

Random variables, distributions

Continuous random variable D:

- may assume all values in some real interval. We assume a time interval $[0, \infty)$.
- has a probability density function f.

Examples: arrival time, departure time, service time, time before breakdown, ...

Interpretation: for a small time interval Δ ,

$$P(t \le D \le t + \Delta) = \Delta \cdot f(t)$$

so the cumulative distribution:

$$F(a) = P(D \le a) = \int_0^a f(t)dt$$

Many different distribution functions exist in the stochastic literature.

Exponential distribution

A stochastical variable D has exponential distribution if the density function is

$$f(t) = \lambda e^{-\lambda t}$$



Cumulative distribution:



Memoryless property

Expected time:

$$\int_0^\infty t \cdot f(t)dt = \int_0^\infty t\lambda e^{-\lambda t} = 1/\lambda$$

so $1/\lambda$ is the mean time per event, so the *rate* = number of events per time unit = λ

The exponential distribution is the only *memoryless* distribution, i.e. the probability to wait a certain amount of time is independent of how long has been waited already:

$$P(D > t + d \mid D > t) = P(D > d)$$

Examples: random autobus service, waiting for someone in a phone booth.

Exponential distribution often assumed because of its nice mathematical properties.

Markov chains

Continuous Time Markov Chain (CTMC):

- states
- transitions, each labelled with a rate

Each rate λ characterizes an exponential distribution, i.e. $P(D > t) = e^{-\lambda t}$ where D is the time at which the transition is taken.

Example: a shop

- on average 1 customer per 5 minutes (so arrival rate $\lambda = 1/5$)
- average service time 3 minutes (so service rate $\mu = 1/3$)

• maximum number of 5 customers in the shop



Race conditions

Two outgoing transitions with rate $\lambda 1$ and $\lambda 2$:



Chance that a transition is taken after time t: $P(D1 > t \land D2 > t) = e^{-\lambda 1 t} e^{-\lambda 2 t} = e^{-(\lambda 1 + \lambda 2)t}$ so total outgoing rate: $\lambda 1 + \lambda 2$.

Chance of taking the $\lambda 1$ transition: $P(D1 < D2) = \lambda 1/(\lambda 1 + \lambda 2)$, and similarly $P(D2 < D1) = \lambda 2/(\lambda 1 + \lambda 2)$

So in this way a probabilistic choice can be modelled:



with $p = \lambda 1 / (\lambda 1 + \lambda 2)$

Bisimulation for CTMC's

A bisimulation relation can be defined for CTMC's:

similar to transition systems BUT: in addition, the cumulative rate from a state to a set of states has to be taken into account.

Example:



bisimilar to



In the stochastic literature this is covered by the concept of *lumpability*.

Performance modelling

- CTMC well investigated model for performance analysis
- widely used in practice
- efficient numerical algorithms

But:

- performance modelling an art, depending on experience
- very complex if there are many components
- problem: compatibility of functional and performance model

Therefore:

find a compositional language (process algebra!) that combines functional specification with performance information.

Interactive Markov Chains

Basic operators of IMC:

inaction	0
action prefix	a.E
delay prefix	$(\lambda).E$
choice	E + F
process instantiation	X
process definition	[X := E]
Example of an IMC expression:	

 $a.(\lambda).(\mu).a.(\mu).0$

The nature of choice

What does

$$a.P + (\lambda).Q$$

mean?

Maximal Progress assumption:

an action happens as soon as it is enabled - but here we do not know if a is enabled (may depend on environment)

But:

 τ is always enabled, so we have the axiom:

$$(\lambda).E + \tau.F = \tau.F$$

(so the τ always happens, while the delay is discarded)

Strong bisimulation laws

For process algebra:

$$E + F = F + E$$
$$(E + F) + G = E + (F + G)$$
$$E + E = E$$
$$E + 0 = E$$

For IMC:

$$E + F = F + E$$
$$(E + F) + G = E + (F + G)$$
$$E + 0 = E$$
$$a.E + a.E = a.E$$
$$(\lambda).E + (\mu).E = (\lambda + \mu).E$$
$$(\lambda).E + \tau.F = \tau.F$$

recognize the race condition, and the maximal progress assumption

Operational semantics

Two types of transitions:

- action transitions: \xrightarrow{a}
- delay transitions: $\xrightarrow{\lambda}{-}$

Axiom:

$$a.E \xrightarrow{a} E$$

Rules:

$$E \xrightarrow{a} E'$$

$$E + F \xrightarrow{a} E'$$

$$F \xrightarrow{a} F'$$

$$E + F \xrightarrow{a} F'$$

Operational semantics (2)

Axiom:

$$(\lambda).E \xrightarrow{\lambda} E$$

Rules:

$$\frac{E \xrightarrow{\lambda} E', F \not\xrightarrow{\tau}}{E + F \xrightarrow{\lambda} E'}$$

$$\frac{F \xrightarrow{\lambda} F', E \not\xrightarrow{\tau}}{E + F \xrightarrow{\lambda} F'}$$

The conditions $F \not\xrightarrow{\tau}$ resp. $E \not\xrightarrow{\tau}$ are necessary because of the maximal progress assumption.

Operational semantics (3)

Process definition and instantiation:

Rules:

$$E\{[X := E]/X\} \xrightarrow{a} E'$$
$$[X := E] \xrightarrow{a} E'$$
$$E\{[X := E]/X\} \xrightarrow{\lambda} E'$$
$$[X := E] \xrightarrow{\lambda} E'$$

Example derivation:

$$(\lambda).[X:=a.X] \xrightarrow{\lambda} [X:=a.X]$$

Now

$$a.X\{[X := a.X]/X\} = a.[X := a.X]$$

 \mathbf{SO}

$$a.[X := a.X] \xrightarrow{a} [X := a.X]$$
$$[X := a.X] \xrightarrow{a} [X := a.X]$$
so $(\lambda).[X := a.X] \xrightarrow{\lambda} \xrightarrow{a} \xrightarrow{a} \xrightarrow{a} \xrightarrow{a} \dots$

Weak bisimulation laws

Process algebra: laws for strong bisimulation, plus:

$$a.\tau.E = a.E$$
$$E + \tau.E = \tau.E$$
$$a.(E + \tau.F) + a.F = a.(E + \tau.F)$$

IMC: IMC laws for strong bisimulation, plus:

$$a.\tau.E = a.E$$
$$(\lambda).\tau.E = (\lambda).E$$
$$E + \tau.E = \tau.E$$
$$a.(E + \tau.F) + a.F = a.(E + \tau.F)$$

Weak bisimulation (2)

- note that $E + \tau \cdot E = \tau \cdot E$ needs no special cases for delays and actions
- note that $(\lambda).(E + \tau.F) + (\lambda).F \neq (\lambda).(E + \tau.F)$ as lefthand side has outgoing rate 2λ , whereas righthand side has rate λ

Strong and weak bisimulation can defined in a similar way as for process algebra

(but like bisimulation for CTMC's, cumulative outgoing rates have to be taken into consideration, see paper)

Parallel composition

 $P||a_1 \dots a_n||Q$ (similar to LOTOS). Rules:

$$\begin{array}{c} P \stackrel{a}{\longrightarrow} P' \quad a \notin \{a_{1} \dots a_{n}\} \\ \hline P ||a_{1} \dots a_{n}||Q \stackrel{a}{\longrightarrow} P'||a_{1} \dots a_{n}||Q \\ \hline Q \stackrel{a}{\longrightarrow} Q' \quad a \notin \{a_{1} \dots a_{n}\} \\ \hline P ||a_{1} \dots a_{n}||Q \stackrel{a}{\longrightarrow} P||a_{1} \dots a_{n}||Q' \\ \hline P \stackrel{a}{\longrightarrow} P' \quad Q \stackrel{a}{\longrightarrow} Q' \quad a \in \{a_{1} \dots a_{n}\} \\ \hline P ||a_{1} \dots a_{n}||Q \stackrel{a}{\longrightarrow} P'||a_{1} \dots a_{n}||Q' \\ \hline P \stackrel{\lambda}{\longrightarrow} P' \quad Q \stackrel{\mathcal{T}}{\longrightarrow} \\ \hline P ||a_{1} \dots a_{n}||Q \stackrel{\lambda}{\longrightarrow} P'||a_{1} \dots a_{n}||Q \\ \hline Q \stackrel{\lambda}{\longrightarrow} Q' \quad P \stackrel{\mathcal{T}}{\longrightarrow} \\ \hline P ||a_{1} \dots a_{n}||Q \stackrel{\lambda}{\longrightarrow} P||a_{1} \dots a_{n}||Q' \\ \hline P ||a_{1} \dots a_{n}||Q \stackrel{\lambda}{\longrightarrow} P||a_{1} \dots a_{n}||Q' \\ \hline \end{array}$$



Abstraction

hide $a_1 \ldots a_n$ in P

(called *hiding* in LOTOS)

Rules:

$$P \xrightarrow{a} P' \quad a \notin \{a_1 \dots a_n\}$$

hide $a_1 \ldots a_n$ in $P \xrightarrow{a}$ hide $a_1 \ldots a_n$ in P'

$$P \xrightarrow{a} P' \quad a \in \{a_1 \dots a_n\}$$

hide $a_1 \ldots a_n$ in $P \xrightarrow{\tau}$ hide $a_1 \ldots a_n$ in P'

$$P \xrightarrow{\lambda} P'$$
 hide $a_1 \dots a_n$ in $P \not\xrightarrow{\tau}$

hide $a_1 \ldots a_n$ in $P \xrightarrow{\lambda} \to$ hide $a_1 \ldots a_n$ in P'

(negative condition: maximal progress)

Example: obtaining a CTMC

The following two processes are synchronized:



The result:



If a is hidden, this is weak bisimulation equivalent with



So hiding all actions and applying weak bisimulation may lead to a CTMC (possible problem: nondeterminism)

Example: shop

We specify the shop in IMC (using some obvious syntactic extensions):

 $\begin{array}{l} \mbox{hide enter, serve in} \\ Customer ~||enter||~(Shop(0)~||serve||~Clerk) \\ Customer := (\lambda).enter.Customer \\ Shop(i) := [i < 5] -> enter.Shop(i + 1) \\ [i > 0] -> serve.Shop(i - 1) \end{array}$

 $Clerk := serve.(\mu).Clerk$

This specification is weak bisimulation equivalent to the shop on slide 5.

Conclusions

- Compositional process algebraic framework for Interactive Markov Chains
- integration of functional specification and performance analysis
- resolving nondeterminism, hiding all actions and performing weak bisimulation leads to a CTMC that can be analysed in the usual way
- weak bisimulation may lead to an enormous decrease of the size of a CTMC
- other approaches: PEPA, TIPP, EMPA. Combine delays with actions; problem: what is the delay of a synchronised action?