

# Compositional dynamic modelling: a Computer Science perspective

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- ▶ Predicting the performance of the system.

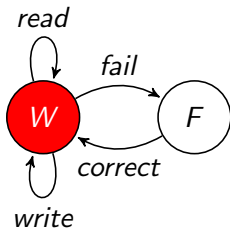
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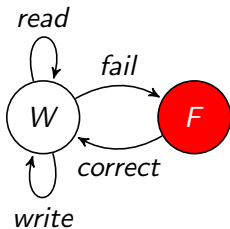
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# Simple model of Disk Behaviour

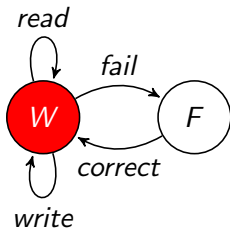




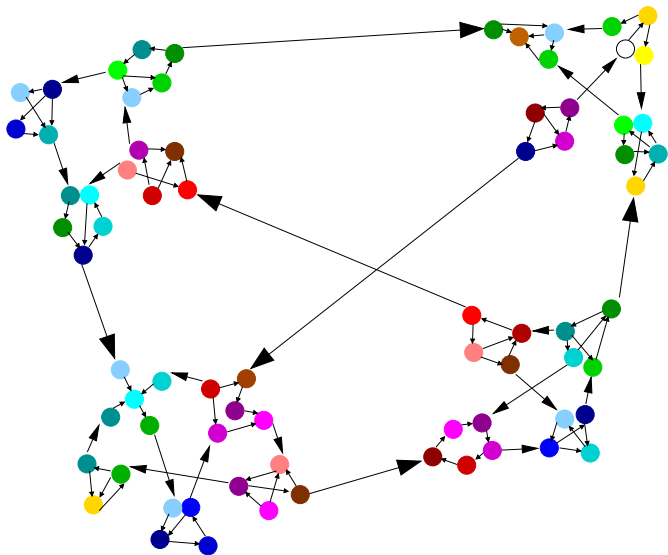
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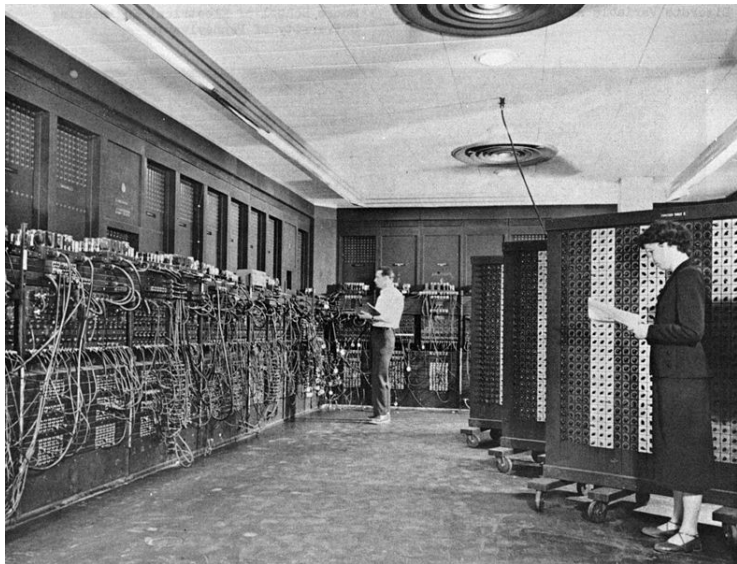
# Simple model of Disk Behaviour



# Detailed view of Behaviour — State Machine



# Advancing Computer Technology



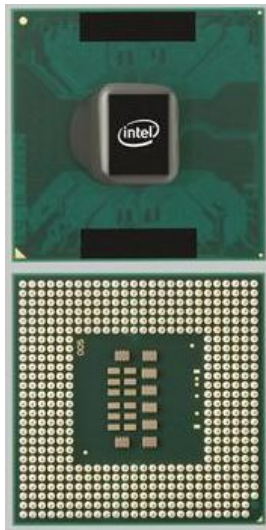
ENIAC c. 1946

# Advancing Computer Technology



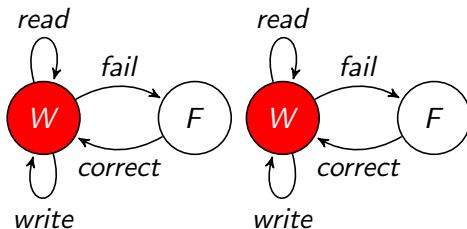
standard laptop c. 2006

# Advancing Computer Technology

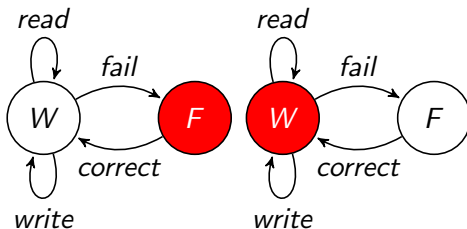


Intel dual core

# Disks revisited

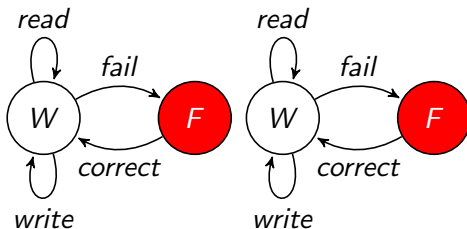


## Disks revisited

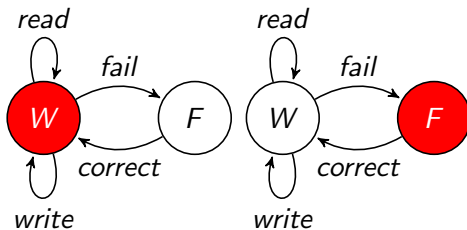




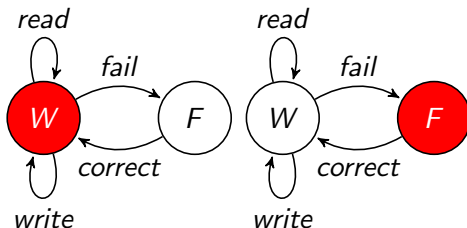
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Constructing a model directly in terms of the possible states rapidly becomes a daunting prospect

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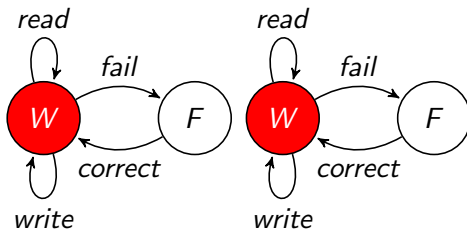
Later version of the formalisms included information about the timing and resource use associated with the represented processes: these are **stochastic process algebras**.

# Disks revisited

## Disk

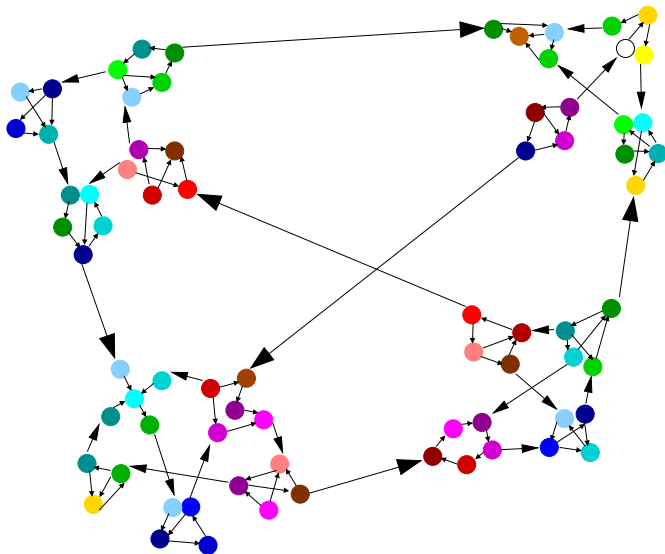
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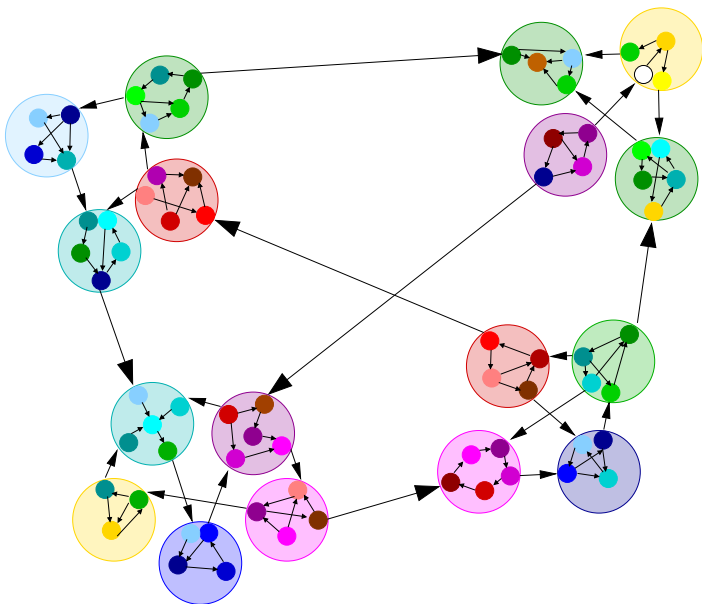




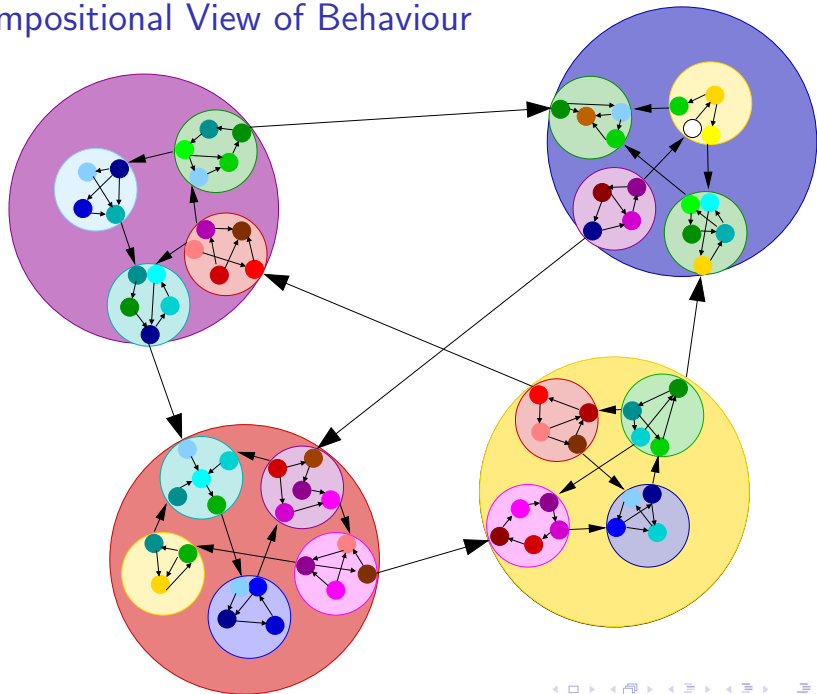
# Compositional View of Behaviour



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# Constructing models from simple components

## Client

$$\begin{aligned} \text{Client}_{idle} &\stackrel{\text{def}}{=} (\text{request}, \lambda). \text{Client}_{waiting} \\ \text{Client}_{waiting} &\stackrel{\text{def}}{=} (\text{response}, \top). \text{Client}_{idle} \end{aligned}$$

## Server

$$\begin{aligned} \text{Server}_{idle} &\stackrel{\text{def}}{=} (\text{request}, \top). \text{Server}_{computing} \\ \text{Server}_{computing} &\stackrel{\text{def}}{=} (\text{compute}, \pi). \text{Server}_{responding} \\ \text{Server}_{responding} &\stackrel{\text{def}}{=} (\text{response}, \rho). \text{Server}_{idle} \end{aligned}$$

## System

$$\begin{aligned} \text{System} &\stackrel{\text{def}}{=} \text{Client}_{idle}[3] \boxtimes_{\mathcal{L}} \text{Server}_{idle}[2] \\ \text{where } \mathcal{L} &= \{\text{request}, \text{response}\} \end{aligned}$$

## Other applications

The compositional modelling style of process algebras has also been applied to modelling other things as well as computers, most notably **biochemical pathways in systems biology**.

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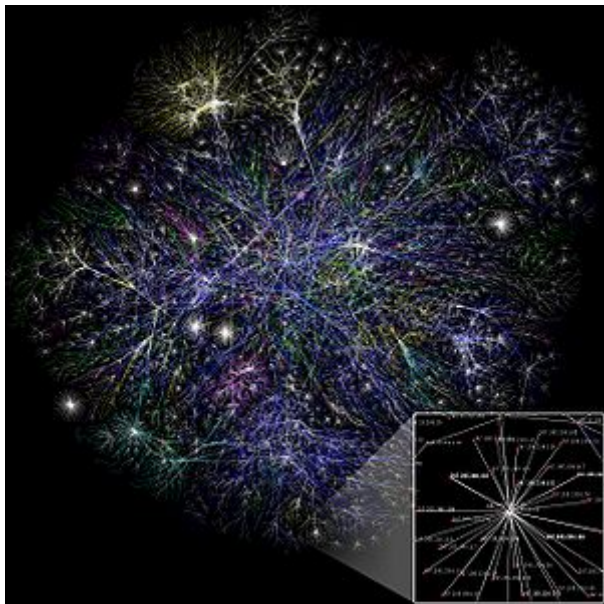
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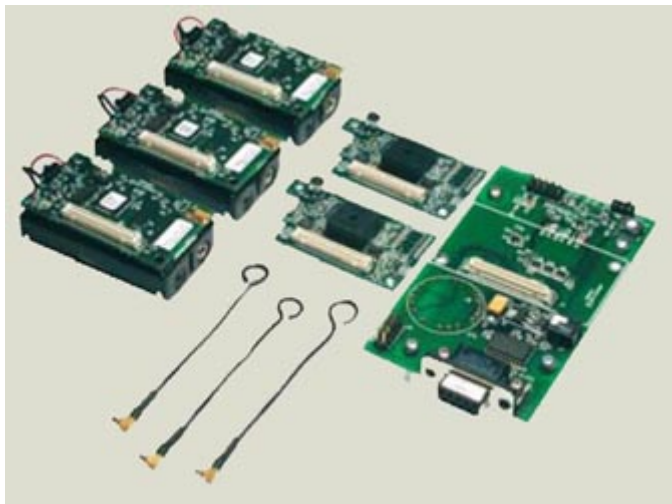
In general stochastic process algebras provide a good framework for modelling systems in which the collective behaviour emerges as the result of a large number of individuals, acting and interacting in a predefined, but stochastic, manner.

# Internet scale





## Mote scale



Smaller and smaller devices create the possibility of a network around each person.

# Challenges of modelling ubiquitous systems

*Populations of computing entities will be a significant part of our environment, performing tasks that support us, and we shall be largely unaware of them.*

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Unfortunately the scale of the systems is such that our existing modelling techniques are severely challenged by ubiquitous systems.

# State-space explosion

Disks	States
1	2

# State-space explosion

Disks	States
1	2
2	4

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Disks	States
1	2
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6	64

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1	2
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# State-space explosion

Disks	States
1	2
2	4
6	64
10	1024
20	1048576

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1	2
2	4
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# State-space explosion

Disks	States
1	2
2	4
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10	1024
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50	1125899906842624
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# State-space explosion

Disks	States
1	2
2	4
6	64
10	1024
20	1048576
50	1125899906842624
100	1267650600228229401496703205376
150	1427247692705959881058285969449495136382746624

# State-space explosion

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1	2
2	4
6	64
10	1024
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$2^{150}$  states

# State-space explosion

Disks	States
1	2
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$2^{150}$  states =  $2^{152}$  bytes

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1	2
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$$2^{150} \text{ states} = 2^{152} \text{ bytes} = 2^{82} \times 2^{70} \text{ bytes}$$

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1	2
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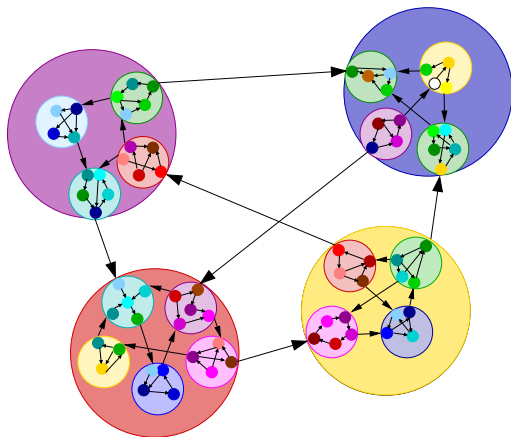


# Compositionality and Abstraction

One approach is to make use of the compositional structure and abstract away detail of the internal behaviour of components.

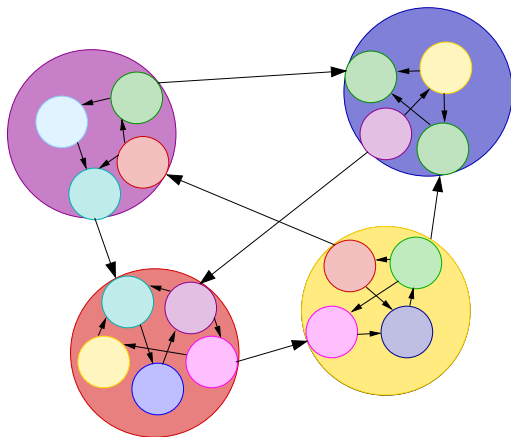
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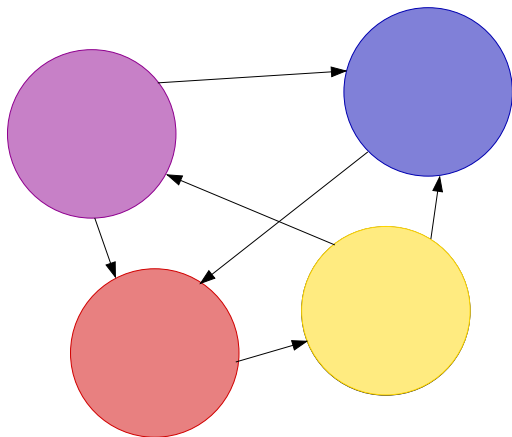
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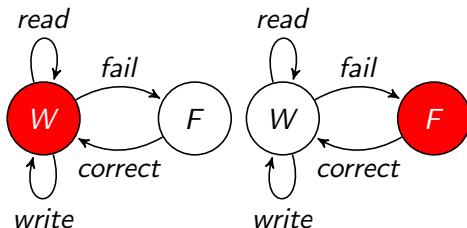
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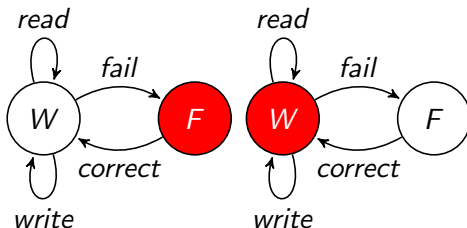
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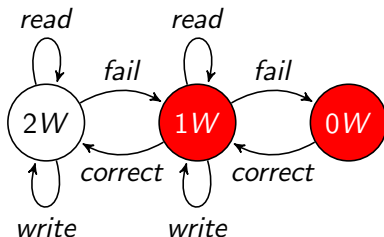




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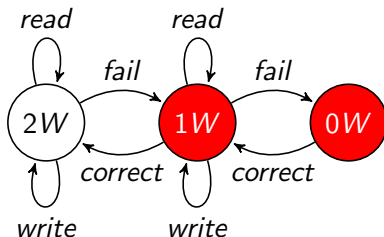


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We may choose to disregard the **identity** of components.

Even better reductions can be achieved when we no longer regard the components as **individuals**.

# Collective Behaviour

In the natural world there are many instances of collective behaviour and its consequences:



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## Example Service Level Agreement

90% of requests receive a response within 3 seconds.

# Disk model in PEPA

## Disk

$$\begin{aligned} \textit{Working} &\stackrel{\textit{def}}{=} (\textit{read}, r).\textit{Working} \\ &+ (\textit{write}, w).\textit{Working} \\ &+ (\textit{fail}, f).\textit{Failed} \\ \textit{Failed} &\stackrel{\textit{def}}{=} (\textit{correct}, c).\textit{Working} \end{aligned}$$

- ▶ We have  $W$  working disks  
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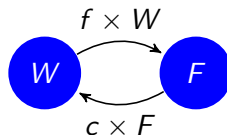
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$$\begin{aligned} dW/dt &= -f \times W + c \times F \\ dF/dt &= f \times W - c \times F \end{aligned}$$

# Conclusions

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The shift to the collective dynamic view supports analysis of very large systems.

Nevertheless there are significant challenges ahead as **ubiquitous systems** become a reality.

# Acknowledgements

## Stochastic process algebra group and collaborators at Edinburgh

Allan Clark, Jie Ding, Adam Duguid, Vashti Galpin, Stephen Gilmore, Maria Luisa Guerriero, Jane Hillston, Michael Smith, Mirco Tribastone.

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