

# Representations

# Models of Computation

- Thue systems
  - Post systems
- Lambda calculi
- Partial recursion
- Turing machines
- Markov normal algorithms
- Minsky counter machines
- Type 0 languages
- Kolmogorov-Uspenskii machines
- Neuring machines
- Wang machines
- Random access machines
- Quantum computers
- Billiard ball computers
- Fortran, Algol, Lisp, C, Pascal, Logo, Ada, Java, ...

# Today

- Multihead, multitape, multidimension Turing machines
- Counter machines
  - 1, 2, 3, many
- Recursive functions
  - Primitive recursion
  - Minimization

# Everyone says...

"The remarkable result about these varied models is that all of them define exactly the same class of computable functions: whatever one model can compute, all the others can too!"

— Bernard Moret

# Numbers as Strings

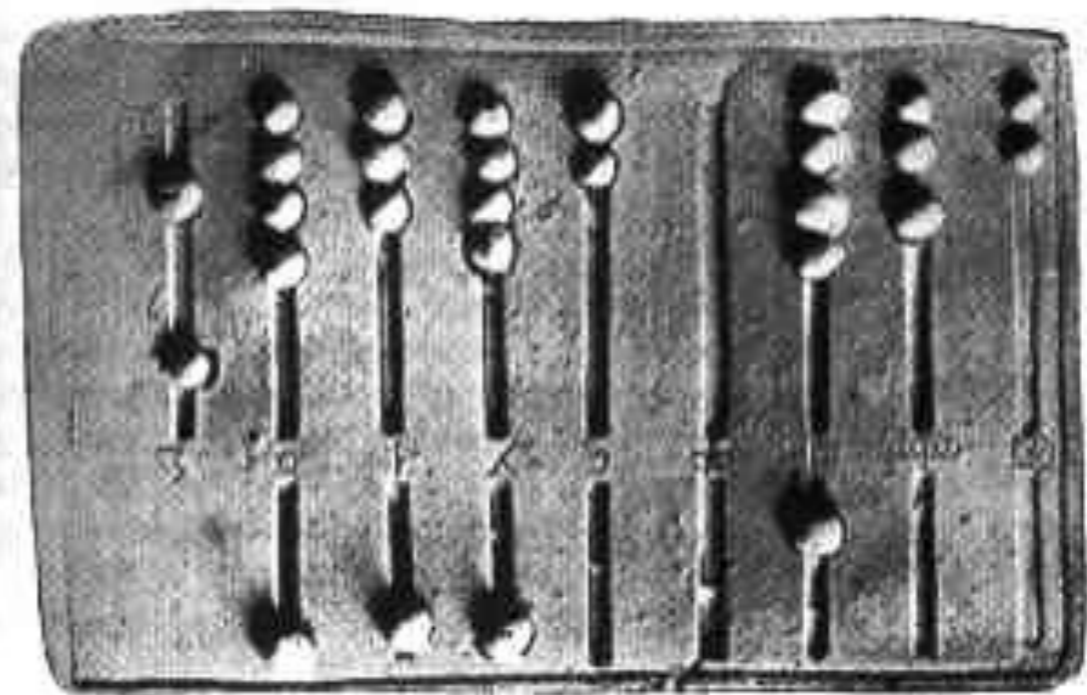
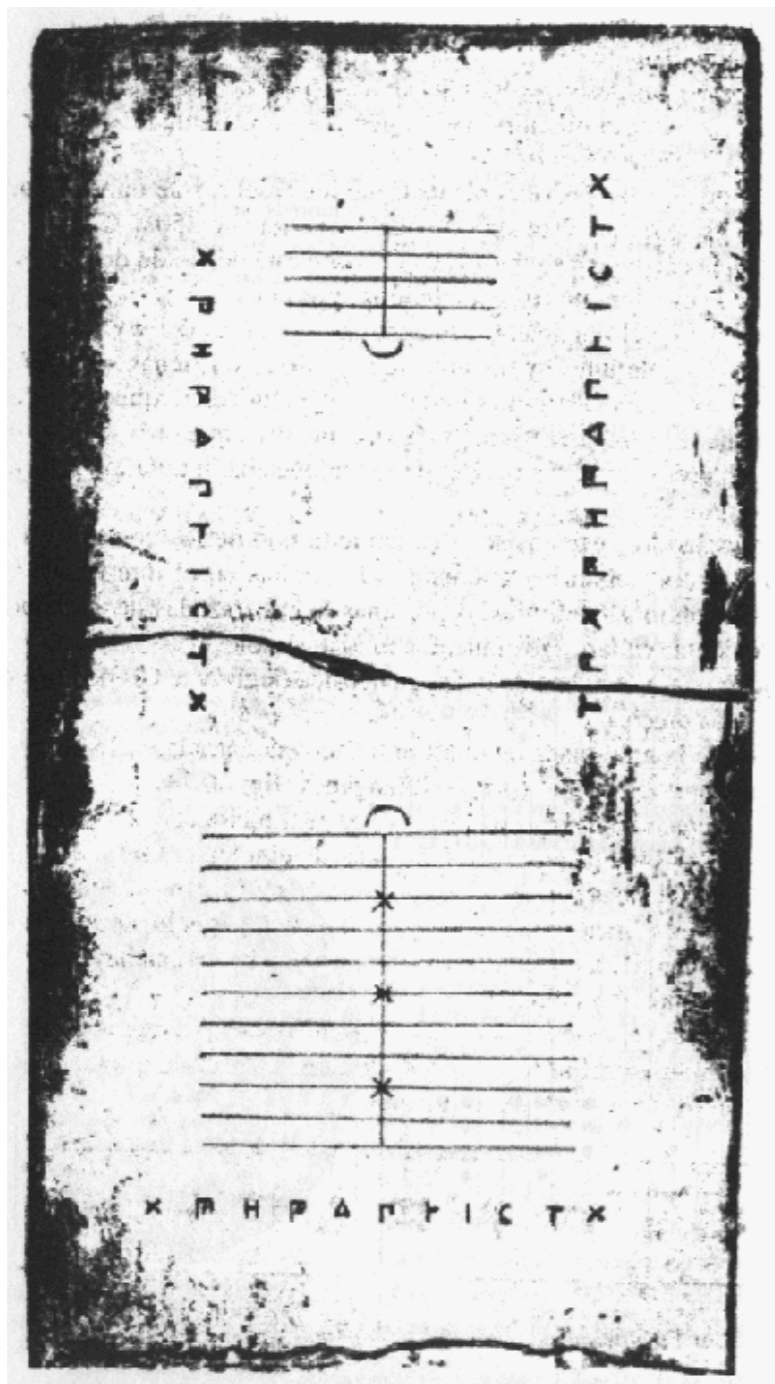
- Decimal
- Binary
- Unary (tally)
- 4 bits per decimal digit

# Strings as Numbers

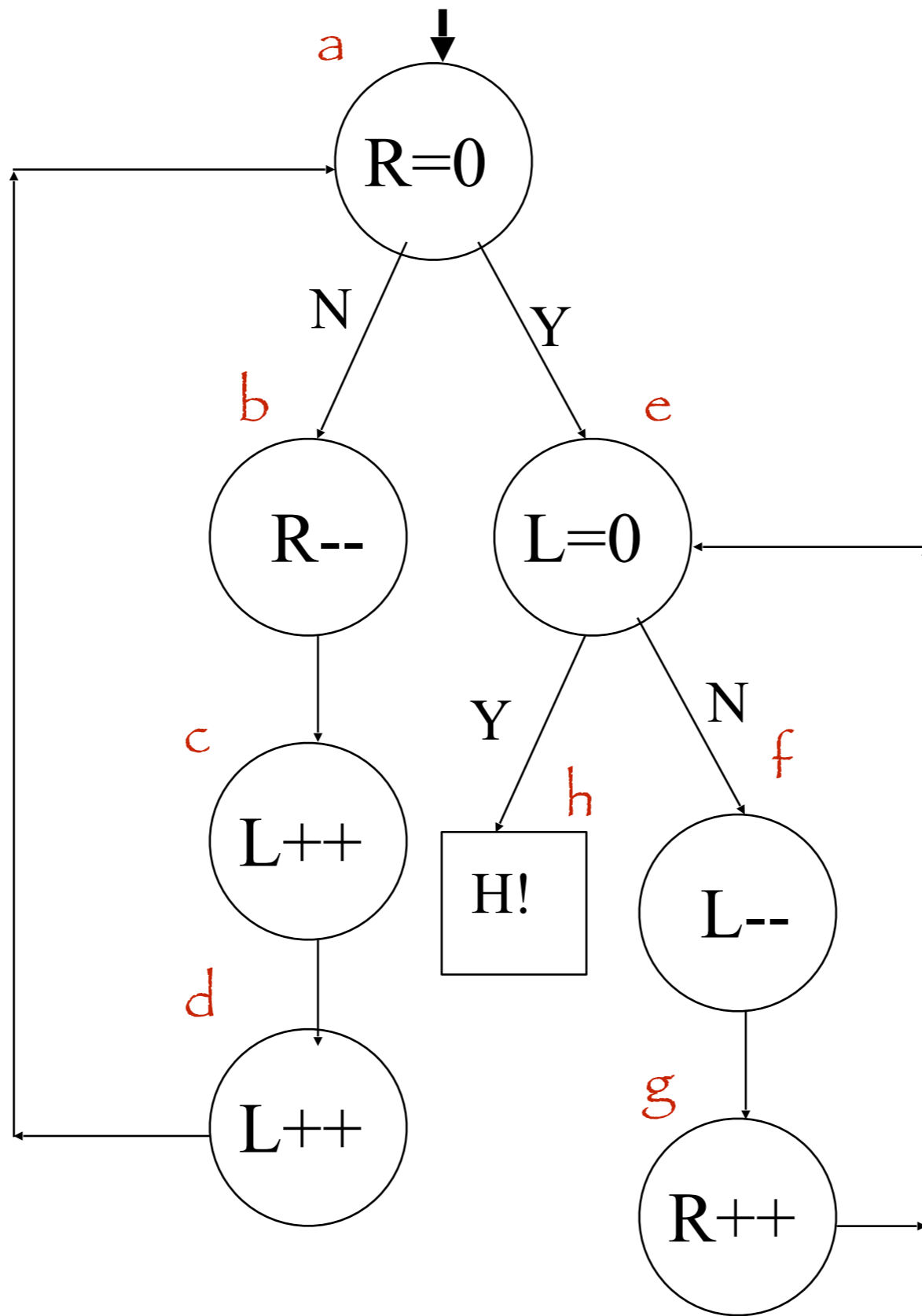
- Base  $|\Sigma|$
- Gödel number
- List of numbers

# Counter Machine

- Worry beads
- Rosaries
- Brolní [Russia]
- Komboloí (κομπολογια) [Greece]
- Mala [India]
- Jyuzu [Japan]
- מחרוזות תפילה
- מסבחה







# Counter Machines

- Restrict (multitape) TM
  - Alphabet: 0 1 \_
  - Tape always:  $01^*_*$
  - Reading/writing at end
    - Change first \_ (blank) to 1
    - Change last 1 to \_
    - Test for 0

# Counter Machine

- 1 counter: very weak (exercise)
- 2 counters: medium
  - Can't compute square or exponential
  - Can compute everything
    - if  $n$  is represented by  $2^n$  1's
- 3 or more: Everything

# Primitive Recursion

- 0
- successor +1
- projections
- composition
- $f(x,n) := \text{if } n=0 \text{ then } g(x) \text{ else } h(f(x,n-1),x,n-1)$

# Ackermann's Function

- $A(0,n) = n+1$
- $A(m+1,0) = A(m,1)$
- $A(m+1,n+1) = A(m,A(m+1,n))$

# Lemma: $A(m,n) > m+n$

- Induction on  $(m,n)$ 
  - $A(0,n) = n+1 > n$
  - $A(m+1,0) = A(m,1) > m+1$
  - $A(m+1,n+1) = A(m,A(m+1,n)) > m+A(m+1,n) \geq m+n+2$

Lemma:  $x > y \Rightarrow A(m, x) > A(m, y)$

- Induction on  $(m, x)$
- Assume  $x > y$ 
  - $A(0, x) = x + 1 > y + 1 = A(0, y)$
  - Is  $A(m+1, x+1) > A(m+1, y+1)$  ?
  - By induction,  $A(m+1, x) > A(m+1, y)$
  - $A(m+1, x+1) = A(m, A(m+1, x)) > A(m, A(m+1, y)) = A(m+1, y+1)$

Lemma:  $x > y \Rightarrow A(x, n) > A(y, n)$

- Induction on  $(x, n)$
- Assume  $x > y$ 
  - $A(x+1, 0) = A(x, 1) > A(y, 1) = A(y+1, 0)$
  - $A(x, n) > x+n \geq n+1 = A(0, n)$
  - $A(x+1, n+1) = A(x, A(x+1, n)) > A(y, A(x+1, n)) > A(y, A(y+1, n)) = A(y+1, n+1)$



Lemma:  $A(m+n+2,x) > A(m,A(n,x))$

- Induction  $(m+n,x)$ 
  - $A(n+2,x) > A(n+1,x) \geq A(n,x)+1 = A(0,A(n,x))$
  - $A(m+n+2,0) = A(m+n+1,1) > A(m,A(n-1,1)) = A(m,A(n,0))$
  - $A(m+n+2,x+1) = A(m+n+1,A(n+m+2,x)) > A(m,A(n,A(m,x))) > A(m,A(n,x+m)) \geq A(m,A(n,x+1))$

# A isn't Primitive Recursive

- Denote  $x = x_1, \dots, x_k$  and  $x_m = \max x_j$
- Say  $A_i > g$  [majorize] if  $A(i, x_m) > g(x)$  for all  $x$
- Easy:  $A_0 > 0$ ;  $A_1 > +1$ ;  $A_0 > \text{proj}_i$
- Suppose  $f(x) = h(g_1x, \dots, g_kx)$ ,  $A_s > g_1, \dots, g_k, h$ 
  - $A_{2s+2} > f$ :  $A(2s+2, x) > A(s, A(s, x)) > A(s, \max\{g_jx\}) > h(g_1x, \dots, g_kx)$

# A isn't Primitive Recursive

- Suppose  $A_s > g, h$  and  
 $f(x, n) = \text{if } n=0 \text{ then } g(x) \text{ else } h(f(x, n-1), x, n-1)$
- $A(r, n+x_m) > f(x, n)$ ,  $r = 2s+1$ , by induction on  $n$ :
  - $f(x, 0) = g(x) < A(s, x_m) < A(r, 0+x_m)$
  - $f(x, n+1) = h(f(x, n), x, n) < A(s, \max\{f(x, n), n, x_m\}) < A(s, A(r, n+x_m)) < A(2s, A(r, n+x_m)) = A(r, n+1+x_m)$
- $f(x, n) < A(r, n+x_m) < A(r, 2N+3) = A(r, A(2, N)) < A(r+4, N)$   
where  $N = \max\{n, x_m\}$

# General Recursion

- Also minimization
  - $f(x) := \min n \text{ s.t. } h(x,n)=0$ 
    - where  $h$  is (primitive) recursive
- Can loop

# Questions

- In what sense are
  - Turing machines =
  - Lambda calculus =
  - Recursive functions ?
- In what sense are
  - Analogue computers >
  - Turing machines >
  - Primitive recursion ?

# Alonzo Church



The fact... that two such widely different (and in the opinion of the author) equally natural definitions of effective calculability turn out to be **equivalent** adds to the strength of the reasons adduced below for believing that they constitute as general a characterization of this notion as is consistent with the usual intuitive understanding of it.

# Princeton Course

- "The definition of a Turing machine is very robust."
  - Multiple heads
  - Multiple tapes
  - Multiple states
  - Multiple directions
  - Multiple dimensions
  - Multiple worlds

# Equivalence of Models

- $TM_2 \propto TM$  [ 1 tape; 2 channels ]
- $CM_2 \propto TM_2$  [ 111...1BBB... ]
- $CM_n \propto CM_2$  [  $2^i 3^j 5^k 7^l \dots$  ]
- $RAM \propto CM_n$  [  $2^x(2y+1)$  ]
- $Scheme \propto RAM$  [ Abelson & Sussman ]
- $TM \propto Scheme$  [ Interpreter ]



# Goal

Determine when one model is **as** powerful as another.

- **Intensional** (ignore complexity)
- Models operating over different domains

# Subrecursive Models

- Primitive recursion
  - Multiple recursion
- Typed lambda calculi
- Finite state automata
  - Nondeterministic FSA
- Pushdown automata
  - Deterministic PDA
- Nerve nets
- Linear-bounded automata
- Single-counter machines
- BLoop
- Univac, Burroughs, IBM 1130, PDP-11, Mac, Pentium IV, Connection Machine, ...

# Super-recursive Models

- Oracle machines
- Trial and error predicates
  - Limit recursive functions
- Real recursive functions
- Inductive Turing machines
- Abstract state machines
- Analog recurrent neural networks

# Containment

$B \approx_c A$  if  $B = A$

for every  $f \in A$  there is a  $g \in B$  s.t.  $g = f$ , and vice-versa

$B >_c A$  if  $B \supset A$

for every  $f \in A$  there is a  $g \in B$  s.t.  $g = f$ , but not vice-versa

# Examples: Containment

- Primitive recursion is weaker than general recursion.
- Recursion is stronger than iteration.
- To show that [Inductive Turing machines] are more powerful [than ordinary TMs], we need to find a problem solvable by an ITM and insolvable by a TM ..... —Mark Burgin

# Hartley Rogers Jr.

“Given a class of nonnumerical inputs and outputs, choose some fixed one-one mapping from this class into the integers. Such a standard mapping is called a **coding**.”



# Rogers

- The use of codings raises an immediate question of invariance.
- Once a coding is chosen, will the formal concept **partial recursive function on code numbers** correspond to the informal notion **algorithmic mapping on the uncoded expressions?** ...  
Church's thesis provides an affirmative answer.

# Simulation

$B \cong_S A$  if

there's an injective mapping

$\rho: \text{dom } A \rightarrow \text{dom } B$

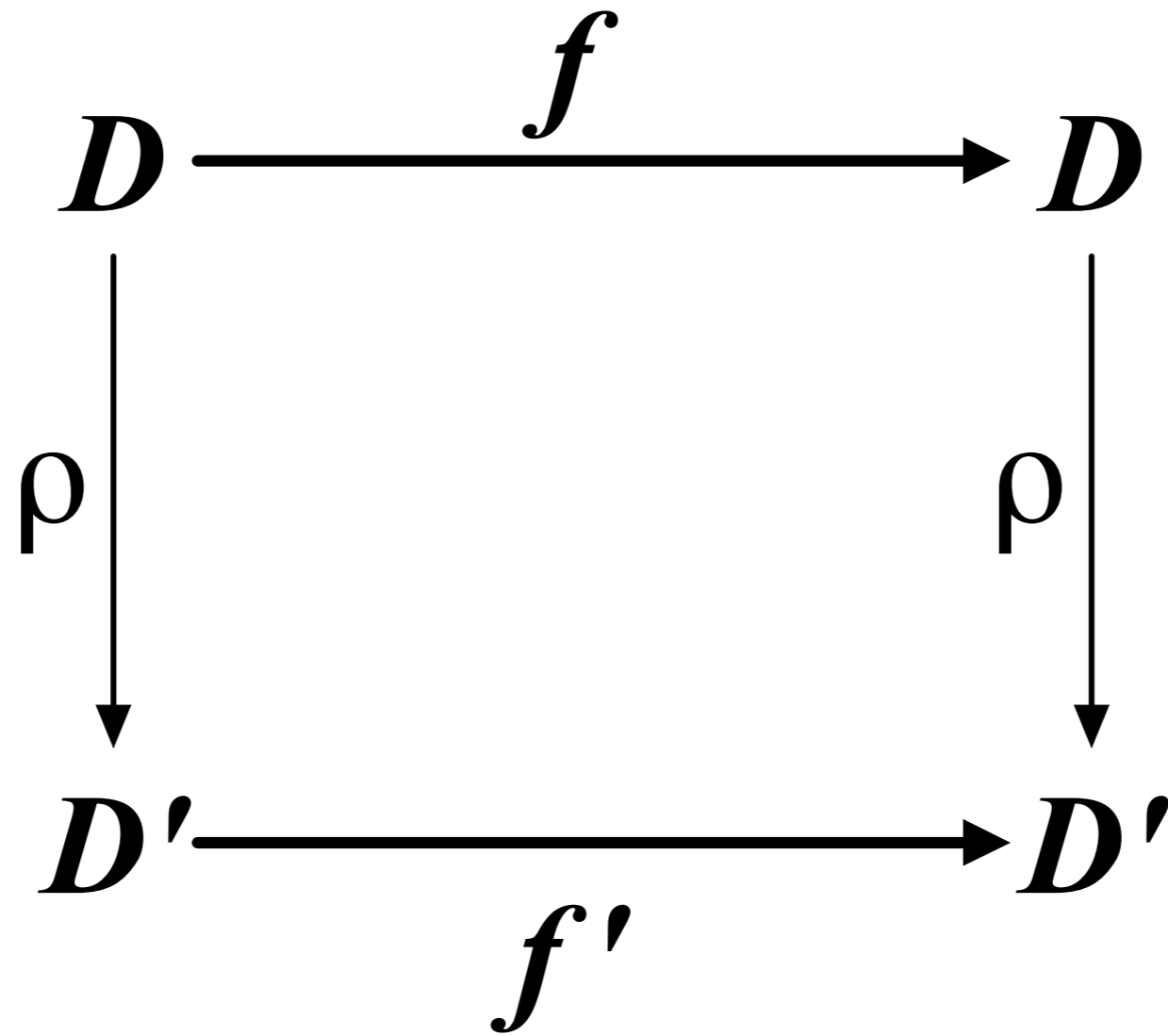
s.t. for every  $f \in A$

there's a  $g \in B$

for which  $g(\rho(x)) = \rho(f(x))$  for all  $x$



# Simulations



$f'$  simulates  $f$  via injection  $\rho$

# Examples: Simulation

- $TM \approx_S Rec \approx_S \lambda$

- $\rho: \mathbf{N} \rightarrow \{1, B\}^*$  [Tally numbers]
- $\rho: \mathbf{N} \rightarrow \Lambda$  [Church numerals]
- $\rho: \Lambda \rightarrow \mathbf{N}$  [Gödel numbering]

# Problems...

1. Information can be hidden in a mapping
  - even uncomputable information
2. Different mappings can have opposite effects
3. The three methods are incompatible

# Strictly Stronger

- $\geq_s$  is a quasi-ordering

(reflexive & transitive)

- $A >_s B$  if  $A \geq_\rho B$ , via injection  $\rho$ ,  
but  $B \not\geq_\tau A$  via any  $\tau$

# The Coding

- Let  $s$  be successor

and  $s'$  simulate it:  $s'\rho = \rho s$

- $\rho$  is recursive is  $s'$  is:
  - $\rho(0) = \text{constant}$
  - $\rho(n+1) = \rho(s(n)) = s'(\rho(n))$
- If  $s$  is primitive recursive, so is  $\rho$

# Rec $\not\geq_s$ Prim

- Suppose  $\text{Prim} \geq_\rho \text{Rec}$ 
  - $\rho \in \text{Prim}$
- Consider  $h(n) = \rho(\min_i \{ \rho(i) > \text{ack}(n,n) \})$ 
  - $\rho^{-1} h \in \text{Rec}$
  - $\rho \rho^{-1} h = k \rho$  for some  $k \in \text{Prim}$
  - $h = k \rho \in \text{Prim}$
- But it isn't

# Rec is Maximal

- Suppose  $s'$  is recursive
- Then  $\rho^{-1}$  is partial-recursive (it is not always defined)
- For any  $f \in M$ 
  - Since  $f = \rho^{-1}g\rho$ ,  $f \in \text{Part-Rec}$
  - $\text{rng } g\rho = \text{rng } \rho f \subseteq \text{rng } \rho$
- Hence  $f \in \text{Rec}$