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**BCS** Joint BCS-FACS and BCS Women Evening Seminar

# Process Algebra for Collective Dynamics

Jane Hillston

Laboratory for Foundations of Computer Science University of Edinburgh

10th December 2007

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# Outline



- Collective Dynamics
- Process Algebra

### 2 Continuous Approximation

- State variables
- Numerical illustration

### 3 Examples

- Case Study: Scalable Web Services
- Internet worms
- 4 On-going and Future Work
  - Alternative Models
  - New Languages

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### 1 Introduction

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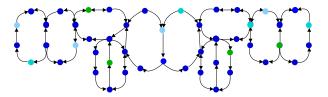
Introduction •00 •00 Continuous Approximation

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# **Collective Dynamics**

The behaviour of many systems can be interpreted as the result of the collective behaviour of a large number of interacting entities.

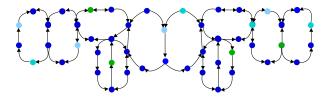


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# **Collective Dynamics**

The behaviour of many systems can be interpreted as the result of the collective behaviour of a large number of interacting entities.



For such systems we are often as interested in the population level behaviour as we are in the behaviour of the individual entities.

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# Process Algebra and Collective Dynamics

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# Process Algebra and Collective Dynamics

Process algebra are well-suited to modelling such systems

Developed to represent concurrent behaviour compositionally;

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# Process Algebra and Collective Dynamics

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- Capture the interactions between individuals explicitly;
- Incorporate formal apparatus for reasoning about the behaviour of systems;
- Stochastic extensions, such as PEPA, enable quantified behaviour of the dynamics of systems.

In the CODA project we are developing stochastic process algebras and associated theory, tailored to the construction and evaluation of the collective dynamics of large systems of interacting entities.

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# Novelty

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 Linking process algebra and continuous mathematical models for dynamic evaluation represents a paradigm shift in how such systems are studied.

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Examples On-going and Future Work

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#### Large scale software systems

Issues of scalability are important for user satisfaction and resource efficiency but such issues are difficult to investigate using discrete state models.

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#### **Biochemical signalling pathways**

Understanding these pathways has the potential to improve the quality of life through enhanced drug treatment and better drug design.

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#### **Epidemiological systems**

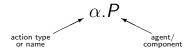
Improved modelling of these systems could lead to improved disease prevention and treatment in nature and better security in computer systems.

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## Process Algebra

Models consist of agents which engage in actions.

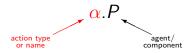


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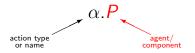


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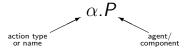


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Examples On-going and Future Work

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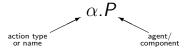
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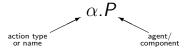
Process algebra model

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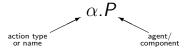
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Process algebra model

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# **Qualitative Analysis**

The labelled transition system underlying a process algebra model can be used for functional verification e.g.: reachability analysis, specification matching and model checking.

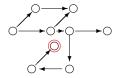
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Examples On-going and Future Work

# Qualitative Analysis

The labelled transition system underlying a process algebra model can be used for functional verification e.g.: reachability analysis, specification matching and model checking.

Will the system arrive in a particular state?



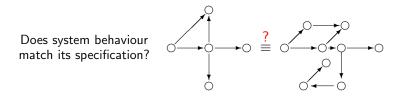
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Examples On-going and Future Work

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Examples On-going and Future Work

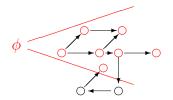
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Does a given property  $\phi$  hold within the system?

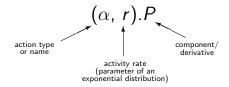


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## Stochastic Process Algebra

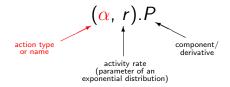


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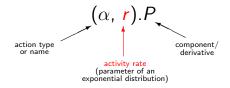


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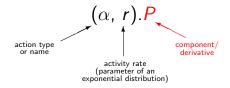


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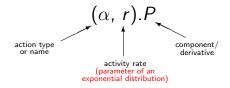


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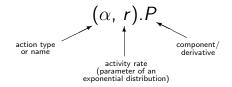
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# Stochastic Process Algebra

Models are constructed from components which engage in activities.



The language may be used to generate a CTMC for performance modelling.

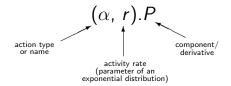
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PEPA MODEL

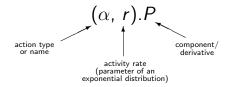
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PEPA SOS rules

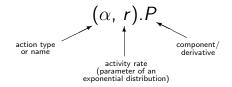
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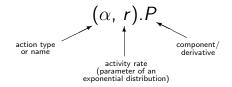
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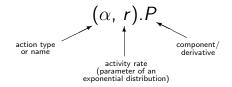
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#### Performance Evaluation Process Algebra

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## Performance Evaluation Process Algebra

$$\begin{array}{ll} (\alpha, f).P & {\rm Prefix} \\ P_1 + P_2 & {\rm Choice} \\ P_1 \bowtie P_2 & {\rm Co-operation} \\ P/L & {\rm Hiding} \\ X & {\rm Variable} \end{array}$$

Continuous Approximation

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$$P[5] \equiv (P \parallel P \parallel P \parallel P \parallel P)$$

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### Solving discrete state models

Under the SOS semantics a PEPA model is mapped to a Continuous Time Markov Chain (CTMC) with global states determined by the local states of all the participating components.

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Continuous Approximation •OO •OO Examples On-going and Future Work

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Alternatively they may be studied using stochastic simulation. Each run generates a single trajectory through the state space. Many runs are needed in order to obtain average behaviours.

As the size of the state space becomes large it becomes infeasible to carry out numerical solution and extremely time-consuming to conduct stochastic simulation.

Continuous Approximation

Examples On-going and Future Work

# Continuous Approximation

The major limitation of the CTMC approach is the state space explosion problem.

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Examples On-going and Future Work

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The major limitation of the CTMC approach is the state space explosion problem.

State space explosion becomes an ever more challenging problem as the scale and complexity of modern systems increase.

Use continuous state variables to approximate the discrete state space.

Use ordinary differential equations to represent the evolution of those variables over time.

Continuous Approximation

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New mathematical structures: differential equations

Use a more abstract state representation rather than the CTMC complete state space.

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#### New mathematical structures: differential equations

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- Assume that these state variables are subject to continuous rather than discrete change.

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#### New mathematical structures: differential equations

- Use a more abstract state representation rather than the CTMC complete state space.
- Assume that these state variables are subject to continuous rather than discrete change.
- No longer aim to calculate the probability distribution over the entire state space of the model.

Appropriate for models in which there are large numbers of components of the same type, i.e. models of populations.

Continuous Approximation

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## A simple example: processors and resources

$$egin{aligned} & Proc_0 & \stackrel{def}{=} & (task1, oper).Proc_1 \ & Proc_1 & \stackrel{def}{=} & (task2, r_2).Proc_0 \ & Res_0 & \stackrel{def}{=} & (task1, r_1).Res_1 \ & Res_1 & \stackrel{def}{=} & (reset, s).Res_0 \end{aligned}$$

 $Proc_0[P] \bigotimes_{_{\{task1\}}} Res_0[R]$ 

Continuous Approximation

Examples On-going and Future Work

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# A simple example: processors and resources

$$Proc_0[P] \bigotimes_{\substack{\{task1\}}} Res_0[R]$$

Processors (P)	Resources (R)	
1	1	4
2	1	8
2	2	16
3	2	32
3	3	64
4	3	128
4	4	256
5	4	512
5	5	1024
6	5	2048
6	6	4096
7	6	8192
7	7	16384
8	7	32768
8	8	65536
9	8	131072
9	9	262144
10	9	524288
10	10	1048576

CTMC interpretation

Continuous Approximation

Examples On-going and Future Work

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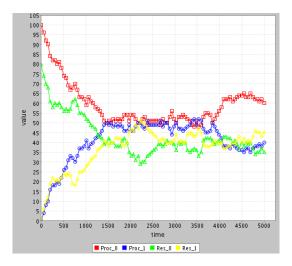
## A simple example: processors and resources

$$\begin{array}{l} \text{ODE interpretation} \\ \text{ODE interpretation} \\ \text{ODE interpretation} \\ \frac{dProc_{0}}{dt} &= -r_{1} \min(Proc_{0}, Res_{0}) \\ +r_{2} Proc_{1} \\ \frac{def}{dt} &= r_{1} \min(Proc_{0}, Res_{0}) \\ \frac{dProc_{1}}{dt} &= r_{1} \min(Proc_{0}, Res_{0}) \\ -r_{2} Proc_{1} \\ \frac{dRes_{0}}{dt} &= -r_{1} \min(Proc_{0}, Res_{0}) \\ \frac{dRes_{0}}{dt} &= -r_{1} \min(Proc_{0}, Res_{0}) \\ +s Res_{1} \\ \frac{dRes_{1}}{dt} &= r_{1} \min(Proc_{0}, Res_{0}) \\ -s Res_{1} \end{array}$$

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Examples On-going and Future Work

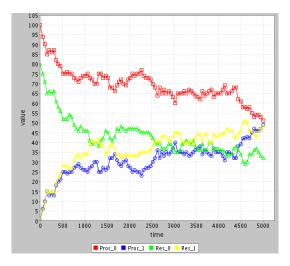
## Processors and resources (simulation run A)



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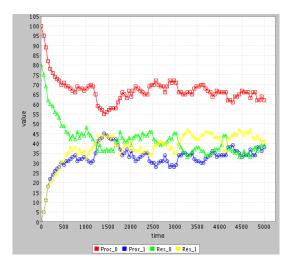
## Processors and resources (simulation run B)



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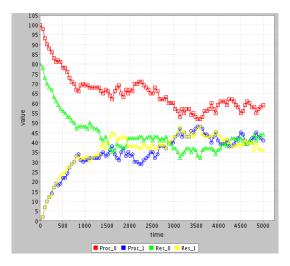
## Processors and resources (simulation run C)



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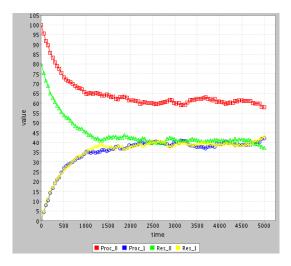
Continuous Approximation

## Processors and resources (simulation run D)



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### Processors and resources (average of 10 runs)

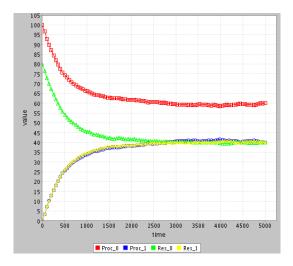


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Continuous Approximation

Examples On-going and Future Worl

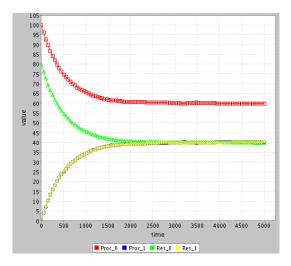
### Processors and resources (average of 100 runs)



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Examples On-going and Future Work

## Processors and resources (average of 1000 runs)

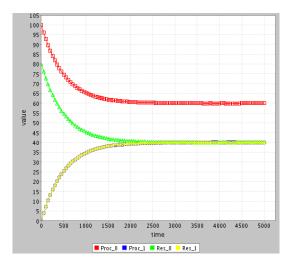


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Examples On-going and Future Work

### Processors and resources (average of 10000 runs)

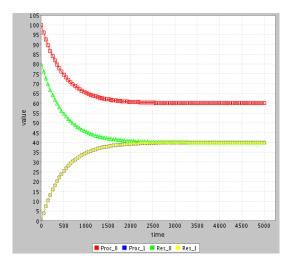


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Examples On-going and Future Work

# Processors and resources (ODE solution)



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Examples On-going and Future Work

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## Relation to transient solution

It is important to understand what this solution represents compared to say, traditional transient analysis of a Markov chain: an ODE represents a deterministic view of a system, that is, a particular mean trajectory.

Continuous Approximation

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## Relation to transient solution

- It is important to understand what this solution represents compared to say, traditional transient analysis of a Markov chain: an ODE represents a deterministic view of a system, that is, a particular mean trajectory.
- This compares to a transient Markov model solution which maintains the stochastic information in the solution and shows a particular trajectory's probability of occurring at a time t.

Continuous Approximation

Examples On-going and Future Work

# Outline



- Collective Dynamics
- Process Algebra

#### 2 Continuous Approximation

- State variables
- Numerical illustration

#### 3 Examples

- Case Study: Scalable Web Services
- Internet worms

#### 4 On-going and Future Work

- Alternative Models
- New Languages

Continuous Approximation

Examples On-going and Future Work

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## Virtual University Scenario

A Virtual University is a federation of *real* universities, each contributing courses and degrees.

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Examples On-going and Future Work

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## Virtual University Scenario

- A Virtual University is a federation of *real* universities, each contributing courses and degrees.
- Sharing of knowledge is promoted by providing students with a wider selection of subjects.

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Examples On-going and Future Work

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## Virtual University Scenario

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Continuous Approximation

## Virtual University Scenario

- A Virtual University is a federation of *real* universities, each contributing courses and degrees.
- Sharing of knowledge is promoted by providing students with a wider selection of subjects.
- Services are replicated across the physical sites.
- By agreement in the university, students may connect to any site to download content and use services, not just the one which is geographically closest.

Continuous Approximation

## Case Study: A Virtual University



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#### Location, Time, and Size



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## Replicating Web Services

Two viable approaches to cope with increasing user demand:

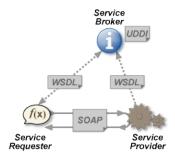
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## **Replicating Web Services**

Two viable approaches to cope with increasing user demand:

use a service broker for routing



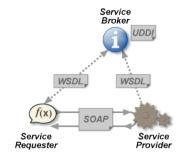
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# Replicating Web Services

Two viable approaches to cope with increasing user demand:

use a service broker for routing



decentralised routing

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# **Replicating Web Services**

Two viable approaches to cope with increasing user demand:

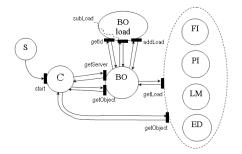
use a service broker for routing



decentralised routing

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#### Decentralised Routing

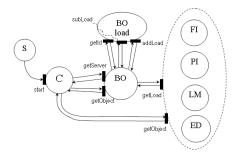


1 A client contacts a university site to download content.

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#### **Decentralised Routing**

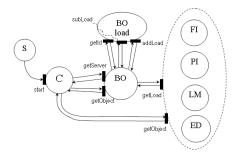


- 1 A client contacts a university site to download content.
- 2 The site either serves the request or forwards it to another site.

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### **Decentralised Routing**



- **1** A client contacts a university site to download content.
- **2** The site either serves the request or forwards it to another site.
- **3** The decision in made in accord with the local service policy.

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## Model in PEPA

#### Clients

$$(1\leq i\leq k)$$

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## Model in PEPA

#### Clients

 $(1 \le i \le k)$ 

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## Model in PEPA

#### Clients

$$(1\leq i\leq k)$$

Continuous Approximatio

## Model in PEPA

#### Content mirrors

$$\begin{array}{ll} \textit{Mirror}_{j} & \stackrel{\text{\tiny def}}{=} & (\textit{connect}_{j}, f_{j}(s)).\textit{MirrorUploading}_{j} \\ \textit{MirrorUploading}_{j} & \stackrel{\text{\tiny def}}{=} & (\textit{download}_{j}, \top).\textit{Mirror}_{j} \end{array}$$

$$(1 \leq j \leq m)$$

Continuous Approximatio

## Model in PEPA

#### Content mirrors

$$\begin{array}{ll} \textit{Mirror}_{j} & \stackrel{\text{\tiny def}}{=} & (\textit{connect}_{j}, \textit{f}_{j}(\textit{s})).\textit{MirrorUploading}_{j} \\ \textit{MirrorUploading}_{j} & \stackrel{\text{\tiny def}}{=} & (\textit{download}_{j}, \top).\textit{Mirror}_{j} \end{array}$$

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## Service policies as functional rates in PEPA

#### The Bologna policy

Serve all requests while load is less than 75%. If more, and the loads at UNIFI, UPISA, LMU and UEDIN are at least 60%, 60%, 40% and 20% then serve the request if load is less than 95%.

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### Service policies as functional rates in PEPA

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	(	Т	if MirrorUploading $_{ m UNIBO} < 75$
		Т	if $Mirror Uploading_{\rm UNIBO} < 95$ ,
			$MirrorUploading_{\mathrm{UNIFI}} \geq 60,$
$f_{\rm UNIBO} = -$	{		$\textit{MirrorUploading}_{\mathrm{UPISA}} \geq 60,$
			$\mathit{MirrorUploading}_{\mathrm{LMU}} \geq$ 40,
			$\it MirrorUploading_{ m UEDIN} \ge 20$
	l	0	otherwise

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Examples On-going and Future Work

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### Model in PEPA

#### Dealing with overload

 $\begin{array}{ll} \textit{Overload} & \stackrel{\tiny def}{=} & (\textit{overload}, o(s)).\textit{Overload} \\ \\ o(s) = \left\{ \begin{array}{ll} \top & f_i(s) = 0, & 1 \leq i \leq m \\ 0 & \text{otherwise} \end{array} \right. \end{array}$ 

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### Model in PEPA

#### Dealing with overload

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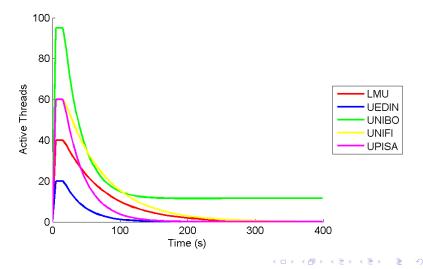
The system as a whole with client and mirror site populations

 $(Client_1[p_1] \parallel Client_2[p_2] \parallel \dots \parallel Client_k[p_k]) \\ \underset{l}{\bowtie} (Mirror_1[q_1] \parallel Mirror_2[q_2] \parallel \dots \parallel Mirror_m[q_m])$ 

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Examples On-going and Future Work

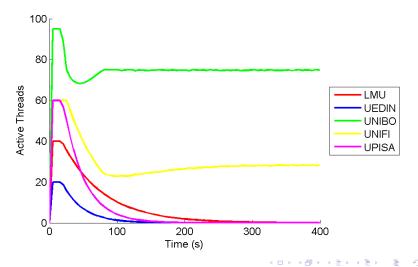
### Numerical Results



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Examples On-going and Future Work

### Numerical Results

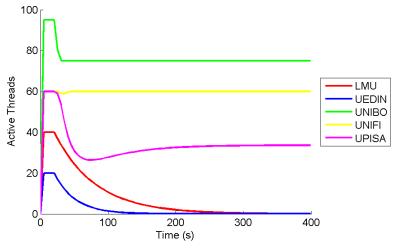


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Examples On-going and Future Work

### Numerical Results

 $r_{idle} = 0.02$ 

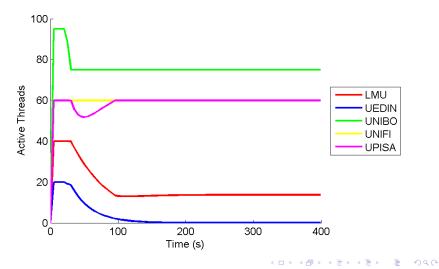


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Examples On-going and Future Work

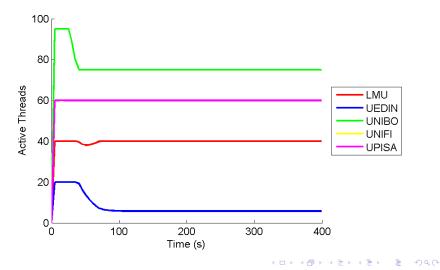
### Numerical Results



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Examples On-going and Future Work

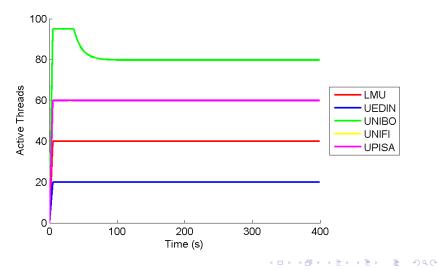
### Numerical Results



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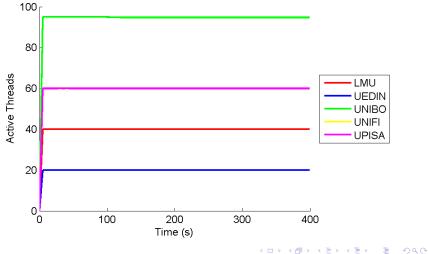
Examples On-going and Future Work

### Numerical Results



Examples On-going and Future Work 

### Numerical Results



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Examples On-going and Future Work

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## Comments

We have a modelling approach which captures both functional and non-functional properties of large-scale systems.

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Examples On-going and Future Work

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- We have a modelling approach which captures both functional and non-functional properties of large-scale systems.
- PEPA gives us insights into the performance of the system.

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- We have a modelling approach which captures both functional and non-functional properties of large-scale systems.
- PEPA gives us insights into the performance of the system.
  - We applied the continuous-space semantics of PEPA and were able to see service policies at work.

Continuous Approximatio

- We have a modelling approach which captures both functional and non-functional properties of large-scale systems.
- PEPA gives us insights into the performance of the system.
  - We applied the continuous-space semantics of PEPA and were able to see service policies at work.
  - Analysis carried out on a system of 17 ODEs as opposed to an underlying CTMC of over 270 million states.

Continuous Approximatio

- We have a modelling approach which captures both functional and non-functional properties of large-scale systems.
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Continuous Approximation

Examples On-going and Future Work

### Internet worms: Background

Internet worms are malicious programs that exploit operating system security weaknesses to propagate themselves.

Continuous Approximation

Examples On-going and Future Work

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- Worms like Nimbda, Slammer, Code Red, Sasser and Code Red 2 have caused the Internet to become unusable for many hours at a time until security patches could be applied and routers fixed.
- The estimated cost of computer worms and related activities is about \$50 billion a year.

Continuous Approximatio

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## An Internet-scale Problem

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- Explicit state-based methods for calculating steady-state, transient or passage-time measures are limited to state-spaces of the order of 10<sup>9</sup>.
- By transforming our stochastic process algebra model into a set of ODEs, we can obtain a plot of model behaviour against time for models with global state spaces in excess of 10<sup>10000</sup> states.

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## Susceptible-Infective-Removed (SIR) model

 We apply a version of an SIR model of infection to various computer worm attack models.

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Examples On-going and Future Work

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Susceptible-Infective-Removed over a network

 This is our most basic infection model and is used to verify that we get recognisable qualitative results.

Examples On-going and Future Work

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- This is our most basic infection model and is used to verify that we get recognisable qualitative results.
- Initially, there are N susceptible computers and one infected computer.
- As the system evolves more susceptible computers become infected from the growing infective population.
- An infected computer can be patched so that it is no longer infected or susceptible to infection.

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- This is our most basic infection model and is used to verify that we get recognisable qualitative results.
- Initially, there are N susceptible computers and one infected computer.
- As the system evolves more susceptible computers become infected from the growing infective population.
- An infected computer can be patched so that it is no longer infected or susceptible to infection.
- This state is termed removed and is an absorbing state for that component in the system.

Examples On-going and Future Work

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Susceptible-Infective-Removed over a network

• The capacity of the network is dictated by the parameter *M*, the number of concurrent, independent connections that the network can sustain.

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- The capacity of the network is dictated by the parameter *M*, the number of concurrent, independent connections that the network can sustain.
- Additionally, an attempted network connection can fail or timeout as indicated by the *fail* action.

Continuous Approximation

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# Susceptible-Infective-Removed over a network

- The capacity of the network is dictated by the parameter *M*, the number of concurrent, independent connections that the network can sustain.
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# Susceptible-Infective-Removed over a network

- The capacity of the network is dictated by the parameter *M*, the number of concurrent, independent connections that the network can sustain.
- Additionally, an attempted network connection can fail or timeout as indicated by the *fail* action.
- This might be due to network contention or the lack of availability of a susceptible machine to infect.
- As large scale worm infections tend not to waste time determining whether a given host is already infected or not, we assume that a certain number of infections will attempt to reinfect hosts; in this instance, the host is unaffected.

Continuous Approximation

Examples On-going and Future Work

Susceptible-Infective-Removed over a network

$$S \stackrel{def}{=} (infectS, \top).I$$

$$I \stackrel{\text{\tiny def}}{=} (infectI, \beta).I + (infectS, \top).I + (patch, \gamma).R$$

 $R \stackrel{{}_{\tiny{def}}}{=} Stop$ 

Continuous Approximation

Examples On-going and Future Work

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Net 
$$\stackrel{\text{def}}{=}$$
 (infectI,  $\top$ ).Net'  
Net'  $\stackrel{\text{def}}{=}$  (infectS,  $\beta$ ).Net + (fail,  $\delta$ ).Net

Continuous Approximation

Examples On-going and Future Work

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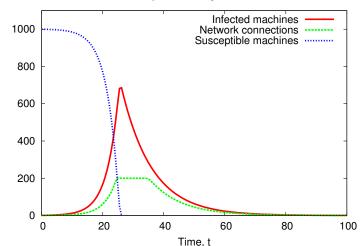
$$Sys \stackrel{\text{def}}{=} (S[N] \parallel I) \bowtie_{L} Net[M]$$
  
where  $L = \{ infectI, infectS \}$ 

Number

Continuous Approximation

Examples On-going and Future Work

### Patch rate $\gamma = 0.1$ . Connection failure rate $\delta = 0.5$



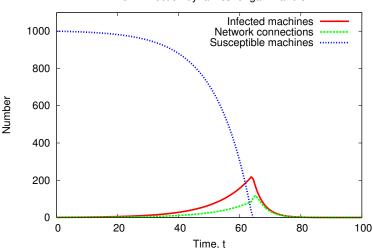
Worm infection dynamics for gamma=0.1, delta=0.5

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Examples On-going and Future Work

## Patch rate $\gamma = 0.3$ . Connection failure rate $\delta = 0.5$



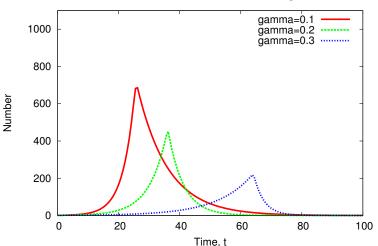
Worm infection dynamics for gamma=0.3

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Continuous Approximation

Examples On-going and Future Work

## Increasing machine patch rate $\gamma$ from 0.1 to 0.3



Infected machines for different values of gamma

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Examples On-going and Future Work

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Susceptible-Infective-Removed-Reinfection (SIRR) model

As with the SIR model, we constrain infection to occur over a limited network resource, constrained by the number of independent network connections in the system, *M*.

Continuous Approximatio

Examples On-going and Future Work

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- As with the SIR model, we constrain infection to occur over a limited network resource, constrained by the number of independent network connections in the system, *M*.
- A small modification in the process model of infection allows for removed computers to become susceptible again after a delay.

Continuous Approximatio

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- A small modification in the process model of infection allows for removed computers to become susceptible again after a delay.
- We use this to model a faulty or incomplete security upgrade or the mistaken removal of security patches which had previously defended the machine against attack.

Continuous Approximatio

Examples On-going and Future Work

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Susceptible-Infective-Removed-Reinfection (SIRR) model

- $S \stackrel{\text{\tiny def}}{=} (infectS, \top).I$
- $I \stackrel{\text{\tiny def}}{=} (infectI, \beta).I + (infectS, \top).I + (patch, \gamma).R$
- $R \stackrel{\text{\tiny def}}{=} (unsecure, \mu).S$

Continuous Approximatio

Examples On-going and Future Work

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Net 
$$\stackrel{\text{def}}{=}$$
 (infectI,  $\top$ ).Net'  
Net'  $\stackrel{\text{def}}{=}$  (infectS,  $\beta$ ).Net + (fail,  $\delta$ ).Net

Continuous Approximation

Examples On-going and Future Work

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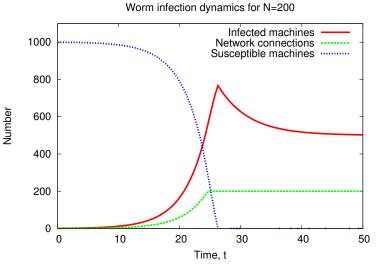
Net 
$$\stackrel{\text{def}}{=}$$
 (infectI,  $\top$ ).Net'  
Net'  $\stackrel{\text{def}}{=}$  (infectS,  $\beta$ ).Net + (fail,  $\delta$ ).Net

$$Sys \stackrel{\text{def}}{=} (S[1000] \parallel I) \bowtie_{L} Net[M]$$
where  $L = \{infectI, infectS\}$ 

Continuous Approximatio

Examples On-going and Future Work

## Unsecured SIR model (200 network channels)

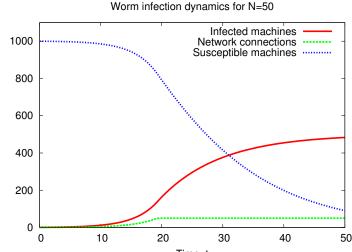


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Examples On-going and Future Work

# Unsecured SIR model (50 network channels)

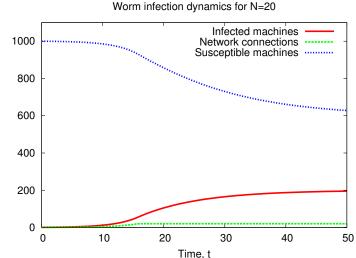


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Examples On-going and Future Work

# Unsecured SIR model (20 network channels)



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Examples On-going and Future Work

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Susceptible-Infective-Removed-Attack (SIR-Attack) model

 This example describes a modified SIR-Attack model. This simulates a possible *distributed denial-of-service* (DDOS) attack mode of an Internet worm.

Continuous Approximatio

Examples On-going and Future Work

- This example describes a modified SIR-Attack model. This simulates a possible *distributed denial-of-service* (DDOS) attack mode of an Internet worm.
- In some worms it is known that there is a bimodal behaviour to the worm, either a worm can infect another computer or it can start an attack on a victim computer.

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Examples On-going and Future Work

- This example describes a modified SIR-Attack model. This simulates a possible *distributed denial-of-service* (DDOS) attack mode of an Internet worm.
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- The attack need not itself exploit any particular security flaw, but can be something as simple as requesting a specific web page, or issuing a *ping* request.

Continuous Approximatio

Examples On-going and Future Work

- This example describes a modified SIR-Attack model. This simulates a possible *distributed denial-of-service* (DDOS) attack mode of an Internet worm.
- In some worms it is known that there is a bimodal behaviour to the worm, either a worm can infect another computer or it can start an attack on a victim computer.
- The attack need not itself exploit any particular security flaw, but can be something as simple as requesting a specific web page, or issuing a *ping* request.
- The combination of perhaps millions of machines making such requests quickly overwhelms the target computer, which either crashes under the huge load, or becomes unusably slow.

Continuous Approximatio

Examples On-going and Future Work

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$$\begin{split} S &\stackrel{\text{def}}{=} (infectS, \top).I \\ I &\stackrel{\text{def}}{=} (infectI, \beta).I + (infectS, \top).I + (patch, \gamma).R + (attack, \chi).A \\ A &\stackrel{\text{def}}{=} (attackA, \lambda).A + (patch, \gamma).R \\ R &\stackrel{\text{def}}{=} Stop \end{split}$$

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$$\begin{array}{l} \textit{Net} \stackrel{\textit{def}}{=} (\textit{infectI}, \top).\textit{Net}' + (\textit{attackA}, \top).\textit{Net}''\\ \textit{Net}' \stackrel{\textit{def}}{=} (\textit{infectS}, \beta).\textit{Net} + (\textit{fail}, \delta).\textit{Net}\\ \textit{Net}'' \stackrel{\textit{def}}{=} (\textit{attackV}, \rho).\textit{Net} + (\textit{fail}, \delta).\textit{Net} \end{array}$$

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 $\begin{array}{l} V \stackrel{\scriptscriptstyle def}{=} (\textit{attackV},\top).V' \\ V' \stackrel{\scriptscriptstyle def}{=} (\textit{release},\sigma).V \end{array} \end{array}$ 

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Examples On-going and Future Work

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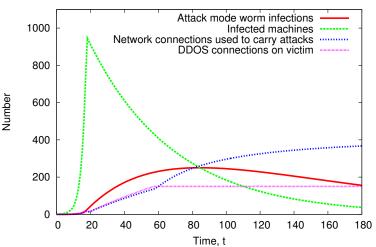
 $V \stackrel{\text{\tiny def}}{=} (attackV, \top).V'$  $V' \stackrel{\text{\tiny def}}{=} (release, \sigma).V$ 

 $Sys \stackrel{\text{\tiny def}}{=} (S[1000] \parallel I \parallel V) \bowtie_{L} Net[M]$ where  $L = \{infectI, infectS, attackA, attackV\}$ 

Continuous Approximation

Examples On-going and Future Work

### Impact of the network capacity on the DDOS attack



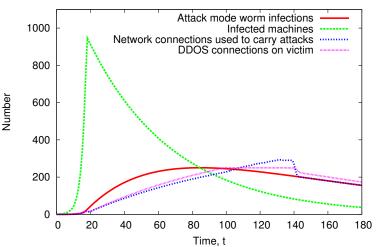
DDOS attack with victim saturation at 150 connections

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Continuous Approximation

Examples On-going and Future Work

### Impact of the network capacity on the DDOS attack



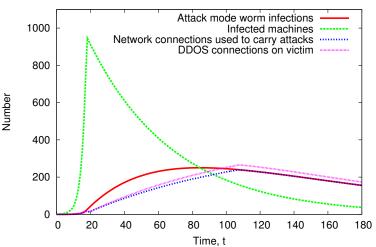
DDOS attack with victim saturation at 250 connections

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Examples On-going and Future Work

### Impact of the network capacity on the DDOS attack



DDOS attack with victim saturation at 500 connections

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# Conclusions

The scale of the effects of Internet worms defeats attempts to model their behaviour in very close detail, and thus impedes the analysis which has the potential to bring understanding of their function and distribution.

Continuous Approximation

Examples On-going and Future Work

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- Process algebra modelling allows the details of interactions to be recorded on the individual level but then mapped to abstracted away into appropriate population-based representations.

Continuous Approximation

Examples On-going and Future Work

# Conclusions

- The scale of the effects of Internet worms defeats attempts to model their behaviour in very close detail, and thus impedes the analysis which has the potential to bring understanding of their function and distribution.
- Process algebra modelling allows the details of interactions to be recorded on the individual level but then mapped to abstracted away into appropriate population-based representations.
- The scale of problems which can be modelled in this way vastly exceeds those which are founded on explicit state representations.

Continuous Approximation

Examples On-going and Future Work

# Conclusions

- The scale of the effects of Internet worms defeats attempts to model their behaviour in very close detail, and thus impedes the analysis which has the potential to bring understanding of their function and distribution.
- Process algebra modelling allows the details of interactions to be recorded on the individual level but then mapped to abstracted away into appropriate population-based representations.
- The scale of problems which can be modelled in this way vastly exceeds those which are founded on explicit state representations.
- We believe the modelling methods exemplified here to be generally useful for analysing the behaviour of populations of interacting processes with complex dynamics.

Continuous Approximation

Examples On-go

On-going and Future Work

# Outline

#### I Introduction

- Collective Dynamics
- Process Algebra

#### 2 Continuous Approximation

- State variables
- Numerical illustration

### 3 Examples

- Case Study: Scalable Web Services
- Internet worms

### 4 On-going and Future Work

- Alternative Models
- New Languages

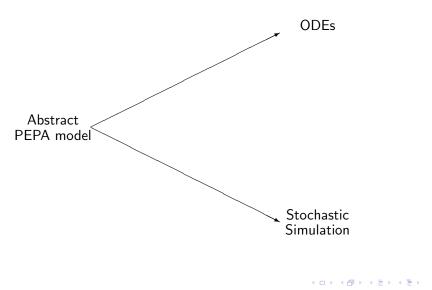
Continuous Approximatio

Examples On-going

On-going and Future Work

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## Alternative Representations

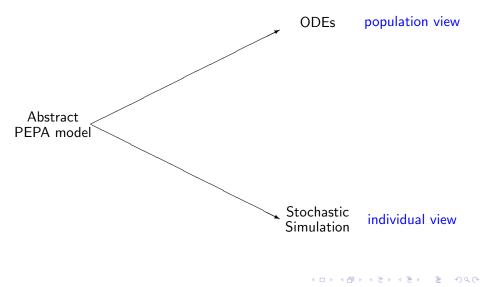


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Examples On-going a

On-going and Future Work

## Alternative Representations



Continuous Approximation

Examples On-going and Future Work

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# Discretisation

In some cases observations of the system are made not at the level of the individuals but at the level of the populations.

Continuous Approximation

Examples On-going and Future Work

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This more naturally lends itself to description in ordinary differential equations (ODEs).

Continuous Approximation

Examples On-going and Future Work

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Continuous Approximation

Examples On-going and Future Work

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However we may be interested in analyses such as model checking which cannot be readily applied in the context of ODEs.

Continuous Approximation

Examples On-going and Future Work

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Luckily the process algebra descriptions are the same.

However we may be interested in analyses such as model checking which cannot be readily applied in the context of ODEs.

This can be accomodated if we consider an abstract, intermediate level model in which transitions represent discretised steps within the continuous population range.

Continuous Approximation

Examples On-going

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## Discretising continuous variables



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On-going and Future Work

### Discretising continuous variables



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On-going and Future Work

## Discretising continuous variables



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Examples On-going

On-going and Future Work

## Discretising continuous variables



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Examples On-going

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## Discretising continuous variables



We can discretise the continuous range of possible concentration values into a number of distinct states. These form the possible states of the component representing the entity.

Or alternatively each copy of an entity might represent a range of concentration values.

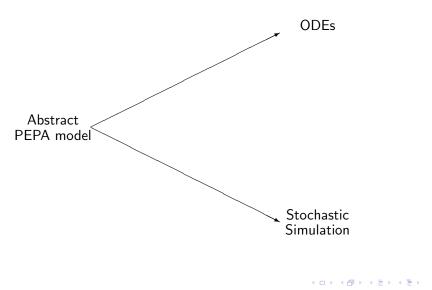
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#### Alternative Representations



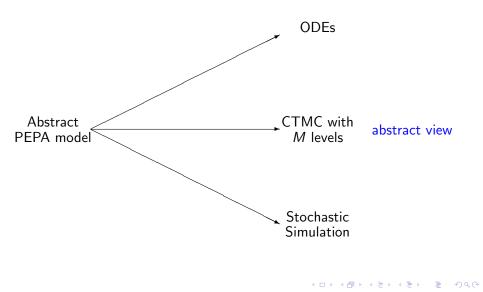


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Examples On-going

On-going and Future Work

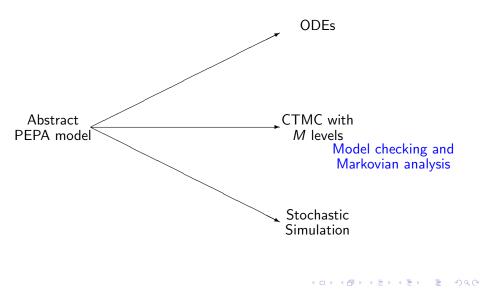
#### Alternative Representations





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#### Alternative Representations



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## Software Tool Support

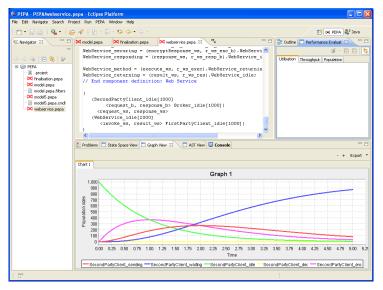
PEPA is supported by several tool suites:

- The PRISM probabilistic model checker
  - Kwiatkowska, Norman, Parker Oxford
- The IPC/Hydra tool chain
  - Bradley, Knottenbelt, Dingle Imperial College, London
- The Eclipse Plug-in for PEPA
  - Tribastone, Clark and Duguid Edinburgh

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Examples On-going and Future Work

### Eclipse Plug-in for PEPA



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Examples On-going and Future Work

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## New languages

In addition to using PEPA in this novel way we are also exploring the use of new process algebras, specifically designed with collective dynamics in mind:

- Bio-PEPA: Designed for modelling biochemical processes such as those that arise in signal transduction pathways.
  - HYPE: Designed for modelling hybrid systems combining discrete and continuous behaviour.
    - L: Taking an alternative approach to modelling systems from the population perspective.

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Examples On-going and Future Work

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**Bio-PEPA** 

Particularly suited to modelling biochemical processes
 Bio-PEPA is designed for abstract modelling with parameters
 capturing state changes in terms of abstract levels.

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- Particularly suited to modelling biochemical processes
   Bio-PEPA is designed for abstract modelling with parameters
   capturing state changes in terms of abstract levels.
- Moreover the notion of stoichiometry is fully supported: different participants in a reaction (action) may be modified to different degrees.

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Examples On-going and Future Work

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 The continuous approximation approach currently assumes that it is valid to consider populations of all component types so that all actions can be modelled by ODEs.

Continuous Approximation

Examples On-going and Future Work

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- The continuous approximation approach currently assumes that it is valid to consider populations of all component types so that all actions can be modelled by ODEs.
- HYPE is designed to describe hybrid systems in which there are two types of actions: instantaneous, discrete events and continuously acting influences.

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 Targetted to population level models, L takes a dual view of systems with components representing processes or flows and actions representing the aspects of the system which modify flows.

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- Targetted to population level models, L takes a dual view of systems with components representing processes or flows and actions representing the aspects of the system which modify flows.
- This offers an alternative formalisation of ODE-based models, the potential of which is currently being explored.

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## Conclusions

Many interesting and important systems can be regarded as examples of collective dynamics and emergent behaviour.

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## Conclusions

- Many interesting and important systems can be regarded as examples of collective dynamics and emergent behaviour.
- Process algebras, such as PEPA, are well-suited to modelling the behaviour of such systems in terms of the individuals and their interactions.

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## Conclusions

- Many interesting and important systems can be regarded as examples of collective dynamics and emergent behaviour.
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- Continuous approximation allows a rigorous mathematical analysis of the average behaviour of such systems.

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## Conclusions

- Many interesting and important systems can be regarded as examples of collective dynamics and emergent behaviour.
- Process algebras, such as PEPA, are well-suited to modelling the behaviour of such systems in terms of the individuals and their interactions.
- Continuous approximation allows a rigorous mathematical analysis of the average behaviour of such systems.
- This alternative view of systems has opened up many and exciting new research directions.

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## Thanks!

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# Thanks!

#### Acknowledgements: collaborators

Thanks to many co-authors and collaborators: Jeremy Bradley, Muffy Calder, Federica Ciocchetta, Allan Clark, Adam Duguid, Vashti Galpin, Stephen Gilmore, Marco Stenico, Mirco Tribastone, and others.

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#### More information:

http://www.dcs.ed.ac.uk/pepa