X[i] \geq p$ » is decidable for Markov Chains with 6 states

(comes from decidability of **ultimate positivity** of the skolem problem).

In case all eigen values of M are distinct,

decidable for all Markov Chains.

Decidability for 16 states would entail major breakthrough about diophantine approximation of transcendental numbers

General Case: as hard as Skolem problem (open for 40 years).

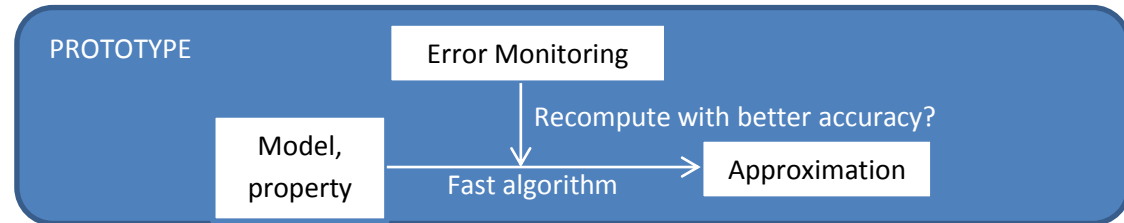
Model Checking for Stochastic Systems based on approximate algorithms

Model Checking de systèmes stochastiques

Approximate the values.

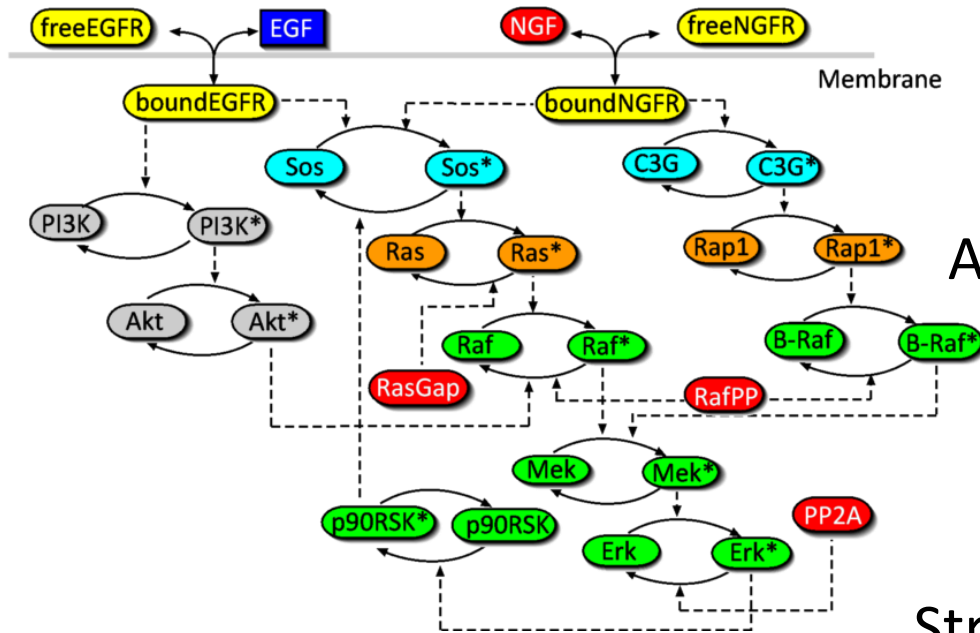
Instead of e.g. Probability = 0.3, we answer e.g. Proba in [0.2,0.4].

If question was: is probability < 0.5, then sufficient.



Model Checking de systèmes stochastiques

Computational System Biology (biopathways)



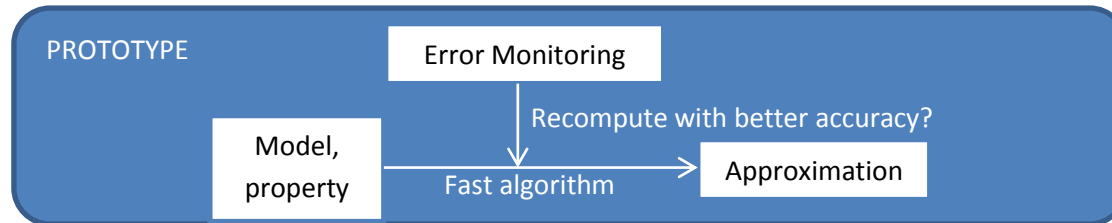
Applications to:
Apoptosis in Hela cells
(large)

Stress response in yeast
(choices)

General Idea

Approximate the values.

Instead of e.g. Probability = 0.3, we answer e.g. Proba in [0.2,0.4].
If question was: is probability < 0.5, then sufficient.



Multiple frameworks:

- **Bounded** Model Checking of big Dynamic Bayesian Networks
- Model Checking of Markov Chains vs distribution based logics
- Model Checking of MDP vs distributions ? [Chada et al.'11]

Concluding Remarks

Conclusion

Approximation => pragmatic exact model checking for stochastic models

- **large DBN** models (biological pathways with 10^{20} states).

[Palaniappan, Akshay, Liu, G., Thiagarajan TCBB 2012]

- Model Checking of distribution based prop for **MC** (Skolem problem).

- Even **MDPs**.

Know Limits: cannot prove value 1/ probability 1 (but other techniques can)

[Chatterjee et al.]

Different from PCTL^{*} model checking but can reuse some techniques.

Lots of Mathematical results but:

Still a lot to do. Not many people looking at the problem from formal methods community. Mostly statistical methods, similar but not equivalent to ours.