

# A Neural Network Scheduler for Packet Switches

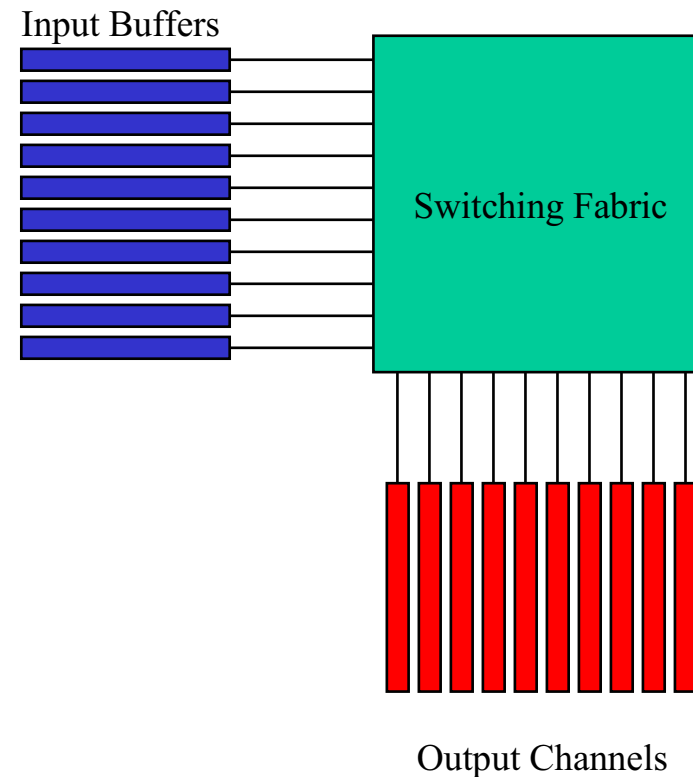
R.P.Webb\*, A.J.Waddie, K.J.Symington,  
M.R.Taghizadeh and J.F.Snowdon

Heriot-Watt University, Edinburgh, EH14 4AS,  
Scotland

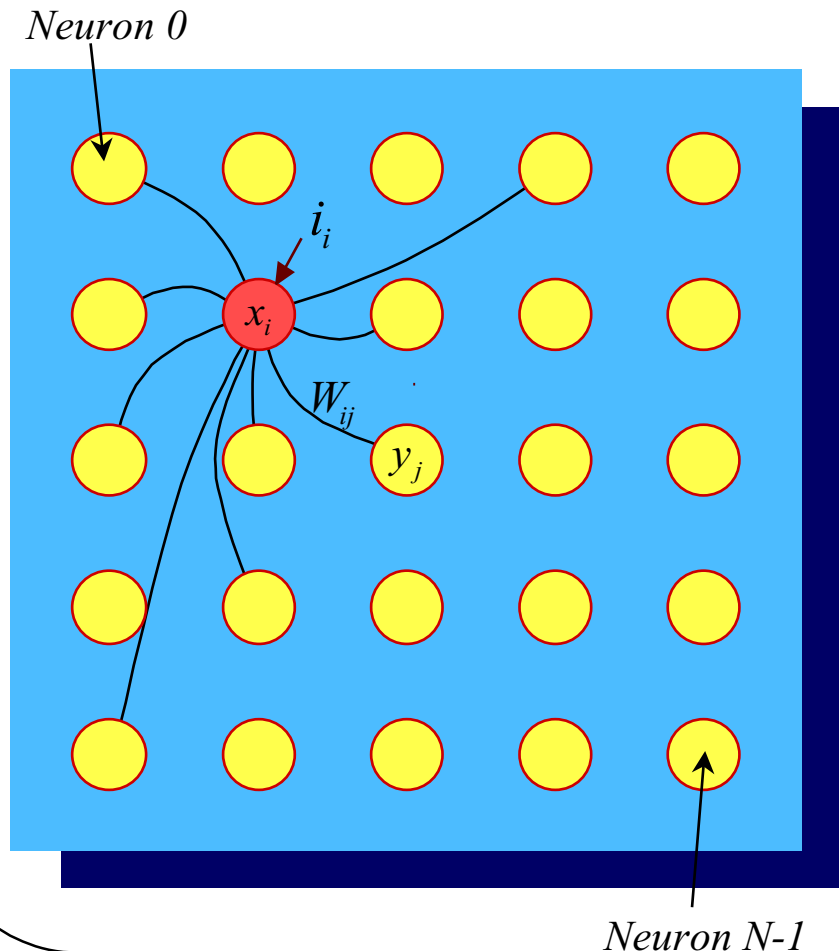
\* BT Laboratories, Martlesham Heath, Ipswich,  
IP5 3RE, UK

# The Resource Allocation Problem.

- Telecommunications routers require optimised throughput.
- Optimising throughput is a computationally non-trivial problem.
- Resource allocation problems map naturally to the high parallelism of neural networks.
- Interconnection between neurons is the limiting factor in the practical implementation of a neural switch controller.

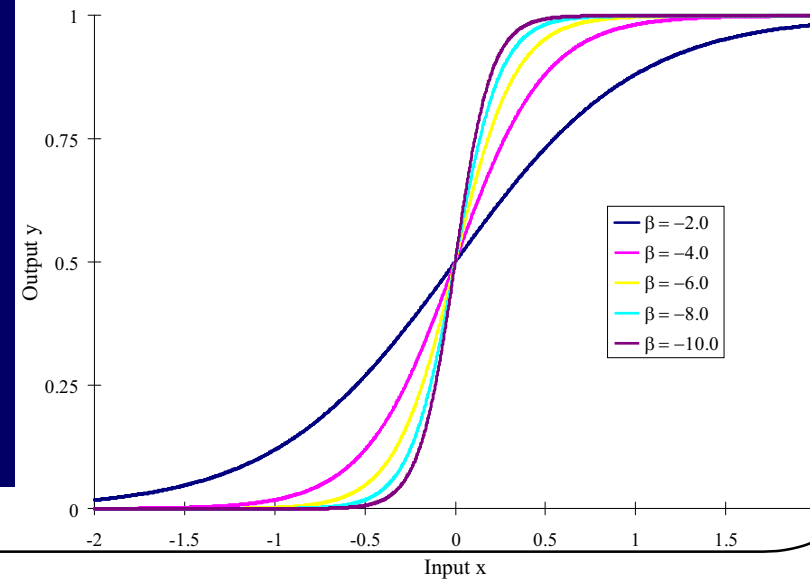


# The Hopfield Neural Network

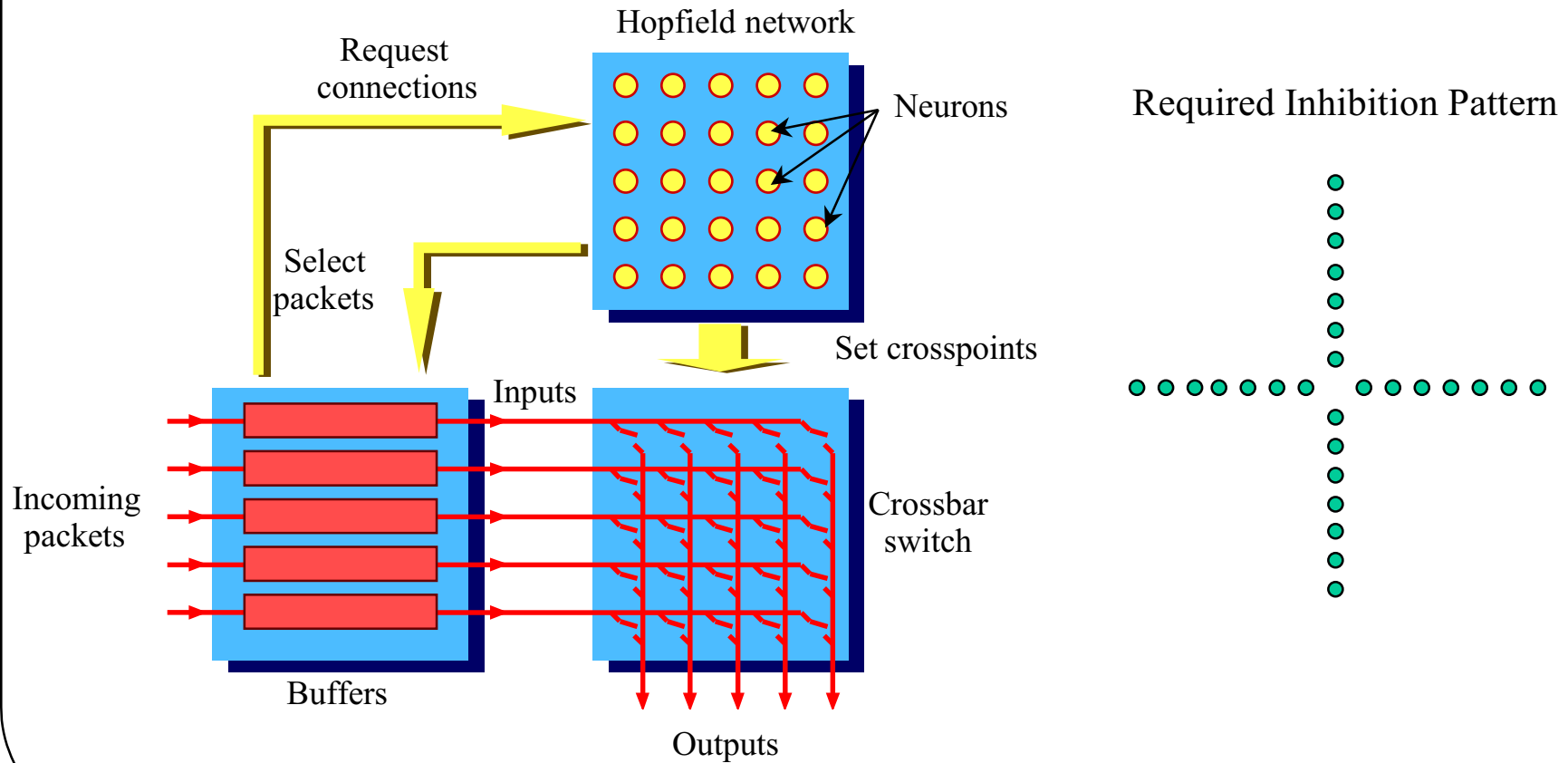


$$\frac{dx_i}{dt} = i_i \left( -\lambda x_i - \sum_{j=0}^{N-1} W_{ij} y_j + c_2 t_i \right)$$

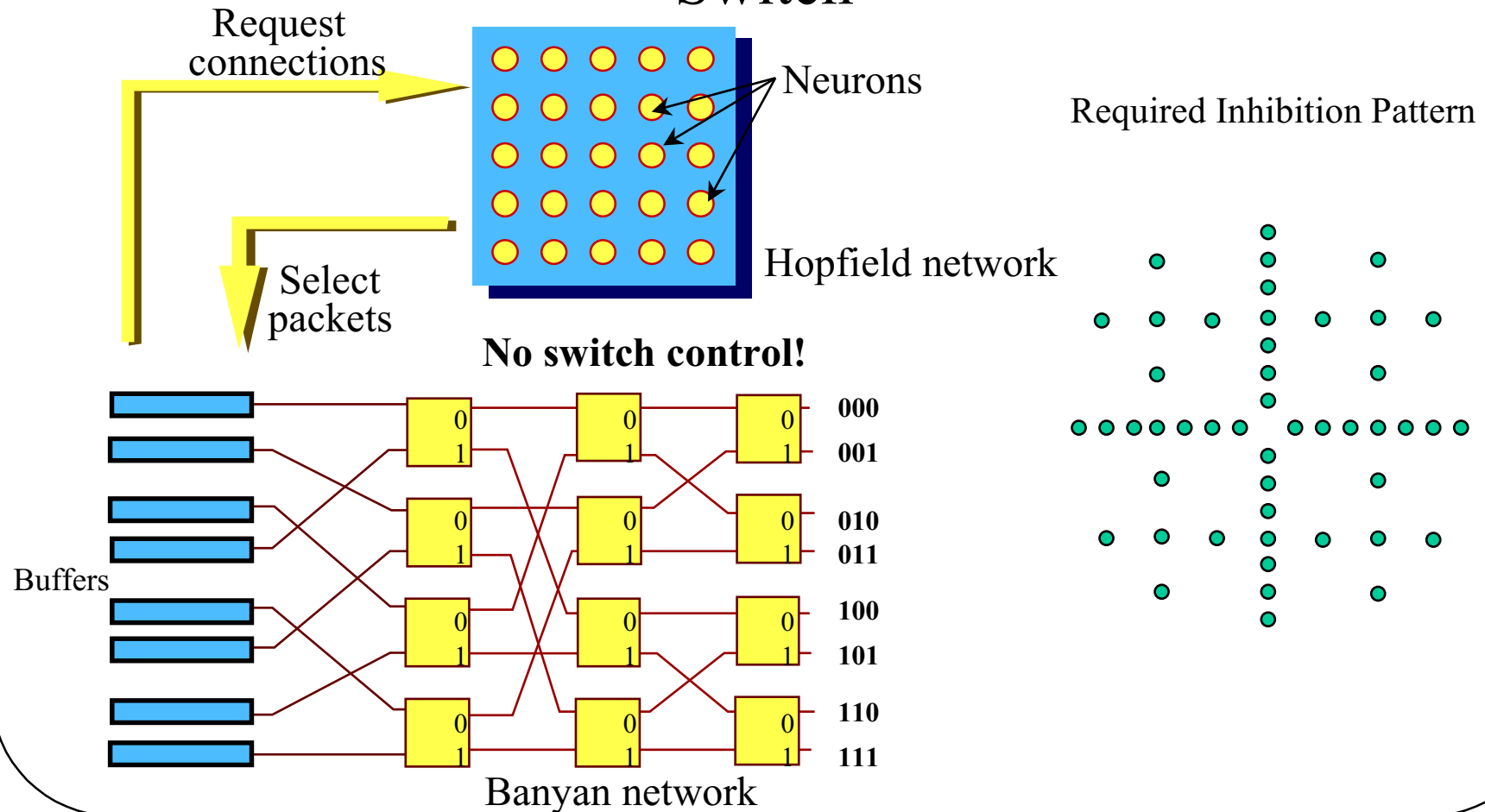
$$y(x) = O_{\min} + \frac{O_{\max} - O_{\min}}{1 + \exp(\beta x)}$$



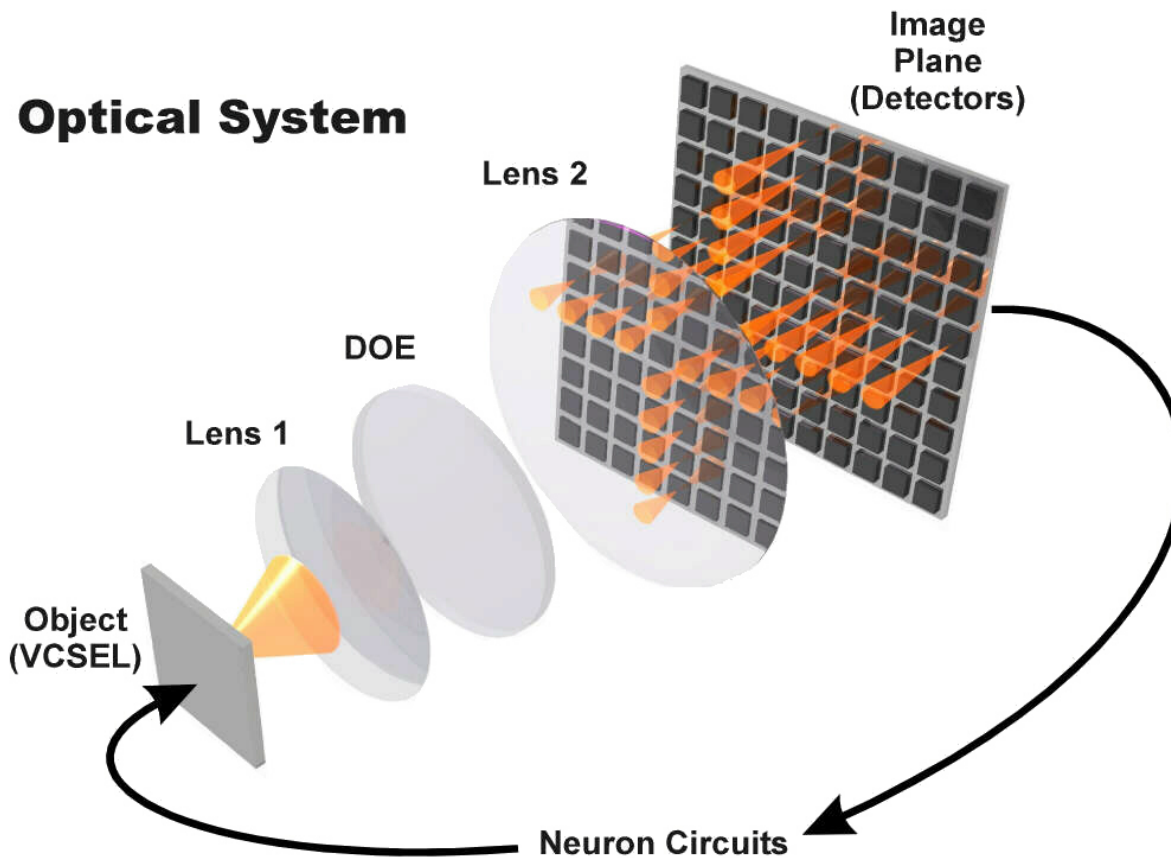
# Hopfield Network Controller for Crossbar Switch



# Hopfield Network Controller for Self-Routing Switch

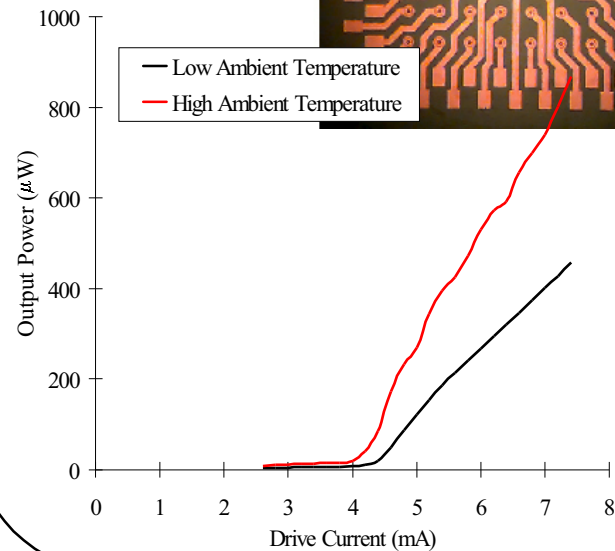
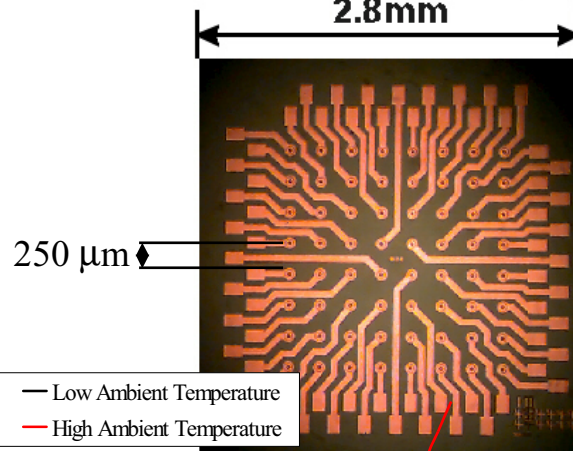


# Optical Implementation of a Hopfield Neural Network



# Optoelectronic Hardware

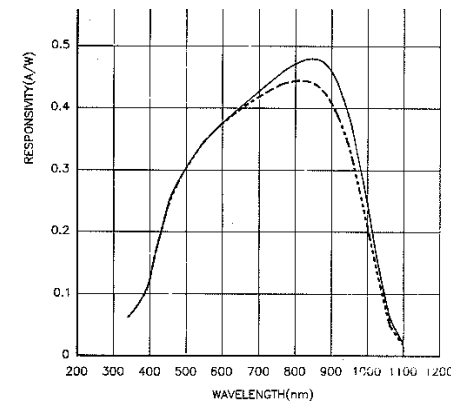
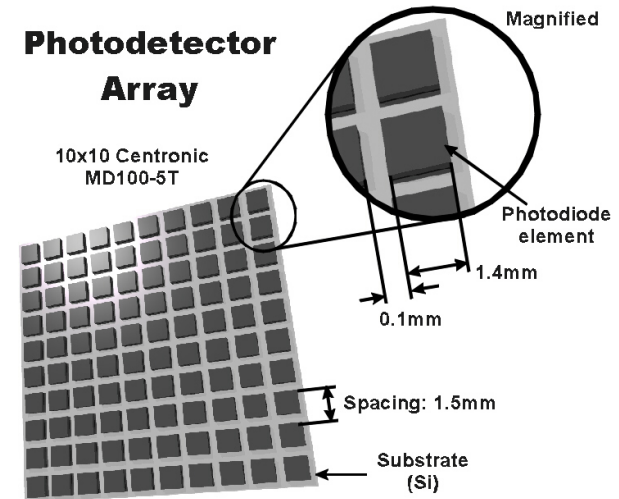
VCSEL array photograph  
2.8mm



## Typical switching times

VCSEL - 1-10 ns  
Photodetector - ~30ns

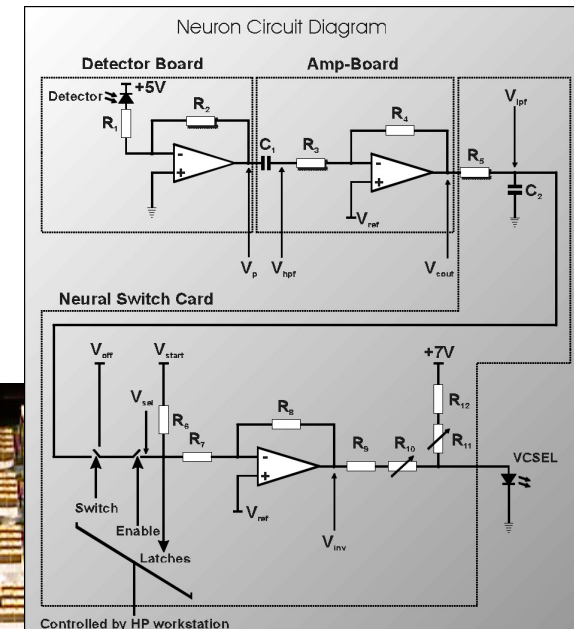
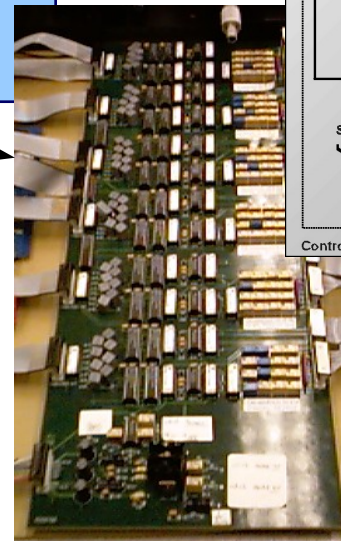
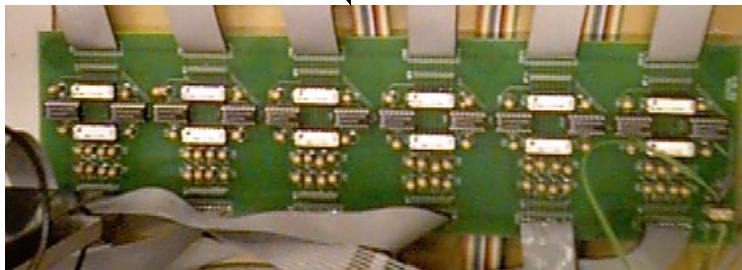
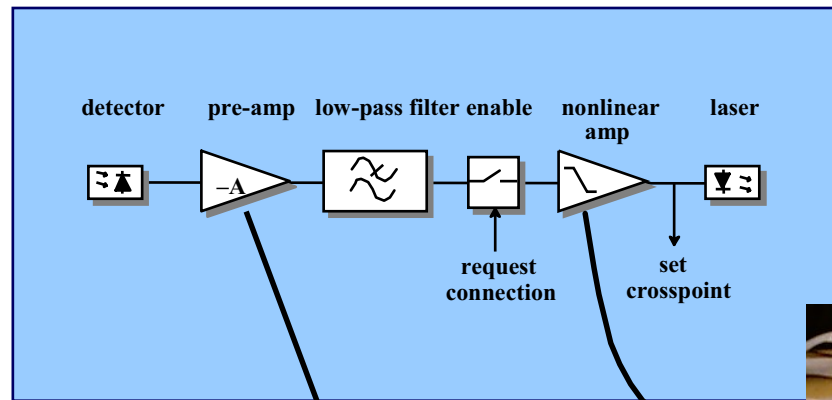
Photodetector  
Array



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# Electronic Hardware

## Neural Feedback Circuit



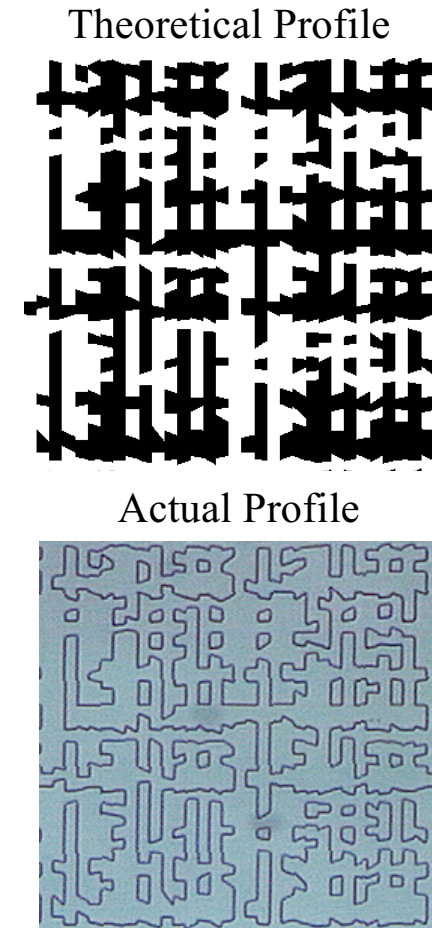
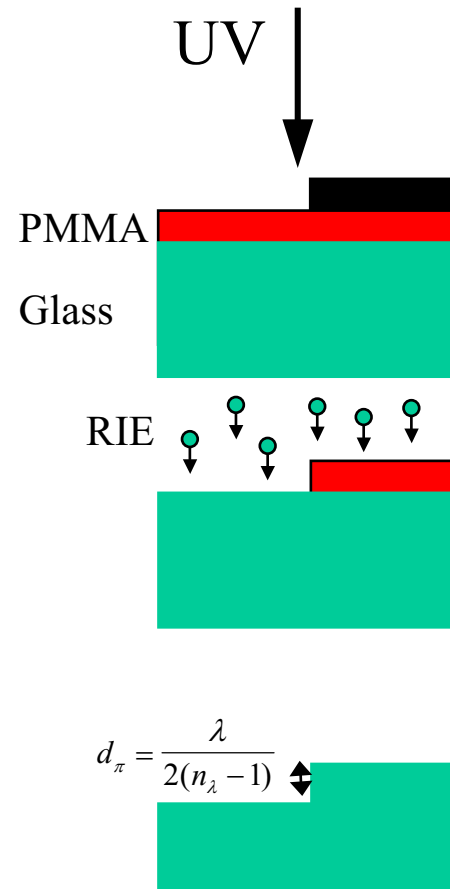
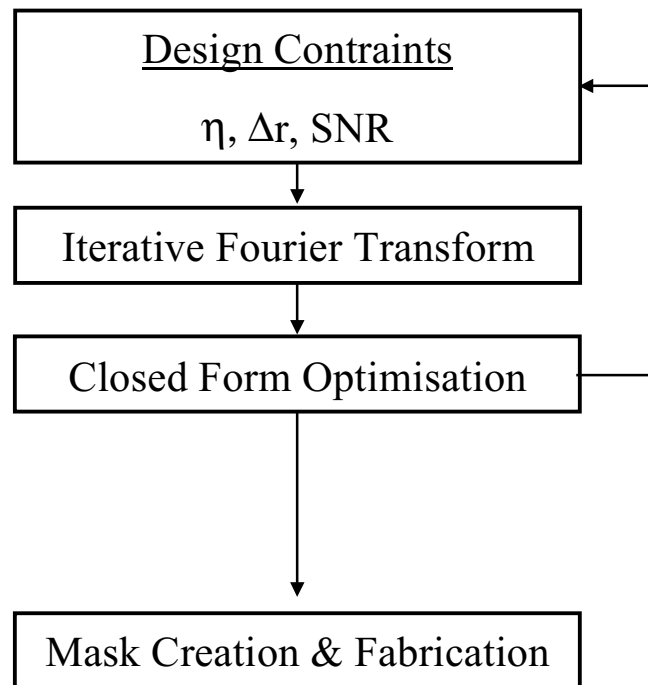
Neuron switching is governed by the time constant of the electronic circuits. This circuit switches in  $\sim 200\mu\text{s}$ .



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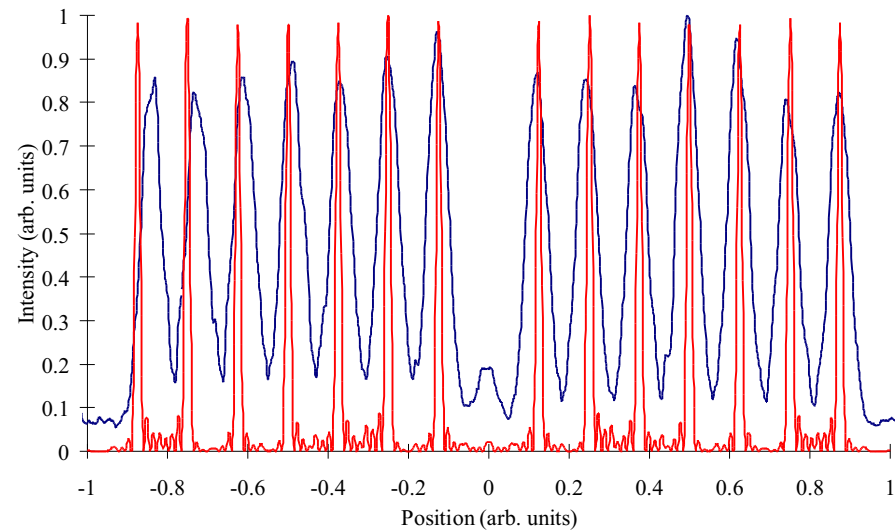
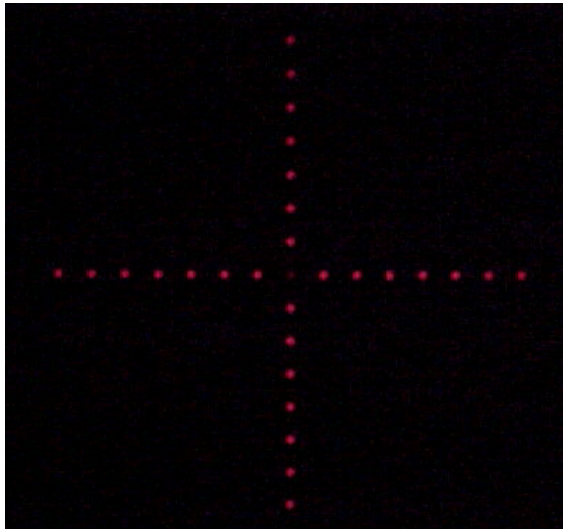


# DOE Optimisation and Fabrication



# Diffractive Optical Elements

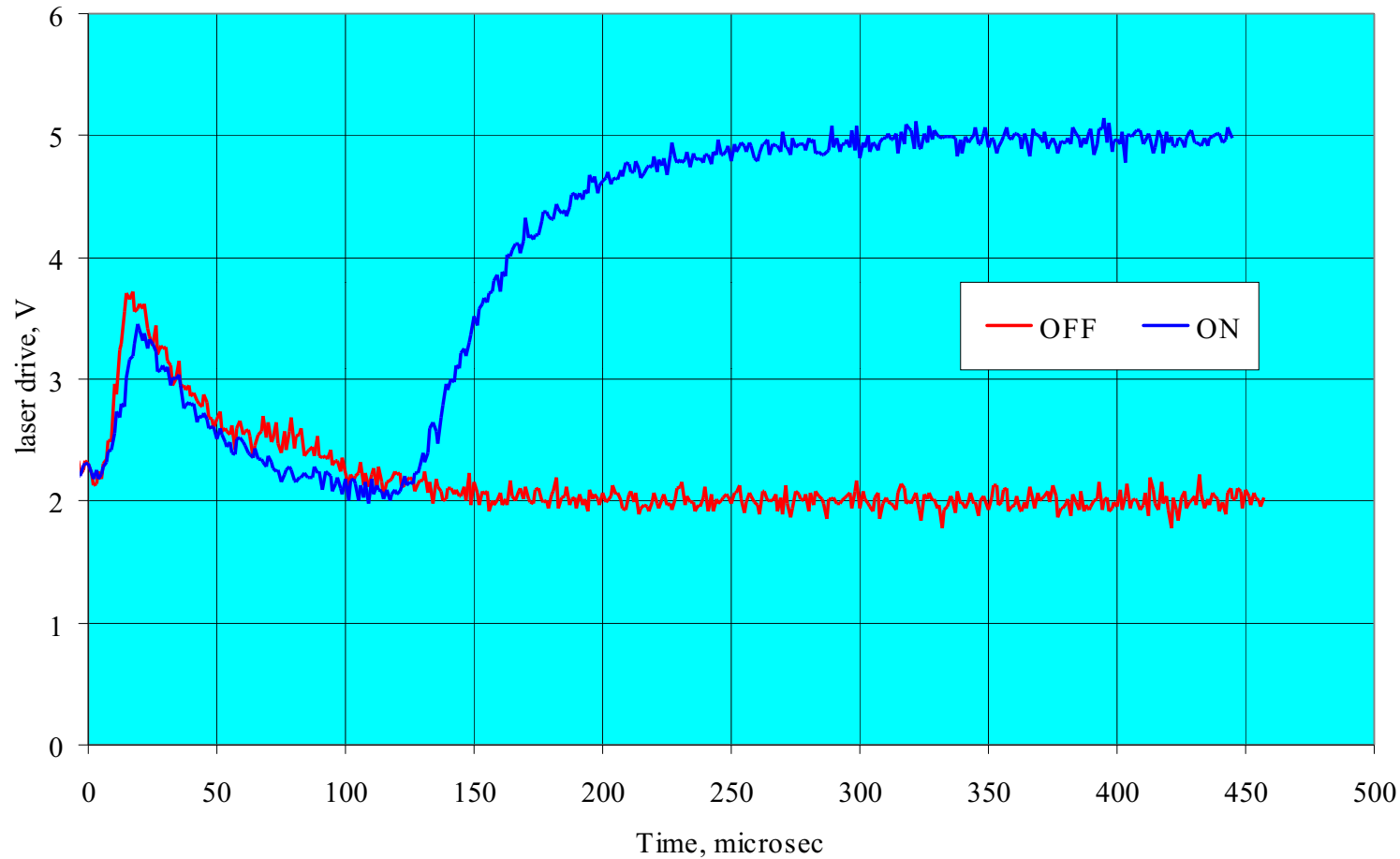
Element for Crossbar  
Switch Controller



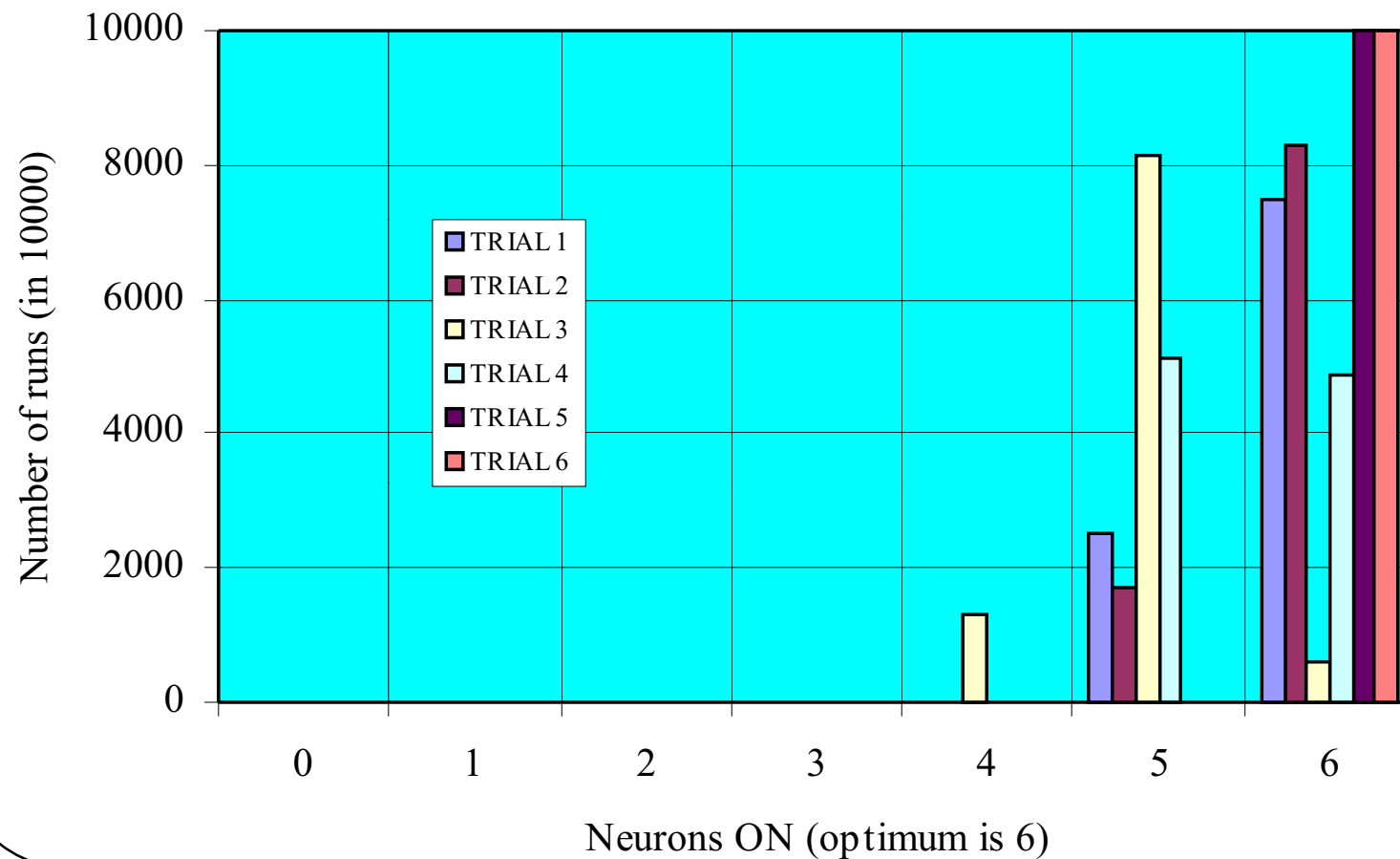
$$\text{Order separation, } s = \frac{f\lambda}{T}$$



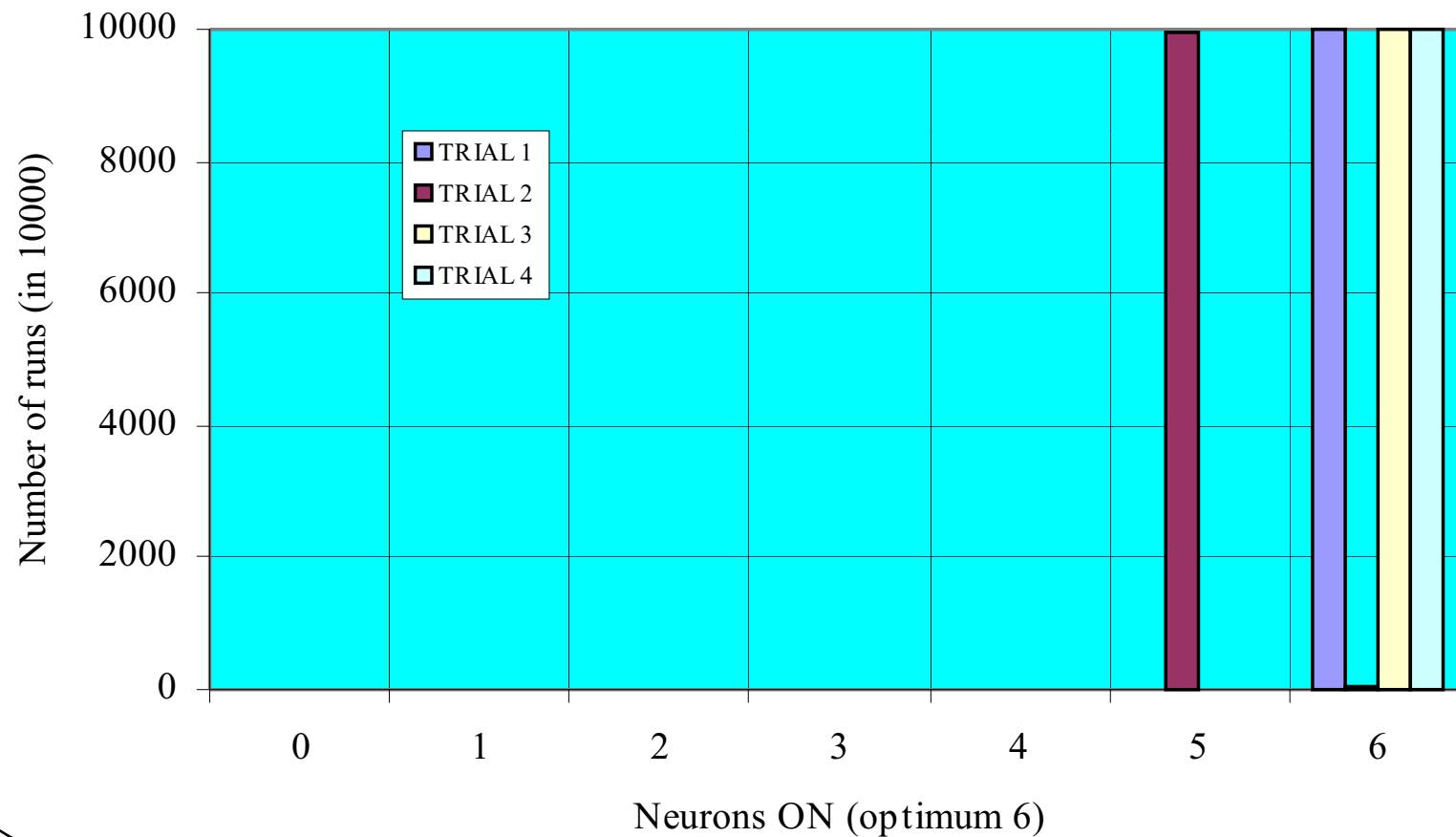
## Results from Hopfield Network Controller : Neuron Switching



## Results from Hopfield Network Controller Crossbar Switch

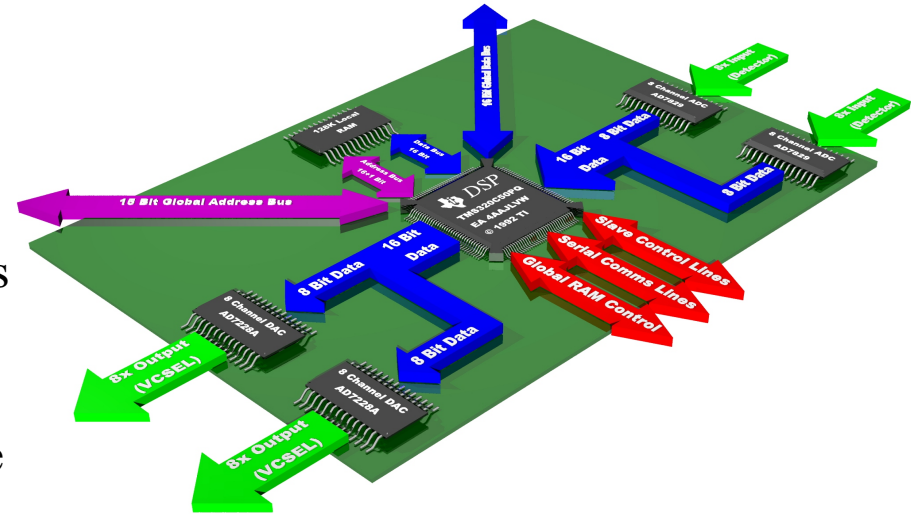


## Results from Hopfield Network Controller Self-Routing Switch



# The Next Generation Hopfield Demonstrator.

- The current demonstrator is physically large, slow and intolerant to variations in operating parameters.
- A faster, more tolerant demonstrator based around programmable DSP chips is being designed at Heriot-Watt.
- The DSP chips combined with higher efficiency VCSELs driven by analogue ASICs will reduce the overall size of the demonstrator.
- DSP programmability allows neuron response to be varied and system behaviour altered, e.g. prioritisation.



## Conclusions

- Hopfield neural networks are an efficient method of optimising the throughput through a switching fabric.
- Diffractive Optics provide the necessary non-local interconnect bandwidth to implement a usefully large network.
- The decision speed of an optically interconnected Hopfield network is primarily controlled by the RC constant of the electronics, the optoelectronic conversion times being negligible.
- The next generation Hopfield network demonstrator will use high-speed DSP chips to provide programmable neuron responses.