



# Accurate Approximate Computation --- an example

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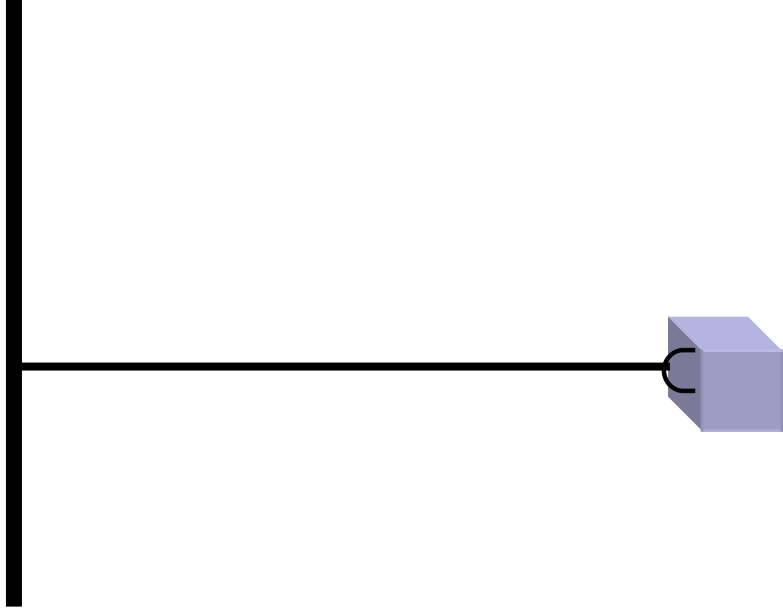
# motivations behind AAC

- binary *correct/incorrect* basis for computation→efficiency but brittleness
- logical basis promises possibility of provable correctness→practicalities seriously undermine this promise
- undesirable alternative to *correct* can be difficult to identify

# in pictures

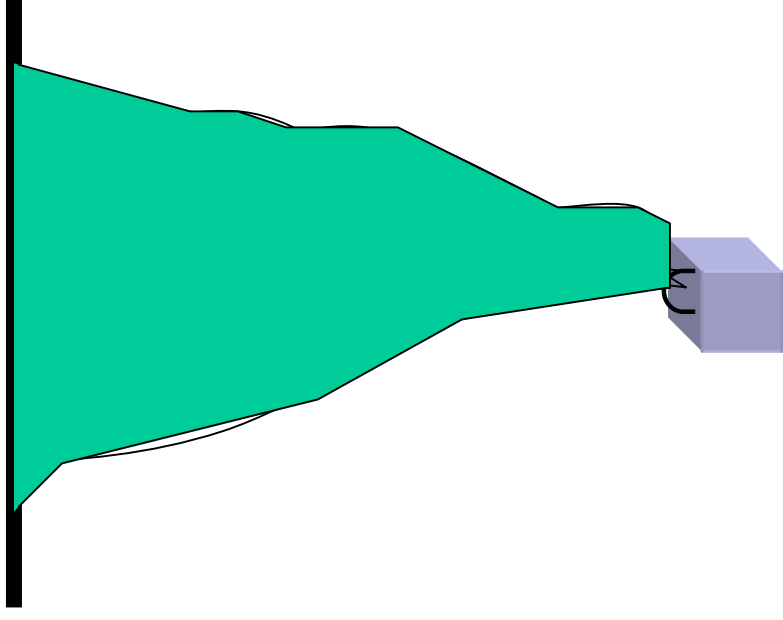
(thus saving thousands of words)

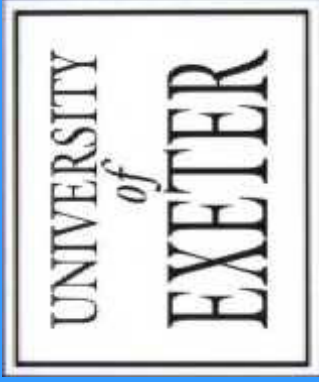
elegant, but fragile  
precision



`messy', but robust

**accurate** approximation





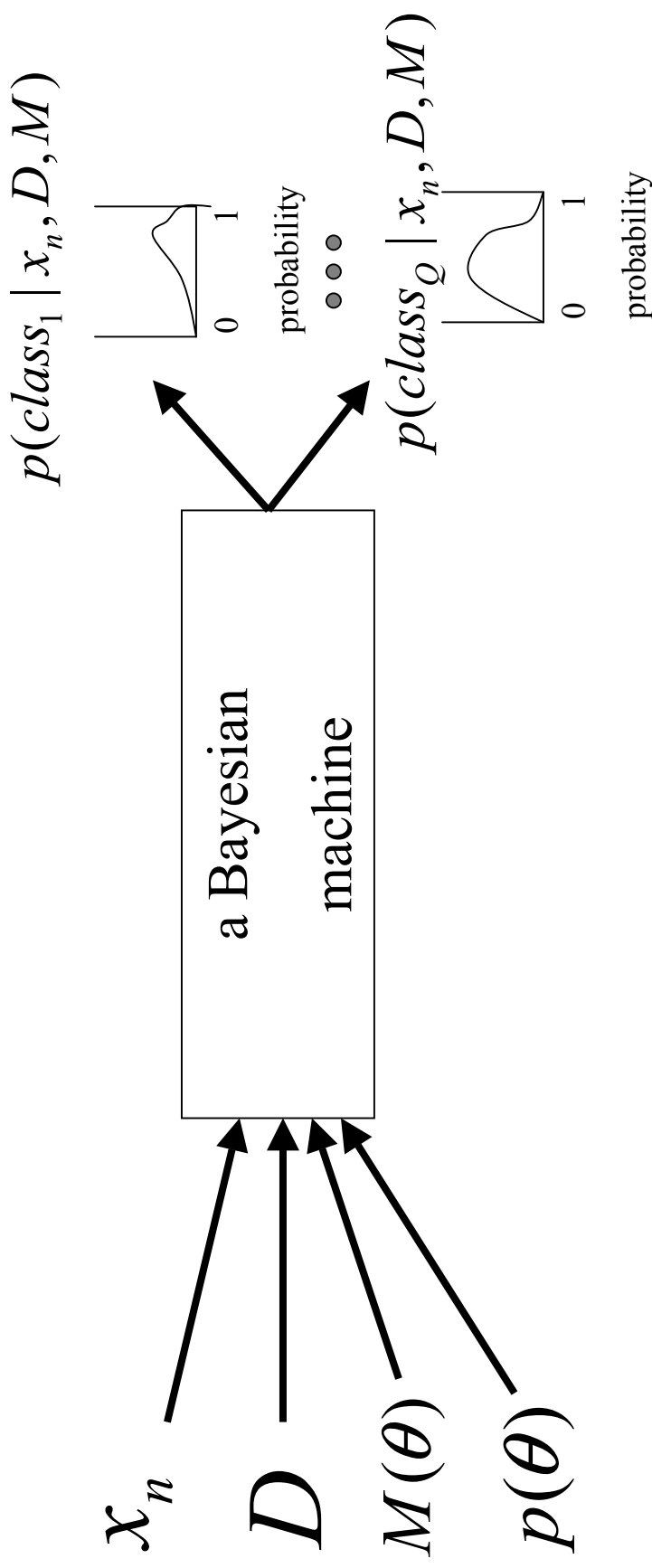
# a science of ACCURATE APPROXIMATION COMPUTATION

basic quantities not discrete values but probability densities

coherent strategy for combining probabilistic components (e.g. Bayes)

results not *correct/incorrect* but accurately approximate accuracy from massive sampling not verification statistics rather than formal logic

# an example:



the classification of a feature vector  $x_n$

$Q$  possible classes

## Simulation on a classical Turing machine

$$p(\theta \mid D, M) = \frac{p(D \mid \theta, M) p(\theta \mid M)}{p(D \mid M)}$$

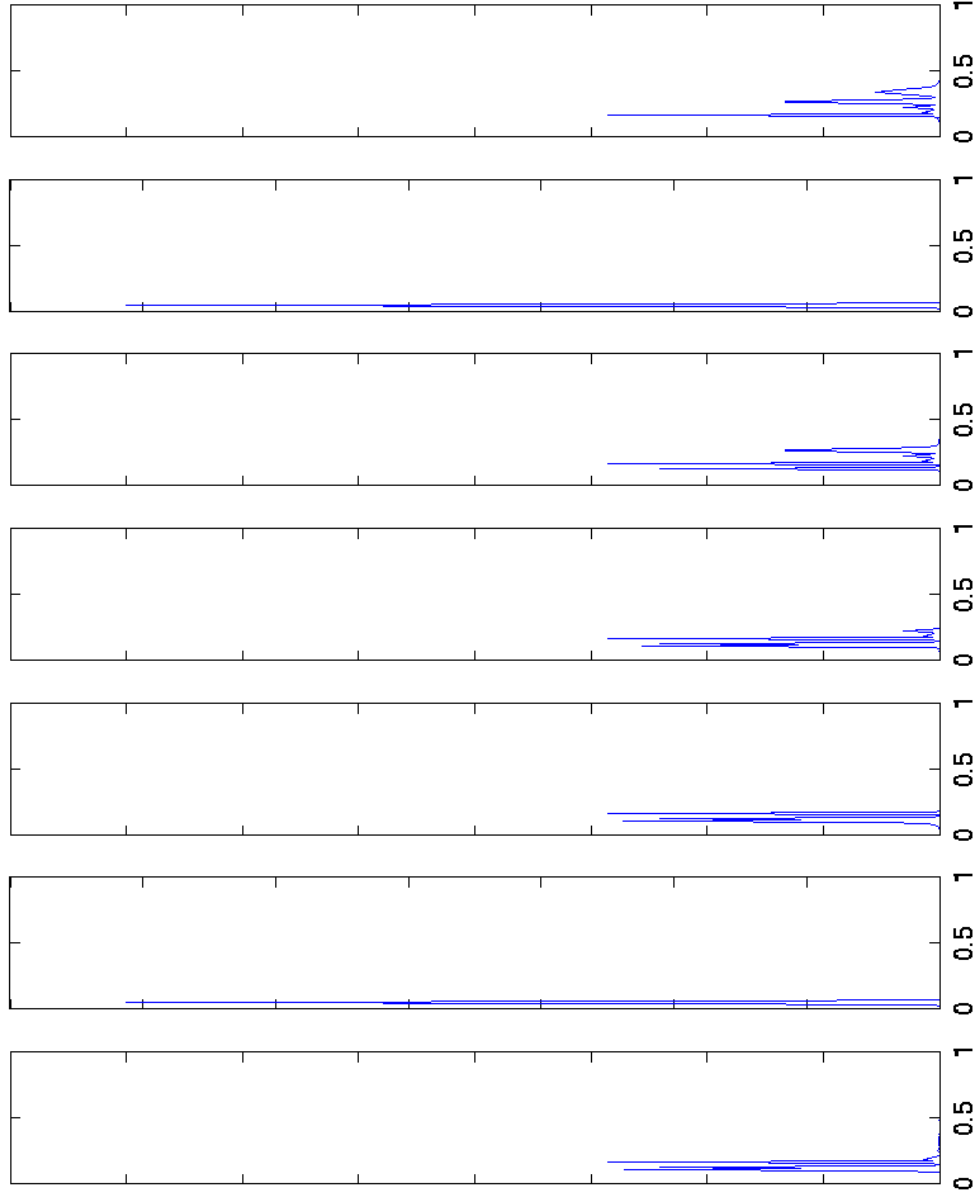
$$p(y \mid x, D, M) = \int p(y \mid x, \theta, M) p(\theta \mid D, M) d\theta$$

using MCMC methods we can draw samples  $\theta^i$  from  $p(\theta \mid D, M)$

$$p(y \mid x, D, M) \approx \frac{1}{N} \sum_{i=1}^N p(y \mid x, \theta^{(i)}, M)$$

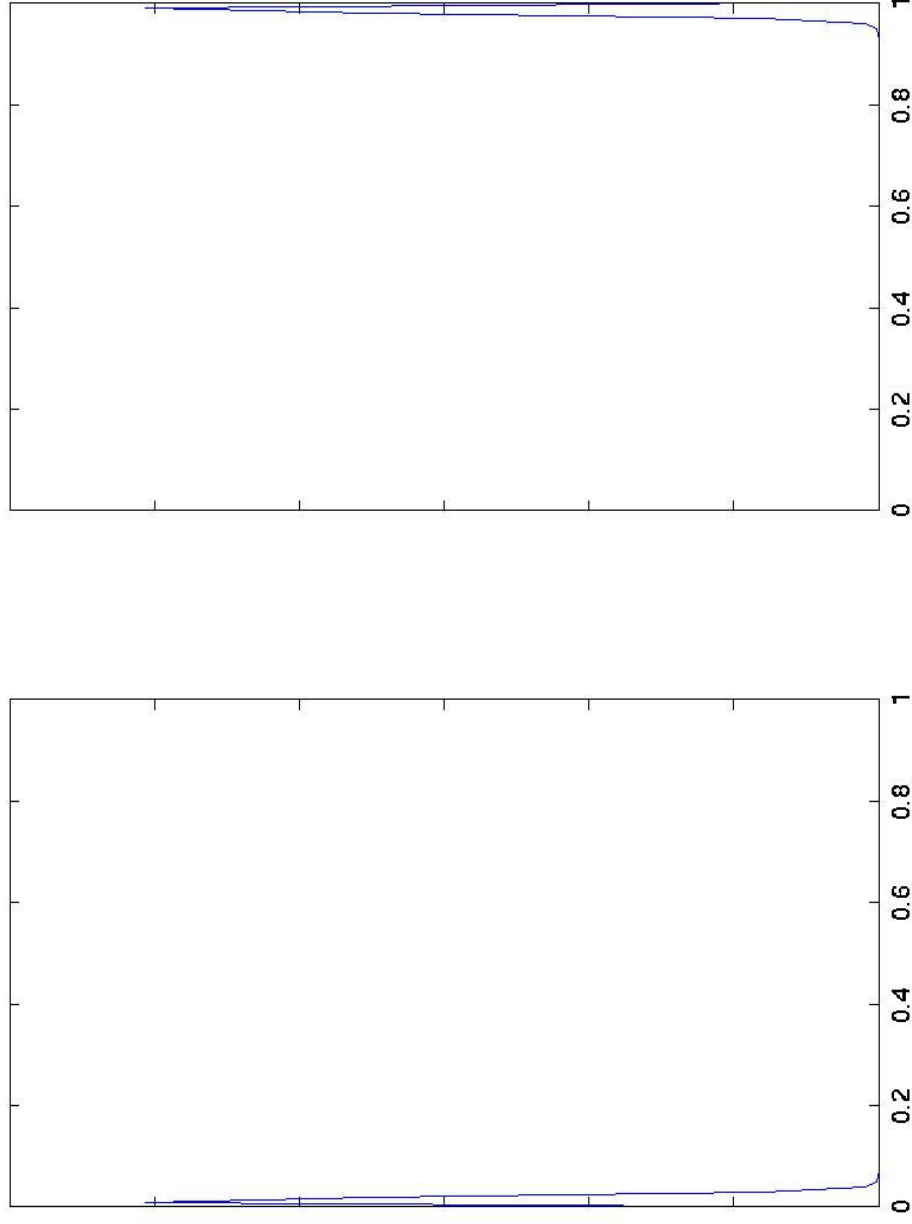
T.C.Bailey, R.M. Everson, W.J.Krzanowski, A. Hernandez, J.  
Fieldsend and V. Schetinin

## UCI ML database: Image data



estimates for each of the 7 output classes for one input vector

## UCI ML database: Wisconsin data



estimates of the 2 target classes for 1 input vector:

88.6% SURE correct & 11.4% UNSURE vs 98.3% correct



# In sum:

A Bayesian computer is ONE concrete example of Accurate Approximate Computation, and benefits of a ‘soft’ continuous classification are obvious

But there is a cost in the computational effort of integration, or is there?

## **Grand Challenge?**

Create a science of AAC in the abstract;

Find/Construct an AAC ‘machine’

meanwhile we work on extending and improving efficiency of our simulations of AAC examples in classical environment