

Modeling and Verification of Probabilistic Systems

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<http://moves.rwth-aachen.de/teaching/ws-1819/movep18/>

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Overview

- 1 Strong Bisimulation
- 2 Probabilistic Bisimulation
 - Quotient Markov Chain
 - Examples
- 3 Logical Preservation
 - The Logics PCTL, PCTL* and PCTL⁻
 - Preservation Theorem
- 4 Lumpability
- 5 Summary

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Labeled transition system

Transition system

A *(labeled) transition system* TS is a structure $(S, Act, \longrightarrow, I_0, AP, L)$ where

- ▶ S is a (possibly infinitely countable) set of states.
- ▶ Act is a (possibly infinitely countable) set of **actions**.
- ▶ $\longrightarrow \subseteq S \times Act \times S$ is a transition relation.
- ▶ $I_0 \subseteq S$ the set of initial states.
- ▶ AP is a set of atomic propositions.
- ▶ $L : S \rightarrow 2^{AP}$ is the labeling function.

Notation

We write $s \xrightarrow{\alpha} s'$ instead of $(s, \alpha, s') \in \longrightarrow$.

Strong bisimulation

Strong bisimulation relation

[Milner, 1980 & Park, 1981]

Let $TS = (S, Act, \longrightarrow, I_0, AP, L)$ be a transition system and $R \subseteq S \times S$. Then R is a *strong bisimulation* on TS whenever for all $(s, t) \in R$:

1. $L(s) = L(t)$

 $\{a, b\}$

○

 s $\{a, b\}$

○

 t $\in R$

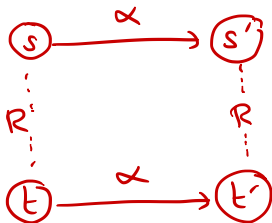
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2. if $s \xrightarrow{\alpha} s'$ then there exists $t' \in S$ such that $t \xrightarrow{\alpha} t'$ and $(s', t') \in R$



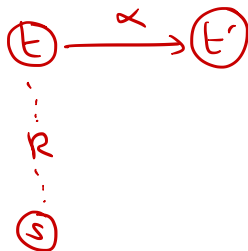
Strong bisimulation

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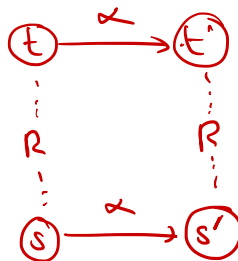
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Strong bisimilarity

Let $TS = (S, Act, \longrightarrow, I_0, AP, L)$ be a transition system and $s, t \in S$.

Strong bisimulation

Strong bisimulation relation

[Milner, 1980 & Park, 1981]

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Strong bisimilarity

Let $TS = (S, Act, \longrightarrow, I_0, AP, L)$ be a transition system and $s, t \in S$. Then: s is **strongly bisimilar** to t , notation $s \sim t$ if there **exists** a strong bisimulation R such that $(s, t) \in R$.

alternatively $\sim = \bigcup_R \{ R \text{ is a strong bisimulation?} \}$

Strong bisimulation

\sim is an equivalence, and is also a strong bism.

Strong bisimulation relation

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Remarks

Not every bisimulation relation is transitive.

Strong bisimulation

Strong bisimulation relation

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Remarks

Not every bisimulation relation is transitive. But: \sim is an equivalence.

Strong bisimulation

Pictorial representation

$$s \xrightarrow{\alpha} s'$$

 R

can be completed to

 t

$$s \xrightarrow{\alpha} s'$$

 R
 R

$$t \xrightarrow{\alpha} t'$$

and
 s
 R

$$t \xrightarrow{\alpha} t'$$

can be completed to

$$s \xrightarrow{\alpha} s'$$

 R
 R

$$t \xrightarrow{\alpha} t'$$

Strongly bisimilar transition systems

Bisimilar transition systems

Let TS_1 , TS_2 be transition systems over the same set of atomic propositions with initial states $l_{0,1}$ and $l_{0,2}$, respectively.

Consider the transition system $TS = TS_1 \uplus TS_2$ that results from the **disjoint union** of TS_1 and TS_2 .

Then: TS_1 and TS_2 are called **strongly bisimilar** if there exists a strong bisimulation R on $S_1 \uplus S_2$ such that:

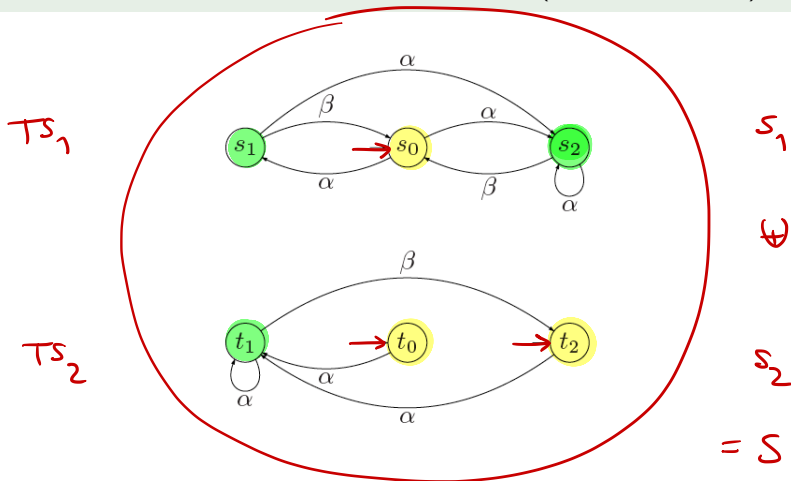
1. $\forall s \in l_{0,1}. \exists t \in l_{0,2}. (s, t) \in R$, and
2. $\forall t \in l_{0,2}. \exists s \in l_{0,1}. (s, t) \in R$.

Example (1)

$$\mathcal{R} \subseteq S \times S$$

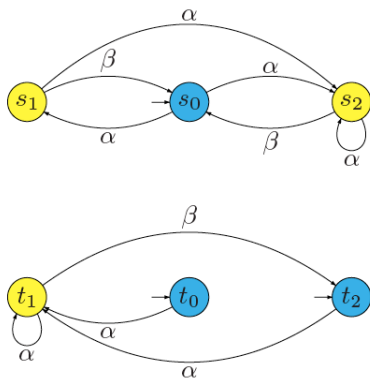
$$\begin{array}{ccc} t_0 & \xrightarrow{\alpha} & t_1 \\ \vdots & & \vdots \\ s_0 & \xrightarrow{\alpha} & s_1 \end{array}$$

Are these transition systems strongly bisimilar? (No propositions.)

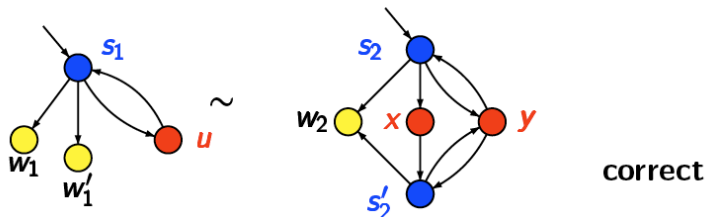
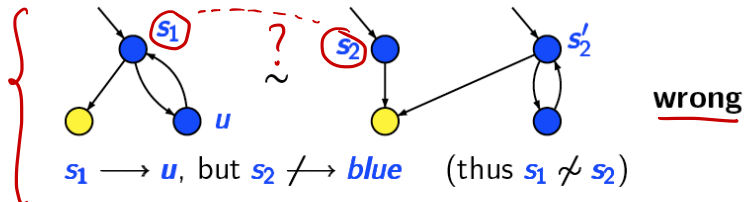


Example (2)

Yes, they are!



Correct or wrong?



bisimulation:

$$\{(w_1, w_2), (w'_1, w_2), (s_1, s_2), (s_1, s'_2), (u, x), (u, y)\}$$

Quotient LTS under \sim

Quotient transition system

For $TS = (S, \text{Act}, \longrightarrow, l_0, AP, L)$ and strong bisimilarity $\sim \subseteq S \times S$ let

$$TS/\sim = (S', \text{Act}, \longrightarrow', l'_0, AP, L'), \quad \text{the } \textit{quotient} \text{ of } TS \text{ under } \sim$$

where

represent every equivalence
class under \sim
by a single state

is an equivalence

Quotient LTS under \sim

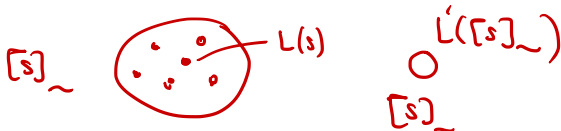
Quotient transition system

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where

- ▶ $S' = S/\sim = \{ [s]_\sim \mid s \in S \}$ with $[s]_\sim = \{ s' \in S \mid s \sim s' \}$
- ▶ \longrightarrow' is defined by:
$$\frac{s \xrightarrow{\alpha} s'}{[s]_\sim \xrightarrow{\alpha'} [s']_\sim}$$
- ▶ $l'_0 = \{ [s_0]_\sim \mid s_0 \in l_0 \}$, the equivalence class of the initial states in TS
- ▶ $L'([s]_\sim) = L(s)$.



Quotient LTS under \sim

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- ▶ $L'([s]_\sim) = L(s)$.

Remarks

L' is well-defined as all states in $[s]_\sim$ are equally labeled. Note that if $s \xrightarrow{\alpha} s'$, then for all $t \sim s$ we have $t \xrightarrow{\alpha} t'$ with $s' \sim t'$.

Quotient transition system

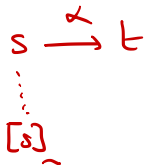
For any transition system TS it holds: $TS \sim TS/\sim$.

Proof:

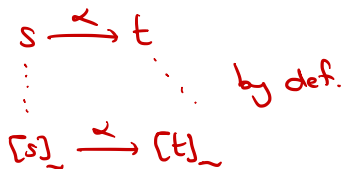
The binary relation:

$$R = \{(s, [s]_{\sim}) \mid s \in S\}$$

is a strong bisimulation on the disjoint union $TS \uplus TS/\sim$.



then



Strong bisimulation revisited

Auxiliary predicate

Let $P : \underline{S} \times \underline{Act} \times \underline{2^S} \rightarrow \{0, 1\}$ be a predicate such that for $S' \subseteq S$:

$$\underbrace{P(s, \alpha, S')} = \begin{cases} 1 & \text{if } \exists s' \in S'. s \xrightarrow{\alpha} s' \\ 0 & \text{otherwise.} \end{cases}$$

true if



$$P(s, \alpha, S') = 1$$

Strong bisimulation revisited

Auxiliary predicate

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Alternative definition of strong bisimulation

Let $TS = (S, Act, \longrightarrow, l_0, AP, L)$ and R an *equivalence relation* on S .

Then: R is a *strong bisimulation* on S if for $(s, t) \in R$:

1. $L(s) = L(t)$, and
2. $P(s, \alpha, C) = P(t, \alpha, C)$ for all C in S/R and $\alpha \in Act$.

$s \sim' t$, if there *exists* a strong bisimulation R such that $(s, t) \in R$.

It can be easily proven that \sim coincides with \sim' . Proof is omitted.

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Probabilistic bisimulation: intuition

Intuition

- ▶ Strong bisimulation is used to **compare** labeled transition systems.
- ▶ Strongly bisimilar states exhibit the same step-wise behaviour.
- ▶ Our aim: adapt bisimulation to discrete-time Markov chains.
- ▶ This yields a probabilistic variant of strong bisimulation.

- ▶ When do two DTMC states exhibit the same step-wise behaviour?
- ▶ **Key: if their transition probability for each equivalence class coincides.**

1989: Kim G. Larsen and Arne Skou



Kim G. Larsen



Arne Skou

Probabilistic bisimulation

$$P(s, \alpha, C) = P(t, \alpha, C)$$

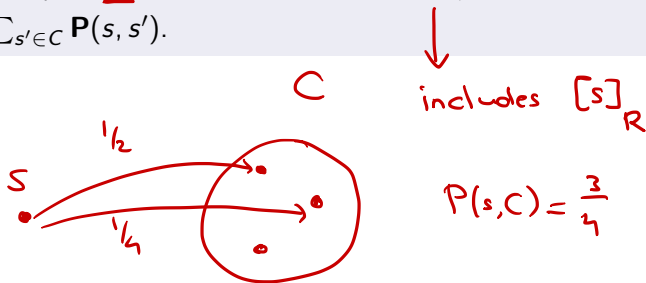
Probabilistic bisimulation

[Larsen & Skou, 1989]

Let $\mathcal{D} = (S, \mathbf{P}, \ell_{\text{init}}, AP, L)$ be a DTMC and $R \subseteq S \times S$ an **equivalence**.
Then: R is a **probabilistic bisimulation** on S if for any $(s, t) \in R$:

1. $L(s) = L(t)$, and
2. $\mathbf{P}(s, C) = \mathbf{P}(t, C)$ for all equivalence classes $C \in S/R$

where $\mathbf{P}(s, C) = \sum_{s' \in C} \mathbf{P}(s, s')$.



Probabilistic bisimulation

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For states in R , the probability of moving to some equivalence class is equal.

Probabilistic bisimilarity

Let \mathcal{D} be a DTMC and s, t states in \mathcal{D} .

Probabilistic bisimulation

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For states in R , the probability of moving to some equivalence class is equal.

Probabilistic bisimilarity

Let \mathcal{D} be a DTMC and s, t states in \mathcal{D} . Then: s is **probabilistic bisimilar** to t , denoted $s \sim_p t$, if there **exists** a probabilistic bisimulation R with $(s, t) \in R$.

Probabilistic bisimulation

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 $\{a_1, \dots, a_{10}\}$

○
s

 $\{a_1, \dots, a_{10}\}$

○
t

Probabilistic bisimulation

Probabilistic bisimulation

Let $\mathcal{D} = (S, \mathbf{P}, \iota_{\text{init}}, AP, L)$ be a DTMC and $R \subseteq S \times S$ an equivalence.
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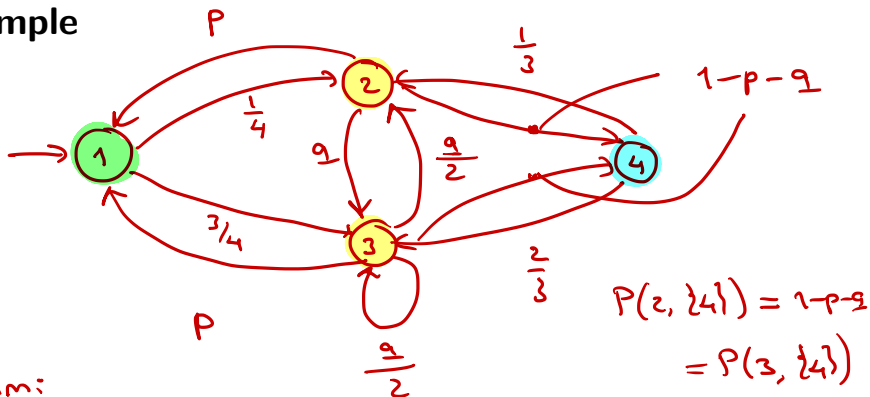
1. $L(s) = L(t)$, and
2. $\mathbf{P}(s, C) = \mathbf{P}(t, C)$ for all equivalence classes $C \in S/R$.

Remarks

As opposed to bisimulation on states in transition systems, any probabilistic bisimulation is an equivalence.

But: not every strong bisimulation is an equivalence.

Example



Claim:

$R = \{ (1,1), \dots, (4,4), (2,3), (3,2) \}$ is a prob. bisim.

$$P(2, \{1\}) = p = P(3, \{1\})$$

$$P(2, \{2,3\}) = q = \frac{q}{2} + \frac{q}{2} = P(3, \{2,3\})$$

Bisimilar DTMCs

Bisimilar DTMCs

Let $\mathcal{D}_1, \mathcal{D}_2$ be DTMCs over the same set of atomic propositions with initial distributions ι_{init}^1 and ι_{init}^2 , respectively.

Consider the DTMC $\mathcal{D} = \mathcal{D}_1 \uplus \mathcal{D}_2$ that results from the disjoint union of \mathcal{D}_1 and \mathcal{D}_2 . Consider \sim_p on $\mathcal{D} = \mathcal{D}_1 \uplus \mathcal{D}_2$.

Then \mathcal{D}_1 and \mathcal{D}_2 are bisimilar, denoted $\mathcal{D}_1 \sim_p \mathcal{D}_2$ whenever

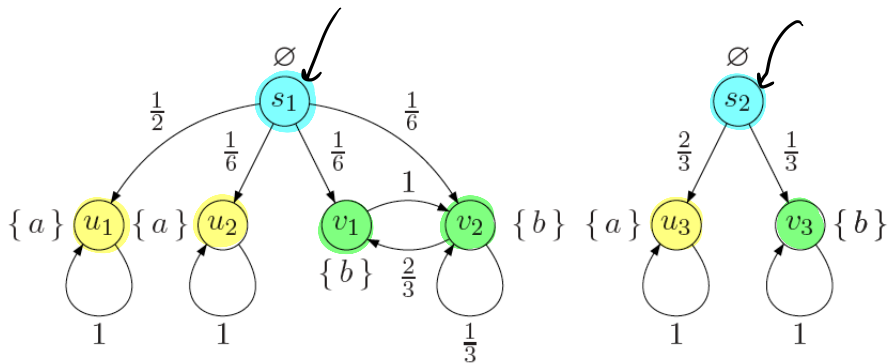
$$\iota_{\text{init}}^1(C) = \iota_{\text{init}}^2(C)$$

for each bisimulation equivalence class C of $\mathcal{D} = \mathcal{D}_1 \uplus \mathcal{D}_2$ under \sim_p .

Here, $\iota_{\text{init}}(C)$ denotes $\sum_{s \in C} \iota_{\text{init}}(s)$.

Example

$$P(s_1, \text{yellow}) = \frac{1}{2} + \frac{1}{6} = \frac{2}{3} = P(s_2, \text{yellow})$$



Quotient under \sim_p

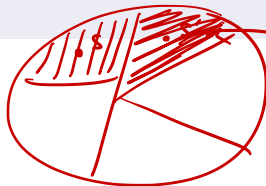
Quotient DTMC under \sim_p

For $\mathcal{D} = (S, \mathbf{P}, \ell_{\text{init}}, AP, L)$ and probabilistic bisimilarity $\sim_p \subseteq S \times S$ let

$$\mathcal{D}/\sim_p = (S', \mathbf{P}', \ell'_{\text{init}}, AP, L'), \quad \text{the } \textit{quotient} \text{ of } \mathcal{D} \text{ under } \sim_p$$

where

- ▶ $S' = S/\sim_p = \{[s]_{\sim_p} \mid s \in S\}$ with $[s]_{\sim_p} = \{s' \in S \mid s \sim_p s'\}$
- ▶ $\mathbf{P}'([s]_{\sim_p}, [s']_{\sim_p}) = \mathbf{P}(s, [s']_{\sim_p})$



total prob. mass of
going from s to
 $[s']_{\sim_p}$

Quotient under \sim_p

Quotient DTMC under \sim_p

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where

- ▶ $S' = S/\sim_p = \{ [s]_{\sim_p} \mid s \in S \}$ with $[s]_{\sim_p} = \{ s' \in S \mid s \sim_p s' \}$
- ▶ $\mathbf{P}'([s]_{\sim_p}, [s']_{\sim_p}) = \mathbf{P}(s, [s']_{\sim_p})$
- ▶ $\iota'_{\text{init}}([s]_{\sim_p}) = \sum_{s' \in [s]_{\sim_p}} \iota_{\text{init}}(s')$
- ▶ $L'([s]_{\sim_p}) = L(s)$.

Remarks

The transition probability from $[s]_{\sim_p}$ to $[t]_{\sim_p}$ is $\mathbf{P}(s, [t]_{\sim_p})$.

Quotient under \sim_p

Quotient DTMC under \sim_p

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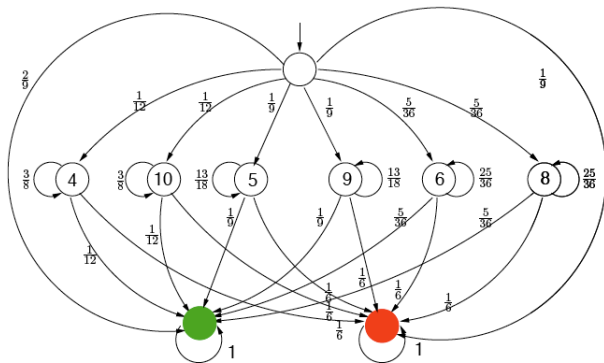
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- ▶ $\mathbf{P}'([s]_{\sim_p}, [s']_{\sim_p}) = \mathbf{P}(s, [s']_{\sim_p})$
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Remarks

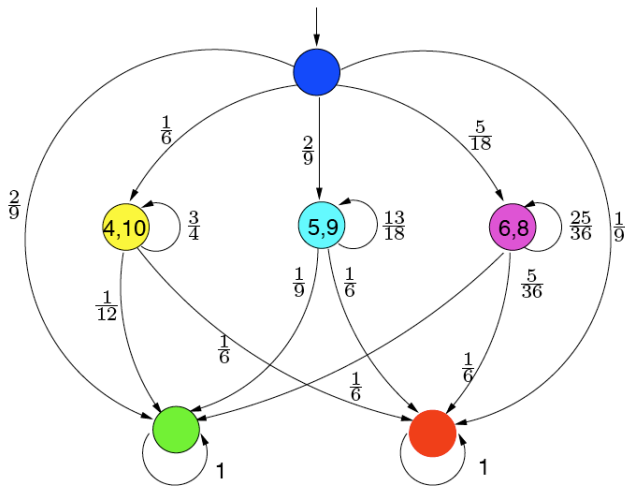
The transition probability from $[s]_{\sim_p}$ to $[t]_{\sim_p}$ is $\mathbf{P}(s, [t]_{\sim_p})$. This is well-defined as $\mathbf{P}(s, C) = \mathbf{P}(s', C)$ for all $s \sim_p s'$ and all bisimulation equivalence classes C .

A DTMC model of Craps

- ▶ Come-out roll:
 - ▶ 7 or 11: win
 - ▶ 2, 3, or 12: lose
 - ▶ else: roll again
- ▶ Next roll(s):
 - ▶ 7: lose
 - ▶ point: win
 - ▶ else: roll again



Quotient DTMC of Craps under \sim_p

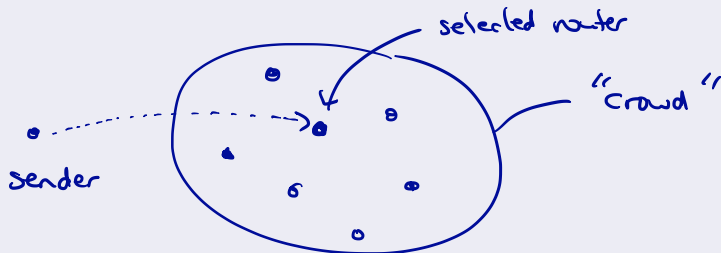


Example: Crowds protocol

Security: Crowds protocol

[Reiter & Rubin, 1998]

- ▶ A protocol for **anonymous web browsing** (variants: mCrowds, BT-Crowds)
- ▶ Hide user's communication by **random routing** within a crowd
 - ▶ sender selects a crowd member randomly using a uniform distribution



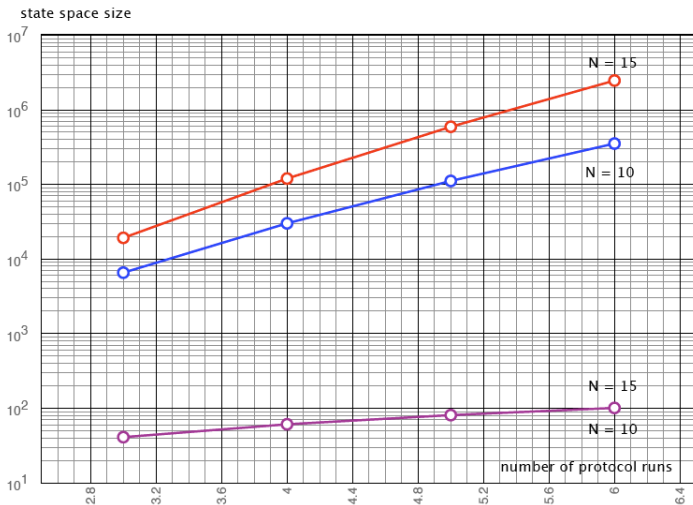
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[Reiter & Rubin, 1998]

- ▶ A protocol for **anonymous web browsing** (variants: mCrowds, BT-Crowds)
- ▶ Hide user's communication by **random routing** within a crowd
 - ▶ sender selects a crowd member randomly using a uniform distribution
 - ▶ selected router flips a biased coin:
 - ▶ with probability $1 - p$: direct delivery to final destination
 - ▶ otherwise: select a next router randomly (uniformly)
 - ▶ once a routing path has been established, use it until crowd changes
- ▶ Rebuild routing paths on crowd changes
- ▶ Property: Crowds protocol ensures “probable innocence”:
 - ▶ probability real sender is discovered $< \frac{1}{2}$ if $N \geq \frac{p}{p-\frac{1}{2}} \cdot (c+1)$
 - ▶ where N is crowd's size and c is number of corrupt crowd members

State space reduction under \sim_p



IEEE 802.11 group communication protocol

	original DTMC			quotient DTMC		red. factor	
<i>OD</i>	states	transitions	ver. time	blocks	total time	states	time
4	1125	5369	122	71	13	15.9	9.00
12	37349	236313	7180	1821	642	20.5	11.2
20	231525	1590329	50133	10627	5431	21.8	9.2
28	804837	5750873	195086	35961	24716	22.4	7.9
36	<u>2076773</u>	15187833	5103900	91391	77694	22.7	6.6
40	<u>3101445</u>	<u>22871849</u>	<u>7725041</u>	135752	127489	22.9	6.1

all times in milliseconds

$\Pr(\Diamond G)$

$22.9 \approx$

$$\frac{3101445}{135752}$$

Overview

- 1 Strong Bisimulation
- 2 Probabilistic Bisimulation
 - Quotient Markov Chain
 - Examples
- 3 Logical Preservation
 - The Logics PCTL, PCTL^{*} and PCTL⁻
 - Preservation Theorem
- 4 Lumpability
- 5 Summary

PCTL syntax

Probabilistic Computation Tree Logic: Syntax

PCTL consists of state- and path-formulas.

- ▶ PCTL *state formulas* over the set AP obey the grammar:

$$\Phi ::= \text{true} \mid a \mid \Phi_1 \wedge \Phi_2 \mid \neg \Phi \mid \mathbb{P}_J(\varphi)$$

where $a \in AP$, φ is a path formula and interval $J \subseteq [0, 1]$.

- ▶ PCTL *path formulae* are formed according to the following grammar:

$$\varphi ::= \bigcirc \Phi \mid \Phi_1 \mathsf{U} \Phi_2 \mid \Phi_1 \mathsf{U}^{\leq n} \Phi_2$$

where Φ , Φ_1 , and Φ_2 are state formulae and $n \in \mathbb{N}$.

Preservation of PCTL-formulas

Preservation of PCTL-formulas

Bisimulation preserves PCTL

Let \mathcal{D} be a DTMC and s, t states in \mathcal{D} . Then:

$s \sim_p t$ if and only if s and t are PCTL-equivalent.

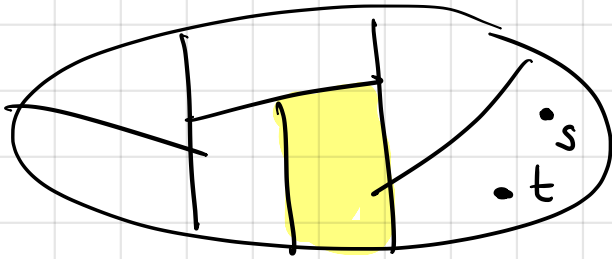
$$s \sim_p t \quad \Rightarrow \quad \left(\forall \Phi \in \text{PCTL}. \quad s \models \Phi \text{ iff } t \models \Phi \right)$$

$$s \not\sim_p t \quad \Leftarrow \quad \left(\exists \Phi \in \text{PCTL}. \quad s \not\models \Phi \text{ and } t \models \Phi \right)$$

lemma DTM: \mathcal{D} , $s, t \in \mathcal{D}$, $G \in S / \sim_P$

Then:

$$s \sim_P t \Rightarrow \Pr(s \models \Diamond G) = \Pr(t \models \Diamond G)$$



Proof (sketch). If $[s]_{\sim_P} = G = [t]_{\sim_P}$ easy,
 $\Pr(s \models \Diamond G) = 1 = \Pr(t \models \Diamond G)$.

Assume $[s]_{\sim_P} \cap G = \emptyset$

let $S' = \{s \in S \mid \Pr(s \models \Diamond G) > 0\} \setminus G$

Then S' is a disjoint union of eq. classes under \sim_P . For $s \in S'$, the vector

$\left(\Pr(s \models \Diamond G) \right)_{s \in S'}$ is the unique solution of the lin. equation system

$$x_s = P(s, G) + \sum_{s' \in S'} P(s, s') \cdot x_{s'} \quad (*)$$

Now consider the unique solution

$$(x_B)_{B \in S/\sim_p, B \subseteq S'} \quad \text{of} \quad (**)$$

$$x_B = \underbrace{P(s_B, G)}_{\substack{\text{1-step prob.} \\ \text{to go to } G}} + \sum_{\substack{C \in S/\sim_p \\ C \subseteq S'}} \underbrace{P(s_B, C)}_{\substack{\downarrow \\ \sum_{t \in C} P(s_B, t)}} \cdot x_C \quad \text{for } s_B \in B$$

Claim $x_s = x_B$ for all states $s \in B$.

Proof: prove that $(y_s)_{s \in S'}$ is a solution of (*) where $y_s = x_B$ if $s \in B$
 $B \in S'/\sim_p$

Derive:
$$y_s = P(s, G) + \sum_{s' \in S'} P(s, s') \cdot y_{s'}$$

= (* partition S' into eq. classes *)

$$P(s, G) + \sum_{\substack{s' \in C \\ C \in S'/\sim_p}} P(s, s') \cdot y_{s'}$$

$$P(s, G) + \sum_{\substack{s' \in C \\ C \in S'/\sim_P}} P(s, s') \cdot y_{s'}$$

$$= (\text{if } y_{s'} = x_B \text{ if } s' \in B \text{ and } B \in S'/\sim_P \text{ if})$$

$$P(s, G) + \sum_{\substack{s' \in C \\ C \in S'/\sim_P}} P(s, s') \cdot x_C$$

$$= P(s, G) + \sum_{C \in S'/\sim_P} \underbrace{\sum_{s' \in C} P(s, s')}_{P(s, C)} \cdot x_C$$

$$= (\text{if } s \sim_P t, \text{ so } P(s, G) = P(t, G) \text{ and } P(s, C) = P(t, C))$$

$$P(t, G) + \sum_{C \in S'/\sim_P} P(t, C) \cdot x_C$$

$$= x_B$$

Preservation of PCTL-formulas

Bisimulation preserves PCTL

Let \mathcal{D} be a DTMC and s, t states in \mathcal{D} . Then:

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Remarks

$s \sim_p t$ implies that

1. transient probabilities, reachability probabilities,

$$\Diamond = \text{reachability}$$

Preservation of PCTL-formulas

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Remarks

$s \sim_p t$ implies that

1. transient probabilities, reachability probabilities,
2. repeated reachability, persistence probabilities

$$\Pr(s \models \Box \Diamond G) = \Pr(t \models \Box \Diamond G)$$

$\Diamond \Box$ $\Diamond \Box$

Preservation of PCTL-formulas

Bisimulation preserves PCTL

Let \mathcal{D} be a DTMC and s, t states in \mathcal{D} . Then:

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$s \sim_p t$ implies that

1. transient probabilities, reachability probabilities,
2. repeated reachability, persistence probabilities
3. all qualitative PCTL formulas

for s and t are equal.

If for PCTL-formula Φ we have $s \models \Phi$ but $t \not\models \Phi$, then it follows $s \not\sim_p t$.

$$s \models \mathbb{P}_{>\frac{1}{2}}(0 \text{ red})$$



$$t \not\models \mathbb{P}_{>\frac{1}{2}}(0 \text{ red})$$

Preservation of PCTL-formulas

Bisimulation preserves PCTL

Let \mathcal{D} be a DTMC and s, t states in \mathcal{D} . Then:

$s \sim_p t$ if and only if s and t are PCTL-equivalent.

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$s \sim_p t$ implies that

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2. repeated reachability, persistence probabilities
3. all qualitative PCTL formulas

for s and t are equal.

If for PCTL-formula Φ we have $s \models \Phi$ but $t \not\models \Phi$, then it follows $s \not\sim_p t$.

A **single** PCTL-formula suffices!

PCTL* syntax

$$\text{PCTL: } \bigcirc \Phi \mid \Phi \cup \Phi \mid \Phi \cup^{\leq r} \Phi$$

Probabilistic Computation Tree Logic: Syntax

PCTL* consists of state- and path-formulas.

- ▶ PCTL* *state formulas* over the set AP obey the grammar:

$$\Phi ::= \text{true} \mid a \mid \Phi_1 \wedge \Phi_2 \mid \neg \Phi \mid \mathbb{P}_J(\varphi)$$

where $a \in AP$, φ is a path formula and $J \subseteq [0, 1]$, $J \neq \emptyset$ is a non-empty interval.

$$[0, 1]$$

- ▶ PCTL* *path formulae* are formed according to the following grammar:

$$\text{LTL} \quad \left\{ \begin{array}{l} \varphi ::= \Phi \mid \neg \varphi \mid \varphi_1 \wedge \varphi_2 \mid \bigcirc \varphi \mid \varphi_1 \cup \varphi_2 \end{array} \right.$$

where Φ is a state formula and φ , φ_1 , and φ_2 are path formulae.

$$(a \cup b) \cup c$$

PCTL* semantics (1)

Notation

$\mathcal{D}, s \models \Phi$ if and only if state-formula Φ holds in state s of (possibly infinite) DTMC \mathcal{D} . As \mathcal{D} is known from the context we simply write $s \models \Phi$.

Satisfaction relation for state formulas

The satisfaction relation \models is defined for PCTL* state formulas by:

$$\begin{aligned}
 s \models a & \quad \text{iff } a \in L(s) \\
 s \models \neg \Phi & \quad \text{iff not } (s \models \Phi) \\
 s \models \Phi \wedge \Psi & \quad \text{iff } (s \models \Phi) \text{ and } (s \models \Psi) \\
 s \models \mathbb{P}_J(\varphi) & \quad \text{iff } Pr(s \models \varphi) \in J
 \end{aligned}$$

where $Pr(s \models \varphi) = Pr_s\{\pi \in Paths(s) \mid \pi \models \varphi\}$

PCTL* semantics (2)

Satisfaction relation for path formulas

Let $\pi = s_0 s_1 s_2 \dots$ be an infinite path in (possibly infinite) DTMC \mathcal{D} . Let $\pi^i = s_i s_{i+1} s_{i+2} \dots$ denotes the i -th suffix of π .

The satisfaction relation \models is defined for state formulas by:

$$\pi \models \Phi \quad \text{iff} \quad \pi[0] \models \Phi$$

$$\pi \models \neg\varphi \quad \text{iff} \quad \text{not } \pi \models \varphi$$

$$\pi \models \varphi_1 \wedge \varphi_2 \quad \text{iff} \quad \pi \models \varphi_1 \text{ and } \pi \models \varphi_2$$

$$\pi \models \bigcirc\varphi \quad \text{iff} \quad \pi^1 \models \varphi$$

$$\pi \models \varphi_1 \mathsf{U} \varphi_2 \quad \text{iff} \quad \exists k \geq 0. (\pi^k \models \varphi_2 \wedge \forall 0 \leq i < k. \pi^i \models \varphi_1)$$

Measurability

PCTL* measurability

For any PCTL* path formula φ and state s of DTMC \mathcal{D} , the set $\{\pi \in \text{Paths}(s) \mid \pi \models \varphi\}$ is measurable.

Proof:

Left as an exercise, using the result for PCTL measurability and the measurability of ω -regular properties.

Bounded until in PCTL*

Bounded until

Bounded until can be defined using the other operators:

$$\varphi_1 U^{\leq n} \varphi_2 = \bigvee_{0 \leq i \leq n} \psi_i \quad \text{where } \psi_0 = \varphi_2 \text{ and } \psi_{i+1} = \varphi_1 \wedge \bigcirc \psi_i \text{ for } i \geq 0.$$



in PCTL

$$\Phi_1 U^{\leq n} \Phi_2$$

state formulas

$k=3$

$$\psi_3 = \varphi_1 \wedge \bigcirc \psi_2$$

$$\psi_2 = \varphi_1 \wedge \bigcirc \psi_1$$

$$\psi_1 = \varphi_1 \wedge \bigcirc \psi_0$$

$$\psi_0 = \varphi_2$$

Bounded until in PCTL*

Bounded until

Bounded until can be defined using the other operators:

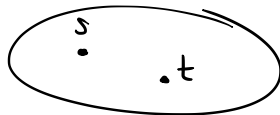
$$\varphi_1 U^{\leq n} \varphi_2 = \bigvee_{0 \leq i \leq n} \psi_i \quad \text{where } \psi_0 = \varphi_2 \text{ and } \psi_{i+1} = \varphi_1 \wedge \bigcirc \psi_i \text{ for } i \geq 0.$$

Examples in PCTL* but not in PCTL

$$\mathbb{P}_{>\frac{1}{4}}(\bigcirc a U \bigcirc b) \text{ and } \mathbb{P}_{=1}(\mathbb{P}_{>\frac{1}{2}}(\Box \Diamond a \vee \Diamond \Box b)).$$

$$\mathbb{P}_{>\frac{1}{2}}(\Box \Box a) \vee \mathbb{P}_{>\frac{1}{2}}(\Diamond \Box b) \leftarrow \text{PCTL}$$

Preservation of PCTL*-formulas



Bisimulation preserves PCTL*

Let \mathcal{D} be a DTMC and s, t states in \mathcal{D} . Then:

$s \sim_p t$ if and only if s and t are PCTL*-equivalent.

if and only if s and t are PCTL-equivalent

Remarks

1. Bisimulation thus preserves not only all PCTL but also all PCTL* formulas.
2. By the last two results it follows that PCTL- and PCTL*-equivalence coincide.



Preservation of PCTL*-formulas

Bisimulation preserves PCTL*

Let \mathcal{D} be a DTMC and s, t states in \mathcal{D} . Then:

$s \sim_p t$ if and only if s and t are PCTL*-equivalent.

Remarks

1. Bisimulation thus preserves not only all PCTL but also all PCTL* formulas.
2. By the last two results it follows that PCTL- and PCTL*-equivalence coincide. Thus any two states that satisfy the same PCTL formulas, satisfy the same PCTL* formulas.

Bisimilar paths

$$\begin{aligned}\pi_1 &= s_{0,1} s_{1,1} s_{2,1} s_{3,1} \dots \\ \pi_2 &= s_{0,2} s_{1,2} s_{2,2} s_{3,2} \dots\end{aligned}$$

$$\pi_1 \sim_P \pi_2 \quad \text{iff} \quad \forall i \geq 0. \quad s_{i,1} \sim_P s_{i,2}$$

Bisimulation-closed σ -algebra

let $C_0, \dots, C_n \in \mathcal{S}/\sim_P$. let \mathcal{C}_{\sim_P} be the σ -algebra generated by

$$\text{Cyl}(C_0, \dots, C_n) = \left\{ \sigma \in \text{Paths}^D \mid \sigma = t_0 \dots t_n t_{n+1} t_{n+2} \dots \right. \\ \left. \text{with } \forall 0 \leq i \leq n. t_i \in C_i \right\}$$

let $\Pi \in \mathcal{C}_{\sim_P}$ be a measurable set of paths (in D)

Π is bisimulation-closed if

$$\forall \pi_1 \in \Pi. \quad \pi_1 \sim_P \pi_2 \Rightarrow \pi_2 \in \Pi.$$

lemma:

$$s_1 \sim_P s_2 \Rightarrow \forall \text{ bisimulation-closed } \Pi: \\ P_{s_1}(\Pi) = P_{s_2}(\Pi).$$

Why is this useful?

To show $s_1 \sim_p s_2 \Rightarrow s_1, s_2$ are
PCN^{*}-equiv.

1. $s_1 \sim_p s_2 \Rightarrow s_1 \models \underline{\Phi} \text{ iff } s_2 \models \underline{\Phi}$

2. $s_1 \sim_p s_2 \Rightarrow \Pr(s_1 \models \varphi) =$

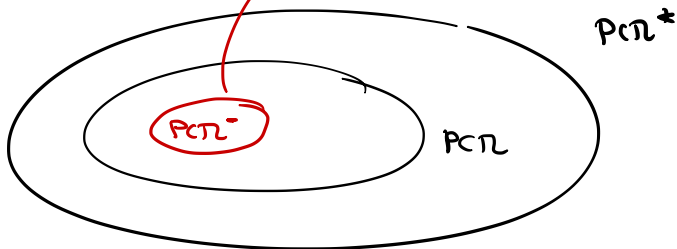
(*) $\Pr(s_2 \models \varphi)$

$\mathbb{P}_j(\varphi)$

3. $\pi_1 \sim_p \pi_2$ implies $\pi_1 \models \varphi$ iff
 $\pi_2 \models \varphi$

PCTL⁻ syntax

Desharnais & Panangaden



$$s_1 \sim_p s_2 \quad \text{iff} \quad \forall \Phi \in PCTL^-. (s_1 \models \Phi \text{ iff } s_2 \models \Phi)$$

$$\Rightarrow$$

$$s_1 \not\sim_p s_2 \quad \Leftarrow \quad \exists \Phi \in PCTL^-. (s_1 \not\models \Phi \wedge s_2 \models \Phi)$$

PCTL⁻ syntax



Simple Probabilistic Computation Tree Logic: Syntax

PCTL⁻ only consists of state-formulas. These formulas over the set AP obey the grammar:

$$\Phi ::= a \mid \Phi_1 \wedge \Phi_2 \mid \Phi_1 \vee \Phi_2 \mid \mathbb{P}_{\leq p}(\bigcirc \Phi)$$

where $a \in AP$ and p is a probability in $[0, 1]$.

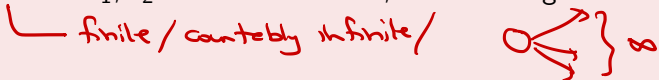
Remarks

This is a truly simple logic. It does not contain the until-operator. Negation is **not** present and cannot be expressed. Only upper bounds on probabilities.

It turns out that PCTL⁻, PCTL^{*}- and PCTL⁻-equivalence **coincide**.

Preservation of PCTL

PCTL/PCTL* and Bisimulation Equivalence

Let \mathcal{D} be a DTMC and s_1, s_2 states in \mathcal{D} . Then, the following statements are equivalent: 

- (a) $s_1 \sim_p s_2$.
- (b) s_1 and s_2 are PCTL*-equivalent, i.e., fulfill the same PCTL* formulas
- (c) s_1 and s_2 are PCTL-equivalent, i.e., fulfill the same PCTL formulas
- (d) s_1 and s_2 are PCTL⁻-equivalent, i.e., fulfill the same PCTL⁻ formulas

$$\sim_p = \equiv_{\text{PCTL}^*} = \equiv_{\text{PCTL}} = \equiv_{\text{PCTL}^-}$$

Preservation of PCTL

PCTL/PCTL* and Bisimulation Equivalence

Let \mathcal{D} be a DTMC and s_1, s_2 states in \mathcal{D} . Then, the following statements are equivalent:

- (a) $s_1 \sim_p s_2$.
- (b) s_1 and s_2 are PCTL*-equivalent, i.e., fulfill the same PCTL* formulas
- (c) s_1 and s_2 are PCTL-equivalent, i.e., fulfill the same PCTL formulas
- (d) s_1 and s_2 are PCTL⁻-equivalent, i.e., fulfill the same PCTL⁻ formulas

Proof:

1. (a) \implies (b): by structural induction on PCTL* formulas.
2. (b) \implies (c): trivial as PCTL is a sublogic of PCTL*.
3. (c) \implies (d): trivial as PCTL⁻ is a sublogic of PCTL.
4. (d) \implies (a): involved. First finite DTMCs, then for arbitrary DTMCs.

Proof

Finite case

D is finite.

$$\underbrace{s_1 \equiv_{\text{PCTL}^-} s_2}_{s_1 + s_2 \text{ are PCTL}^- \text{-equivalent}} \implies s_1 \sim_p s_2$$

$s_1 + s_2$ are PCTL⁻-equivalent

Proof

Assume $s_1 \equiv_{\text{PCTL}^-} s_2$. We show that

$$R = \{ (s_1, s_2) \mid s_1 \equiv_{\text{PCTL}^-} s_2 \}$$

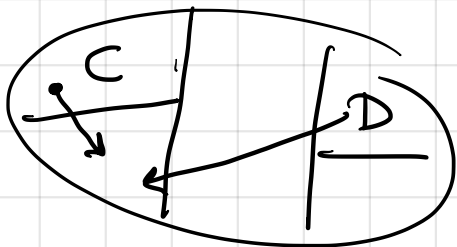
is a probabilistic bisimulation. Let $(s_1, s_2) \in R$.

(1) $L(s_1) = L(s_2)$. Easy since $s_1 \equiv_{\text{PCTL}^-} s_2$ and all atomic propositions are expressible in PCTL⁻.

(2) let $C \in S/R$. Does $P(s_1, C) = P(s_2, C)$?

let $C, D \in S/R$, and $\Phi_{C,D}$ be a PCTL⁻ state formula

s.t. $\text{Sat}(\Phi_{C,D}) \subseteq C \wedge \text{Sat}(\Phi_{C,D}) \cap D = \emptyset$



$$\text{let } \Phi_C = \bigwedge_{\substack{D \in S/R \\ D \not\subseteq C}} \Phi_{C,D}$$

Then: $\text{Sat}(\Phi_C) = C$.

w.l.o.g. assume $P(s_1, C) \leq P(s_2, C)$

finite
conjunction
since $|S/\sim_p| < \infty$

Assume $P(s_1, C) \subseteq P(s_2, C)$

let $s_1 \models P_{\leq p}(\bigcirc \Phi_c)$ where $p = P(s_1, C)$

Since $s_1 \equiv_{\text{PCTL}} s_2$ it follows

$$s_2 \models P_{\leq p}(\bigcirc \Phi_c)$$

But then $\boxed{P(s_1, C) = P(s_2, C)}$ ~~\square~~

In the infinite case, this proof principle
can be applied since

"negation" = "complementation"

"countable
conjunction" = "countable inter-
sections"



logic



measurable
spaces.



Theorem $S_1 \equiv_{\text{PCTL}} S_2 \Rightarrow S_1 \sim_P S_2$

Proof: $R = \{ (s_1, s_2) \mid s_1 \equiv_{\text{PCTL}} s_2 \}$ is
a prob. bisimulation.

(1) $L(s_1) = L(s_2)$ as before

(2) let $(s_1, s_2) \in R$. let $\text{Sat}(\Phi), \Phi \in \text{PCTL}$
be basic events on S and \mathcal{C}_S is the smallest
 σ -algebra containing the sets $\{ \text{Sat}(\Phi) \mid \Phi \in \text{PCTL} \}$

Since S_{\sim_P} is countable, every PCTL -equivalence
class $C \in S/R$ can be written as a countable
intersection of $\text{Sat}(\Phi)$ and $C \subseteq \text{Sat}(\Phi)$.

Thus: all PCTL -eq. classes belong to \mathcal{C}_S .

As PCTL permits (finitary) conjunction, the set
of all sets $\text{Sat}(\Phi)$ is closed under finite
intersections.

Prop. for every prob. measure $\mu, \mu_2 \in \mathcal{C}_S$

Proposition

for every prob. measure $\mu_1, \mu_2 \in \mathcal{C}_S$

$$\mu_1(\text{Sat}(\Phi)) = \mu_2(\text{Sat}(\Phi)) \text{ for } \forall \Phi \in \text{PCN}^+$$

implies

$$\mu_1 = \mu_2.$$

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1960: Laurie Snell and John Kemeny



Laurie Snell



John Kemeny

Lumpability

Ignore the initial distribution and state-labelling of a Markov chain.

Lumpability

[Kemeny & Snell, 1960]

Let \mathcal{D} be a (possibly countably infinite) DTMC with state space S and $\mathcal{B} = \{B_1, \dots, B_n\}$ be a partitioning of S (where B_j may be countably infinite). \mathcal{D} is **lumpable** with respect to \mathcal{B} iff for any B_i and B_j in \mathcal{B} and any $s, s' \in B_i$:

$$\sum_{u \in B_j} \mathbf{P}(s, u) = \sum_{u \in B_j} \mathbf{P}(s', u) \quad \text{that is} \quad \mathbf{P}(s, B_j) = \mathbf{P}(s', B_j).$$

If \mathcal{D} is **lumpable** with respect to \mathcal{B} , \mathcal{B} is called a **lumpable** partition

It is easy to show that S/\sim_p is a lumpable partition of the state space S .
In fact, it is the **coarsest** possible lumpable partition.

Lumping equivalence

Lumping equivalence

[Kemeny & Snell, 1960]

The DTMCs \mathcal{D} and \mathcal{D}' are **lumping equivalent** if there are lumpable partitions \mathcal{B} of \mathcal{D} and \mathcal{B}' of \mathcal{D}' such that there is an injective function $f : \mathbb{N} \rightarrow \mathbb{N}$ such that:

$$\mathbf{P}(B_i, B_j) = \mathbf{P}'(B'_{f(i)}, B'_{f(j)}).$$

Corollary

$\mathcal{D} \sim_p \mathcal{D}'$ if and only if \mathcal{D} and \mathcal{D}' are lumping equivalent (with respect to the coarsest possible lumpable partition on their union).

Lumping equivalence

Remark

For finite Markov chains, the correspondence between lumping equivalence and \sim_p allows to obtain the coarsest possible lumpable partition in an algorithmic, i.e., automated manner.

This can be considered as a **breakthrough** in Markov chain theory.

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Summary

- ▶ Bisimilar states have equal transition probabilities for every equivalence class.
- ▶ \sim_p is the coarsest probabilistic bisimulation.
- ▶ All states in a quotient DTMC are equivalence classes under \sim_p .
- ▶ \sim_p and PCTL-equivalence coincide.
- ▶ PCTL, PCTL*, and PCTL⁻-equivalence coincide.
- ▶ To show $s \not\sim_p t$, show $s \models \Phi$ and $t \not\models \Phi$ for $\Phi \in \text{PCTL}^-$.
- ▶ Bisimulation may yield up to exponential savings in state space.

Take-home message

Probabilistic bisimulation on Markov chains coincides with a notion from the sixties, named (ordinary) lumpability.