

# Innate concepts as specialized programs?

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Cornell workshop on grammar induction  
Commentary on Noah Goodman's talk  
'Concept learning as probabilistic program induction'  
May 16, 2010

# Marr

I represent knowledge in (probabilistic) programming languages for human communication and machine execution.

- ▶ Separate what from how
- ▶ Reconcile generality with specialization

## Question

How to base algorithmic accounts of human performance on Noah's computational models?

- ▶ Initial hypothesis: Church's general inference
- ▶ Eventual hypotheses: hand-coded special inference

## Complaint

Why not discard Church model eventually?  
Especially if special inference is approximate...

## Suggestion

Custom code generation—compile model into inference!

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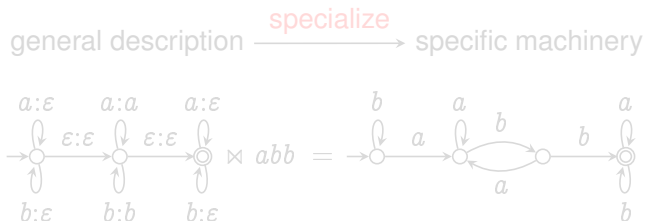
# Parnas

'Domain-general', 'language-specific' are properties of modules.

**A module is a part of a description of a system.**

- ▶ Modularity should be invariant under physically entangled emulation with dye pack.
- ▶ Modularity makes a theory more concise, comprehensible.

Organizing principle: reuse in the face of change

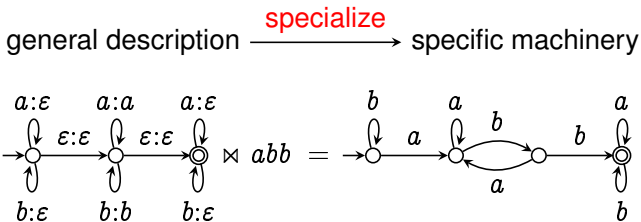


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Computation:  $\lambda x. x^{10}$

Algorithm:  $\lambda x. ((x^2)^2 \times x)^2$

Algorithm generator: ' $\lambda x. g(10)$  where  $g(1) = 'x'$   
 $g(2n) = g(n)^2$   
 $g(2n+1) = g(2n) \times x$ '

# Summary

**A module is a part of a **description** of a system.**

general description  $\xrightarrow{\text{specialize}}$  specific machinery

'Compile time' includes evolution.