

# Source-tracking Unification\*

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# Source-tracking Unification

## What is it and why is it useful?

**Track** the results of unification or its failure in terms of the **source**, i.e., the original presentation of problem

Automatic **explanation** and **debugging**

- Type Error slicing in Functional Programs
- Debugging Logic Programs

Introduction

Example: Type Error Slicing

Framework

Example Wrap up: Program Slicing

Related Research

Future Work and Conclusions

# Different views of Solving Unification

Transforming Equations to solved form

Closure computation on Unification Graphs

Context Free Language Reachability

- Maximally Unifiable subsets [Cox, 1984]
- Systems of Logic [Le Chenadec, 1989]

# Main Ideas

Unification Graphs are Labeled Directed Graphs

- Equational Edges are labeled **epsilon**
- Projection Edges labeled by **projection symbols**  $\{f_i | f \in \Sigma, 1 \leq i \leq \text{arity}(f)\}$

Downward closure is like matching parentheses (semi-Dyck languages)

Membership in unification closure can be witnessed by semi-Dyck labeled paths (**unification paths**)

Explanations can be formulated as **proofs** in a type system

Proofs can be **encoded** as unification paths

Computation and simplification of these proofs **is easy**

# Summary of Results

**Model** for characterizing unification source-tracking as reachability via semi-Dyck labeled paths

**Type System** for unification

**Algorithm** for computing shortest proofs in  $O(V^3)$  time for fixed signature

**Integration** of proof generation with the unification algorithm

**Simplification** of proofs by elementary rewriting

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# Unfriendly Type Error messages

Standard ML of New Jersey, Version 110.0.7, September 28, 2000

```
1  $\lambda x.$   
2     if  $x$  then  
3         inc  $x$                 // inc: num  $\rightarrow$  num  
4     else  $x$ ;
```

Error: case object and rules don't agree [tycon mismatch]

rule domain:**bool**, object:**num** in expression:

```
case x of  
true => inc x  
| false => x
```

Too much information!

# Type Inference and Unification

$\lambda_0 x_1. \text{if}_2 x_3 \text{ then } @_4(\text{inc}_5 x_6) \text{ else } x_7$

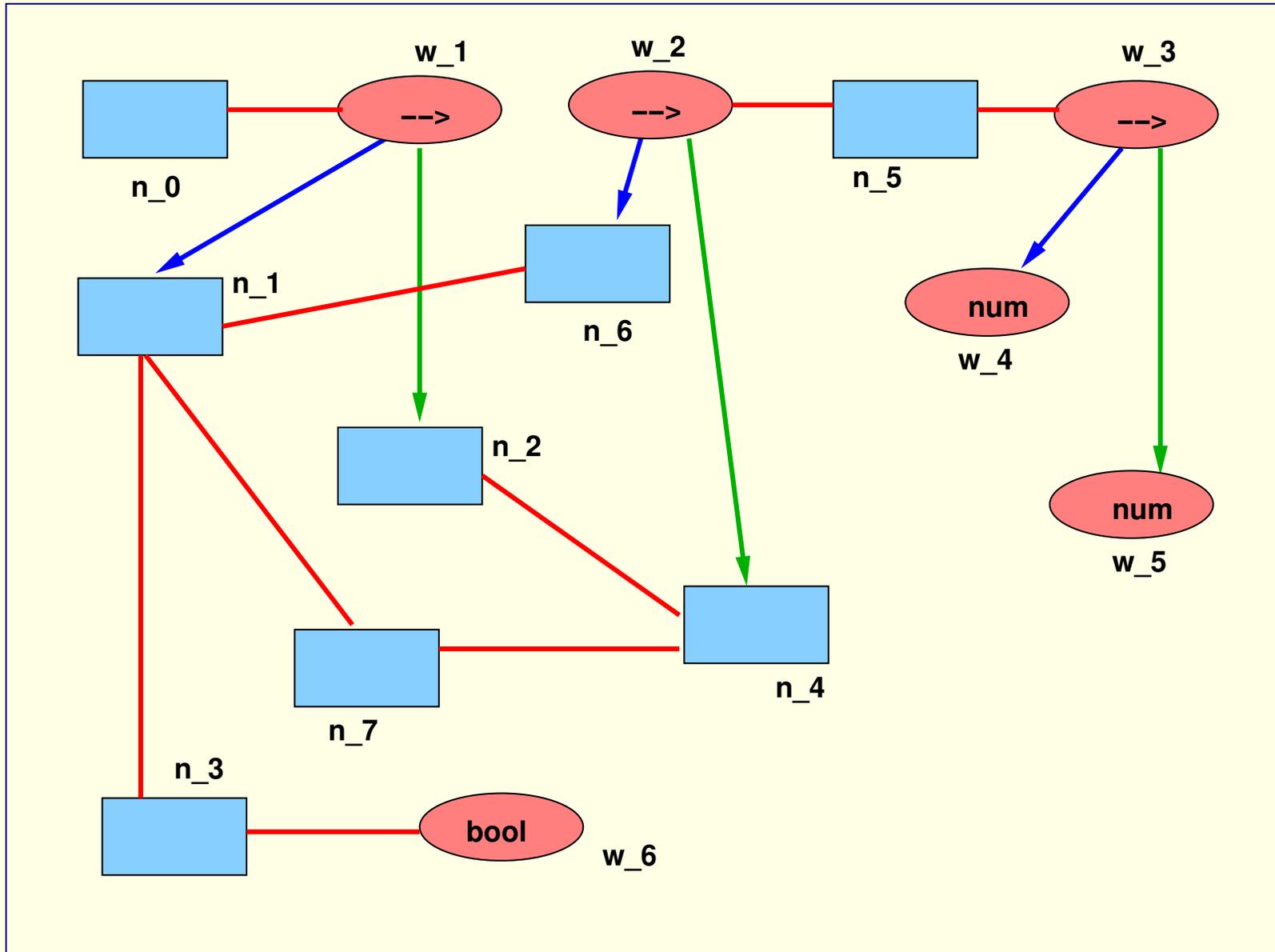
Syntax Equations  $\longrightarrow$  sets of Type Equations

$$\begin{aligned} n_0 = \lambda(n_1, n_2) &\mapsto \{n_0 \stackrel{?}{=} n_1 \rightarrow n_2\} \\ n_2 = \text{if}(n_3, n_4, n_7) &\mapsto \{n_3 \stackrel{?}{=} \text{bool}, n_2 \stackrel{?}{=} n_4, \\ &\quad n_4 \stackrel{?}{=} n_7\} \\ n_3 = \lambda\text{var}(n_1) &\mapsto \{n_3 \stackrel{?}{=} n_1\} \\ n_4 = @_4(n_5, n_6) &\mapsto \{n_5 \stackrel{?}{=} n_6 \rightarrow n_4\} \\ n_5 = \text{const}(num \rightarrow num) &\mapsto \{n_5 \stackrel{?}{=} num \rightarrow num\} \\ n_6 = \lambda\text{var}(n_1) &\mapsto \{n_6 \stackrel{?}{=} n_1\} \\ n_7 = \lambda\text{var}(n_1) &\mapsto \{n_7 \stackrel{?}{=} n_1\} \end{aligned}$$

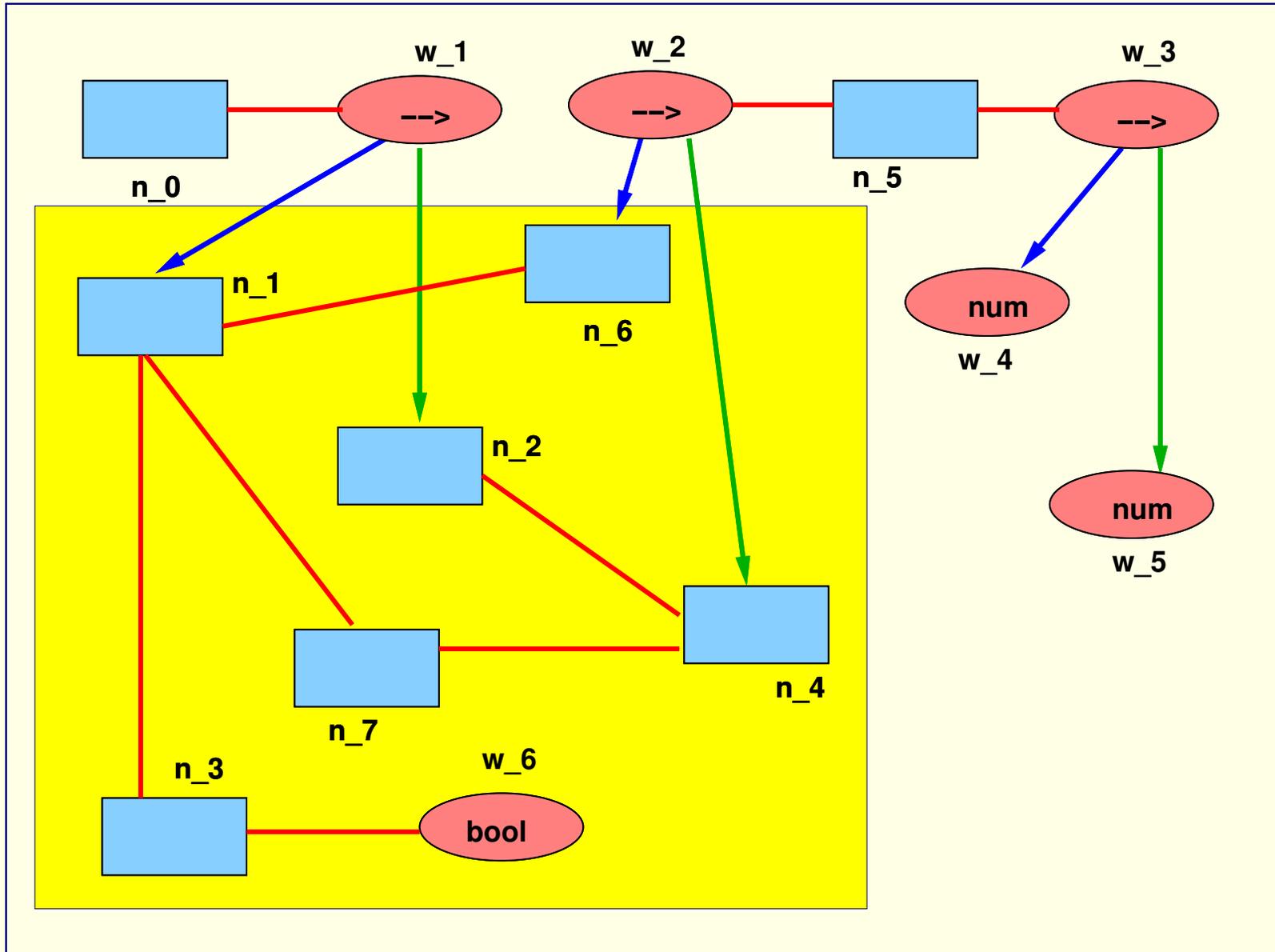


# Computing Unification Closure

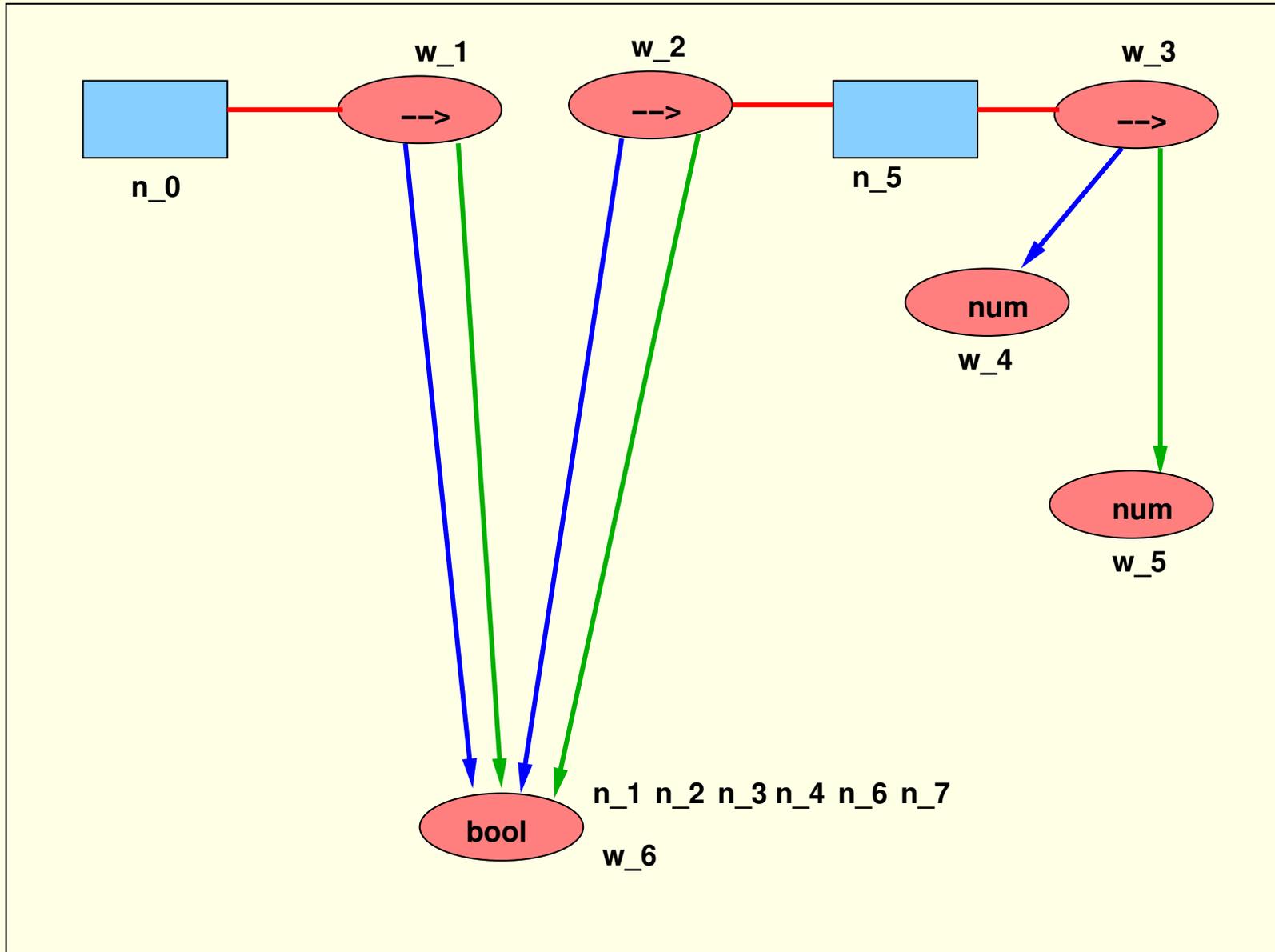
# Computing Unification Closure



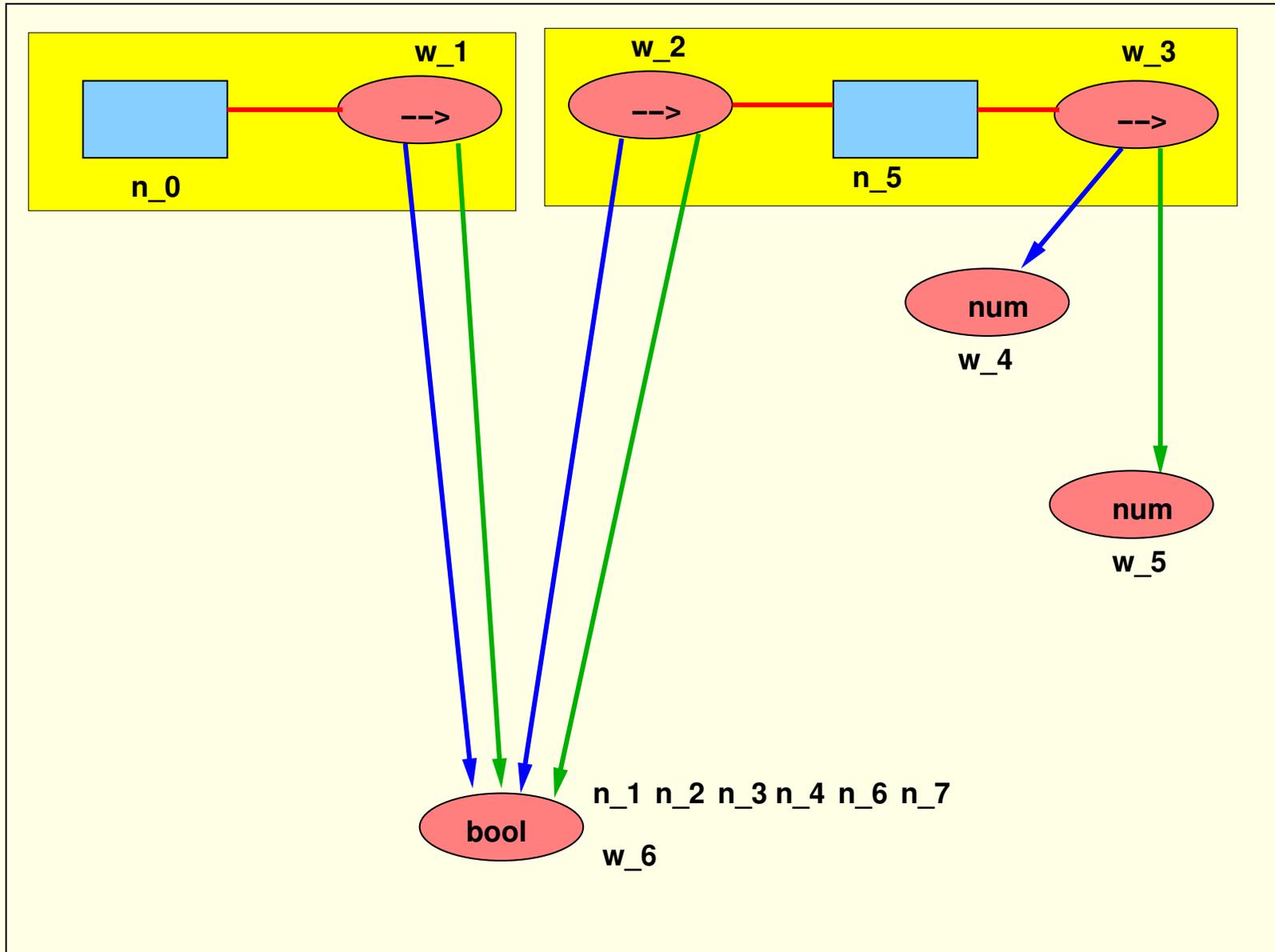
# Computing Unification Closure



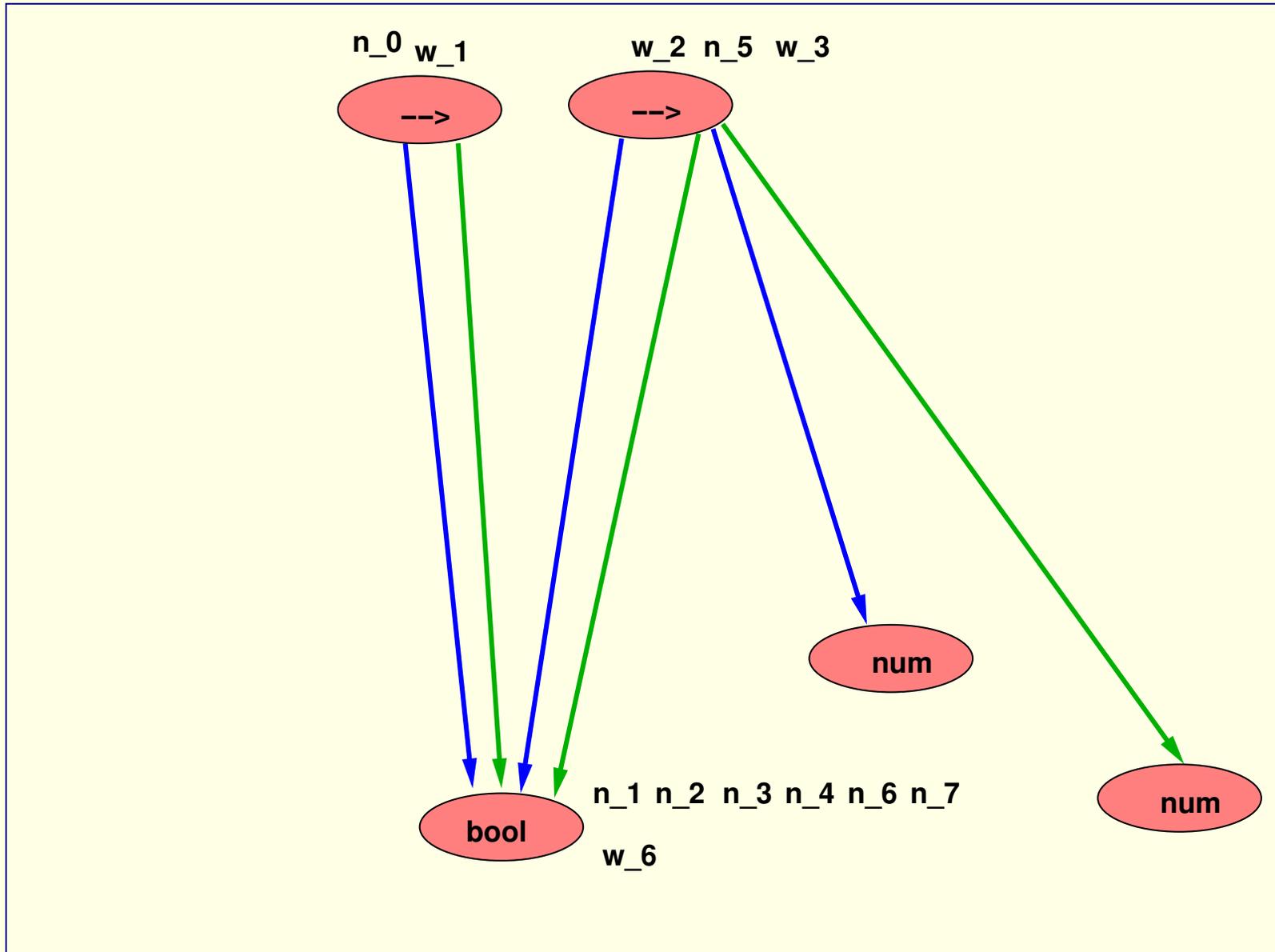
# Computing Unification Closure



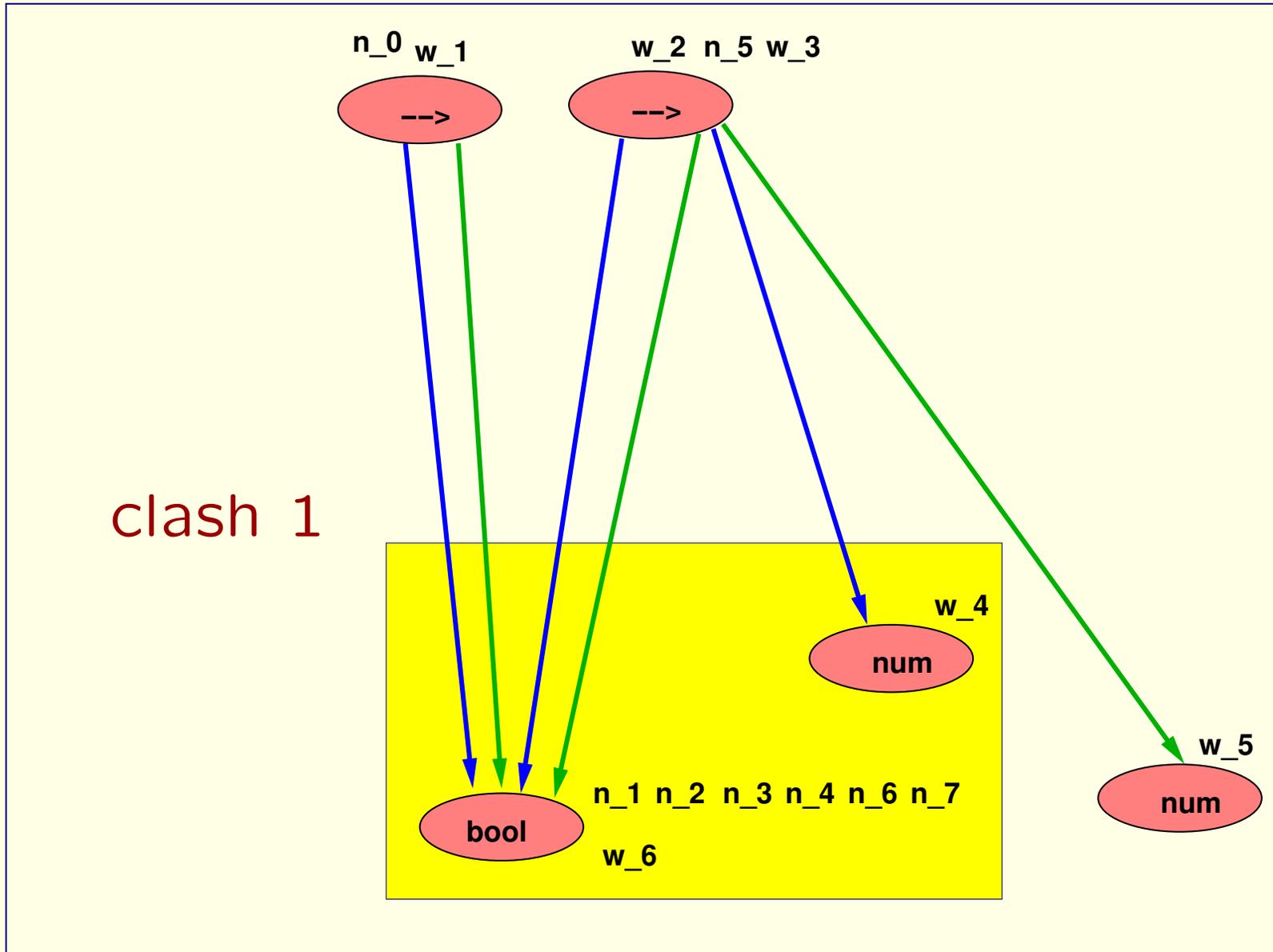
# Computing Unification Closure



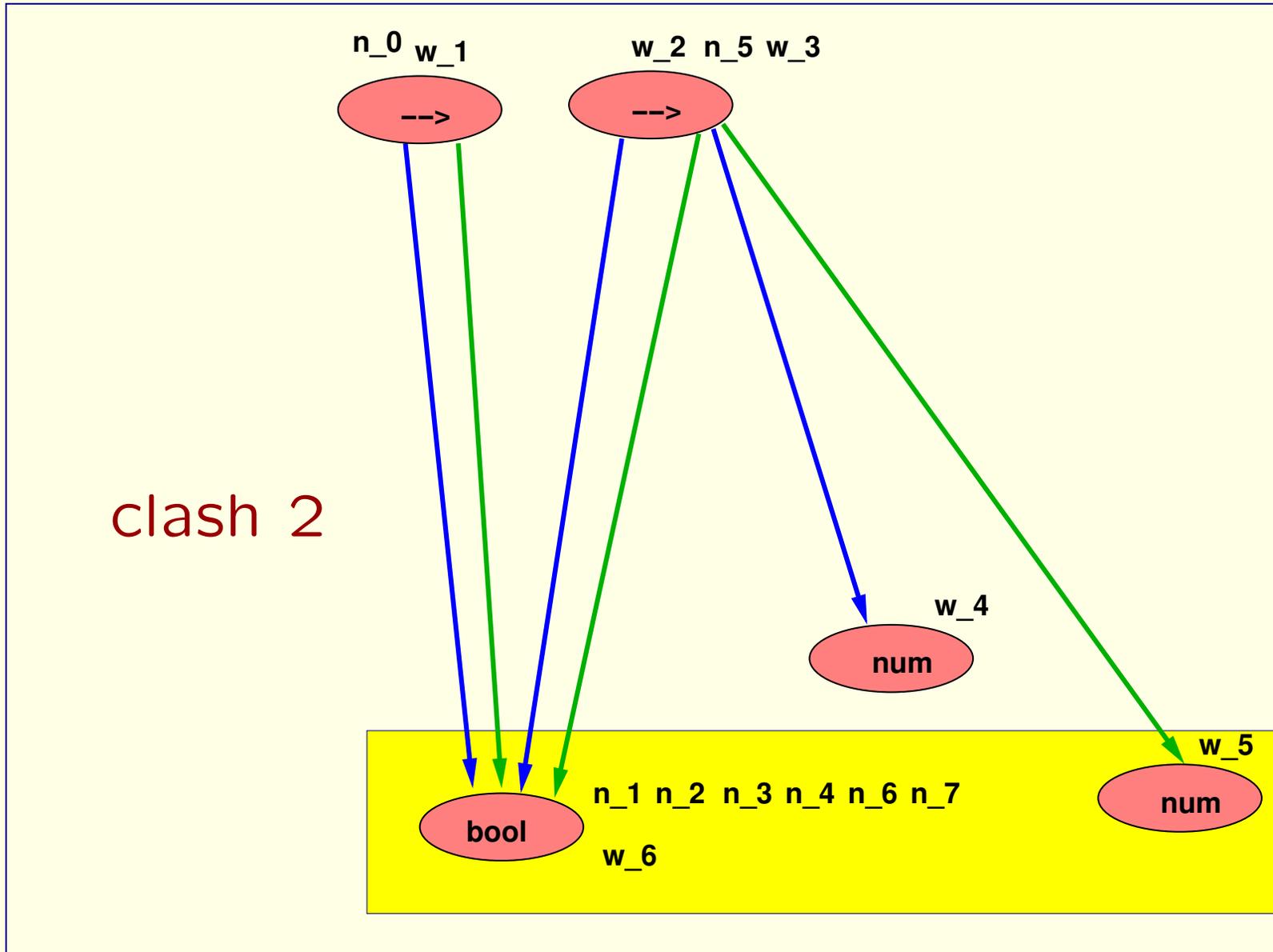
# Computing Unification Closure



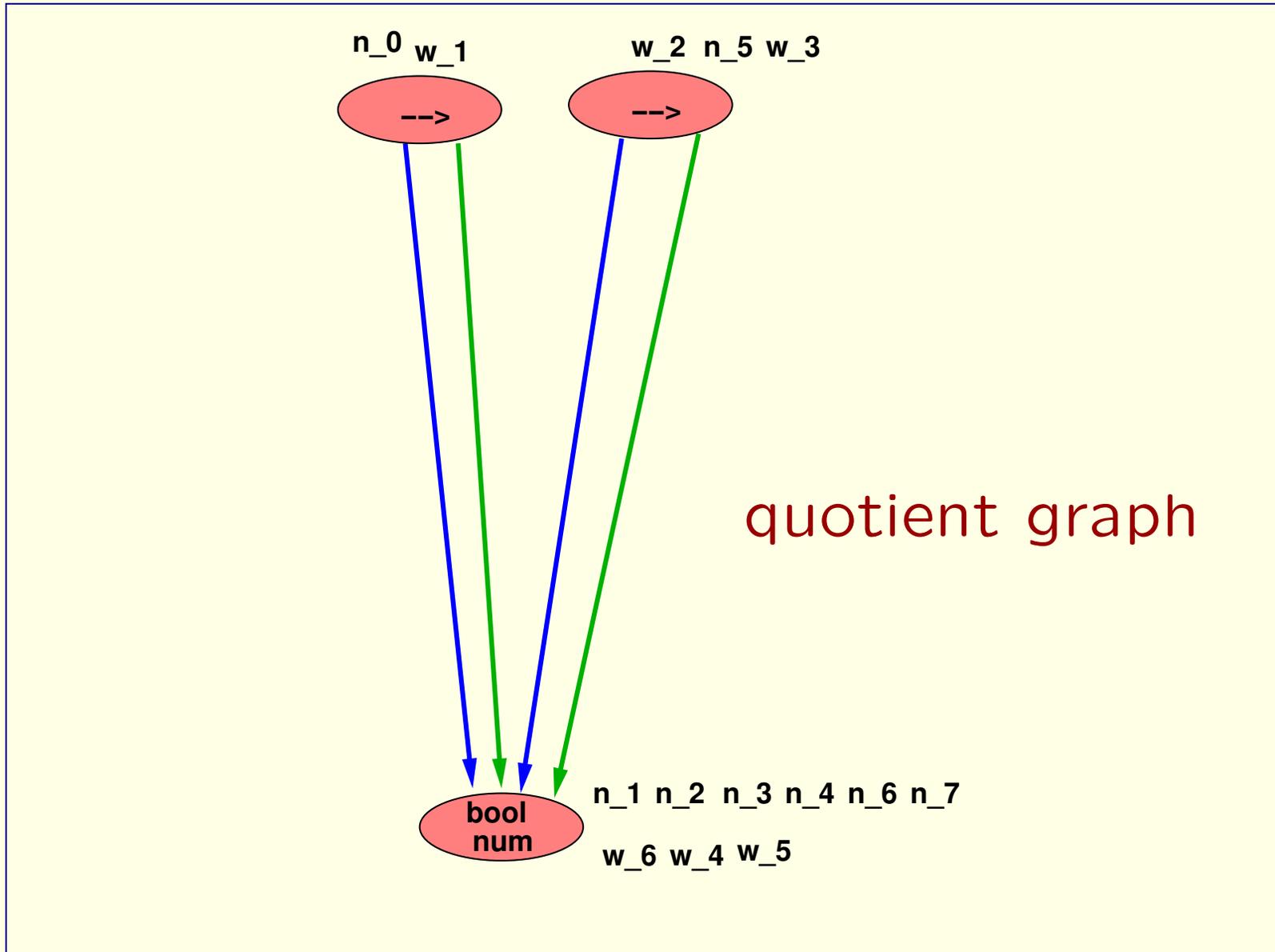
# Computing Unification Closure



# Computing Unification Closure



# Computing Unification Closure



# The Problem of Source-tracking Unification

$G$  unifiable iff the quotient of  $G$  is clash and cycle free.

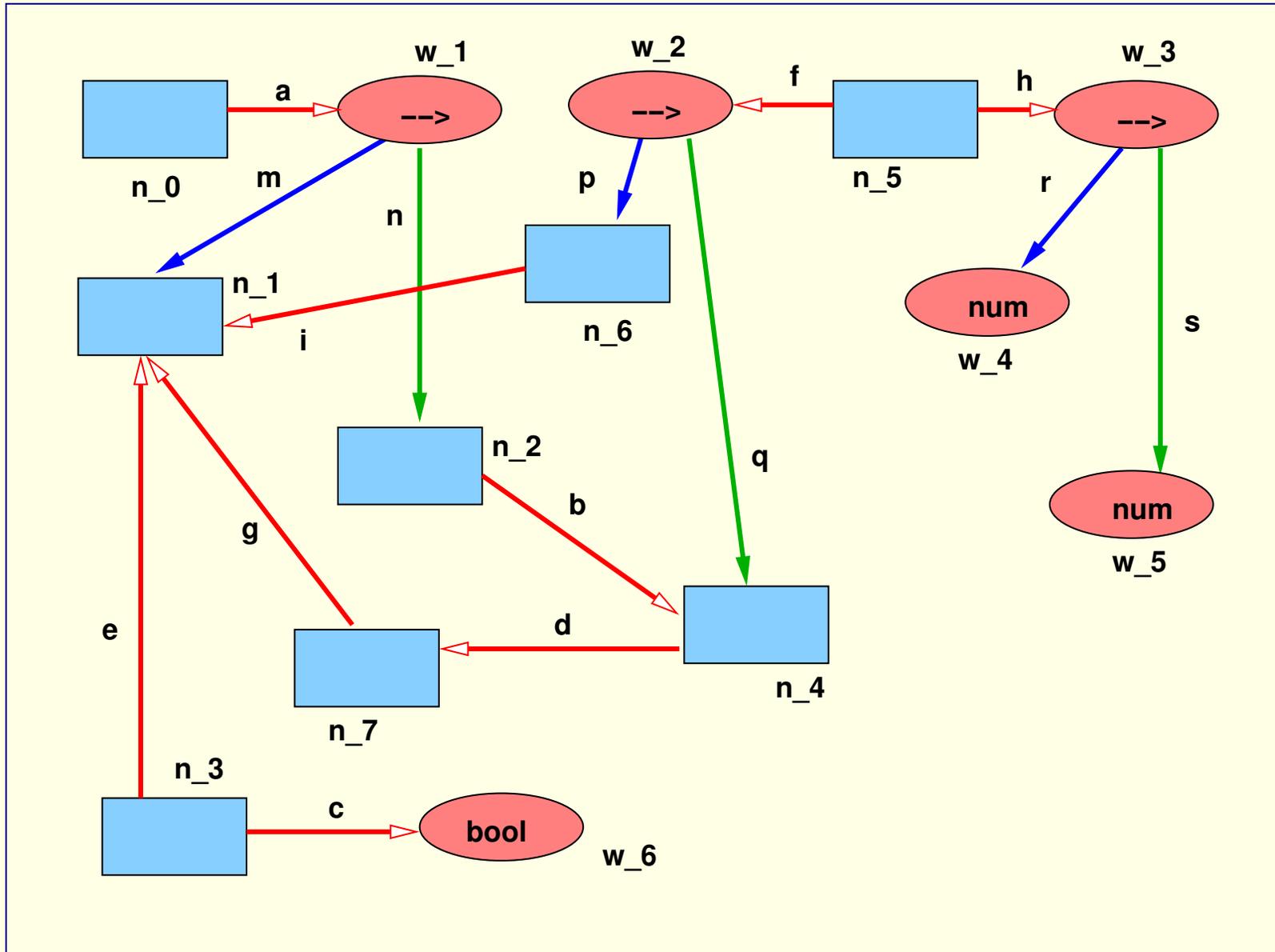
[Paterson and Wegman, 1978]

How to express connectivity of the quotient of  $G$  ...

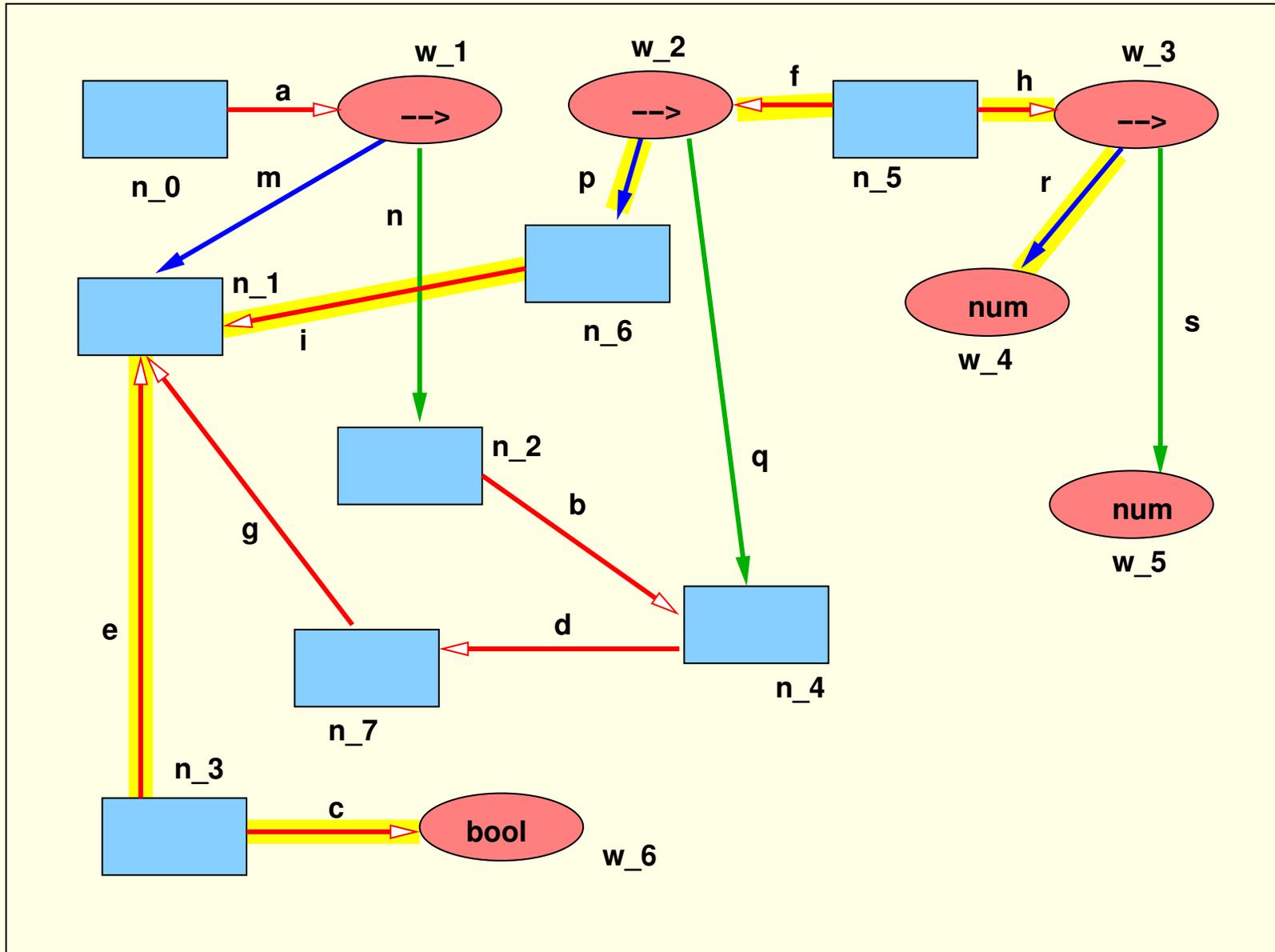
in terms of the connectivity of  $G$

# Clash 1

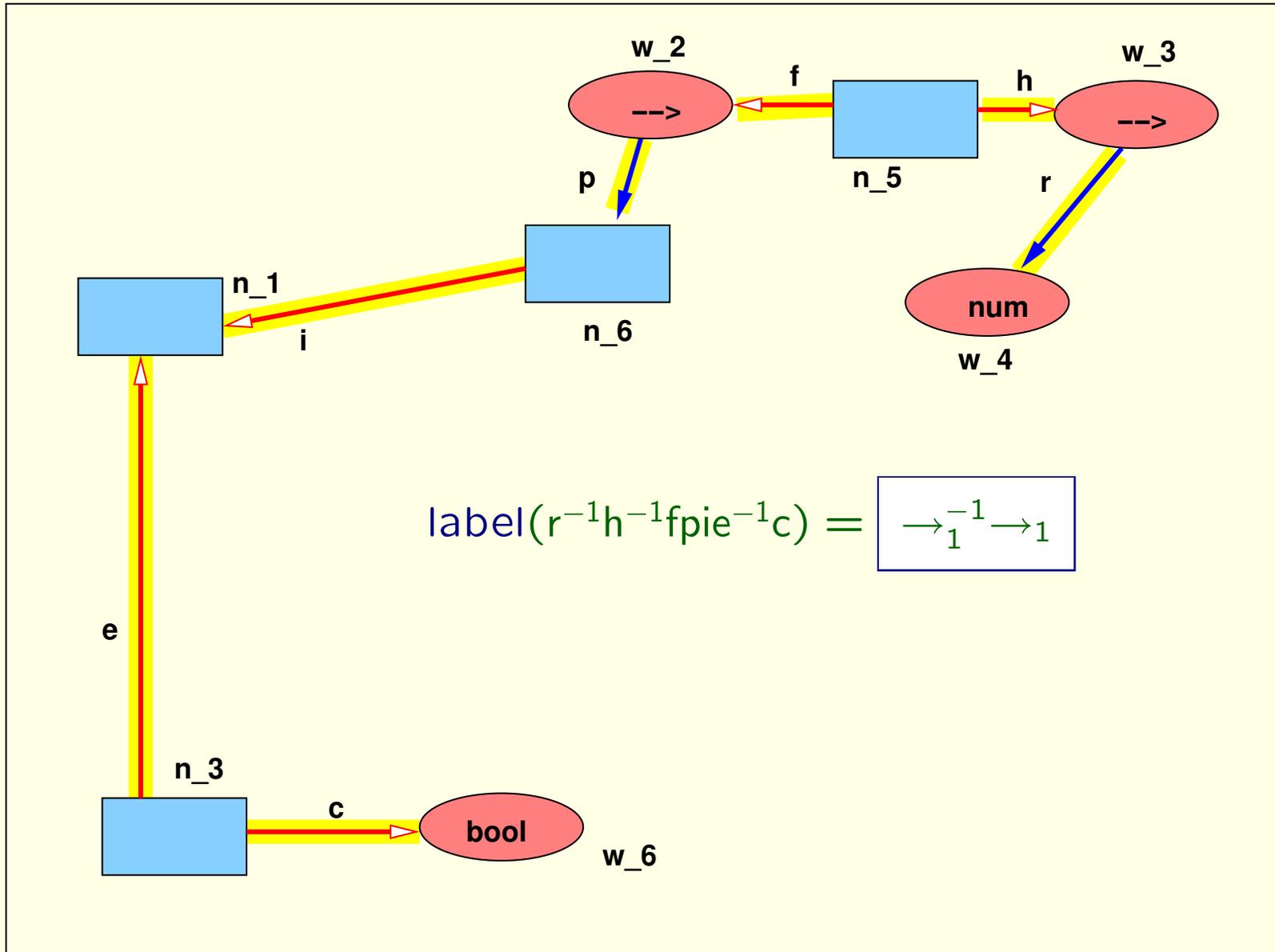
# Clash 1



# Clash 1



# Clash 1



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# Semi-Dyck Sets and Unification Paths

$\Sigma$ : right parenthesis symbols

$\Sigma^{-1}$ : left parenthesis symbols

Words over  $\Sigma \cup \Sigma^{-1}$

One-way cancellation

$$\{\delta^{-1}\delta \longrightarrow \epsilon \mid \delta \in \Sigma\}$$

Unification Paths over  $G$ :

Paths in  $G \cup G^{-1}$  whose labels normalize to words over  $\Sigma$

# Unification Source-tracking Theorem

## Soundness

Unification path over  $G$  with label  $l$  implies path in the quotient of  $G$  with label equal to the normal form of  $l$

## Completeness

Path in the quotient of  $G$  with label  $l$  implies unification path over  $G$  with label whose normal form is  $l$

Connectivity in the quotient of  $G$  expressed ...

... in terms of connectivity in  $G \cup G^{-1}$

# Computing Shortest Unification Paths

Computation of shortest unification path using CFL shortest path algorithm [Barrett et al. '00]

Can be computed in  $O(V^3)$  for fixed alphabet.

# $P^U(G)$ : A Simple Type System for Unification

$G = \langle \Sigma, V, D \rangle$  labeled directed graph

$p \in T(\Sigma_{\text{Gr}}, D)$ : a free group term generated by the edges  $D$

$u, v \in V$ : vertices of  $G$ ,  $l \in \Sigma^*$ : Word over  $\Sigma$

Type judgements  $G \vdash p : u \xrightarrow{l} v$

INIT	$\frac{}{G \vdash c : u \xrightarrow{\delta} v}$	$c : u \xrightarrow{\delta} v \in G$
REF	$\frac{}{G \vdash \epsilon : u \xrightarrow{\epsilon} u}$	$u \in G$
SYM	$\frac{G \vdash p : v \xrightarrow{\epsilon} u}{G \vdash p^{-1} : u \xrightarrow{\epsilon} v}$	
TRANS	$\frac{G \vdash p : u \xrightarrow{l} v' \quad G \vdash q : v' \xrightarrow{l'} v}{G \vdash pq : u \xrightarrow{ll'} v}$	
DN	$\frac{G \vdash p : w \xrightarrow{\epsilon} w'}{G \vdash c^{-1}pc' : u \xrightarrow{\epsilon} v}$	$c : w \xrightarrow{\delta} u \in G$ $c' : w' \xrightarrow{\delta} v \in G$

Figure 1: The logic  $P^U(G)$  of unification path expressions over  $G$

## $P^U(G)$ adequacy theorem

Let  $G = \langle \Sigma, V, D \rangle$  be a labeled directed graph.

1. (Soundness) If  $G \vdash_{PU} p : u \xrightarrow{l} v$ , then  $G/\sim \models u \xrightarrow{l} v$ .
2. (Completeness) If  $G/\sim \models u \xrightarrow{l} v$ , then  $G \vdash_{PU} p : u \xrightarrow{l} v$  where  $p$  is some  $\Sigma_{Gr}$ -term over  $D$ .

# Constructing Unification Proofs

```
1  procedure unify( $v_1, v_2, m$ ) =  
2    let  $\langle r_1, p_1 \rangle = \text{find}(v_1)$  and  $\langle r_2, p_2 \rangle = \text{find}(v_2)$   
3    in if  $r_1 = r_2$  then return  
4       else case  $r_1.type, r_2.type$   
5         strict, strict:  $\text{union}(r_1, r_2, (p_1)^{-1}mp_2)$   
6         functor, strict:  $\text{unify}(v_2, v_1, (m)^{-1})$   
7         strict, functor: let  $ans = \text{occurs?}(r_2, r_1)$   
8           in case  $ans$   
9             no:  $\text{union}(r_1, r_2, (p_1)^{-1}mp_2)$   
10            yes( $_$ ,  $q$ ): fail(CYCLE,  $(p_1)^{-1}mp_2q$ )
```

Unification algorithm with source-tracking: procedure *unify*

# Simplification of Unification Proofs

Free group rewriting rules [Peterson and Stickel, '81]

Weak Subject Reduction

One-Step rewriting breaks types!

... but types reappear at normalization

# Unification Source-tracking: Summary

Definition using unification paths

Optimization using shortest-path algorithms

Deduction using the Logic for unification path expressions

Construction using standard unification algorithms

Simplification using group rewriting

Introduction

Example: Type Error Slicing

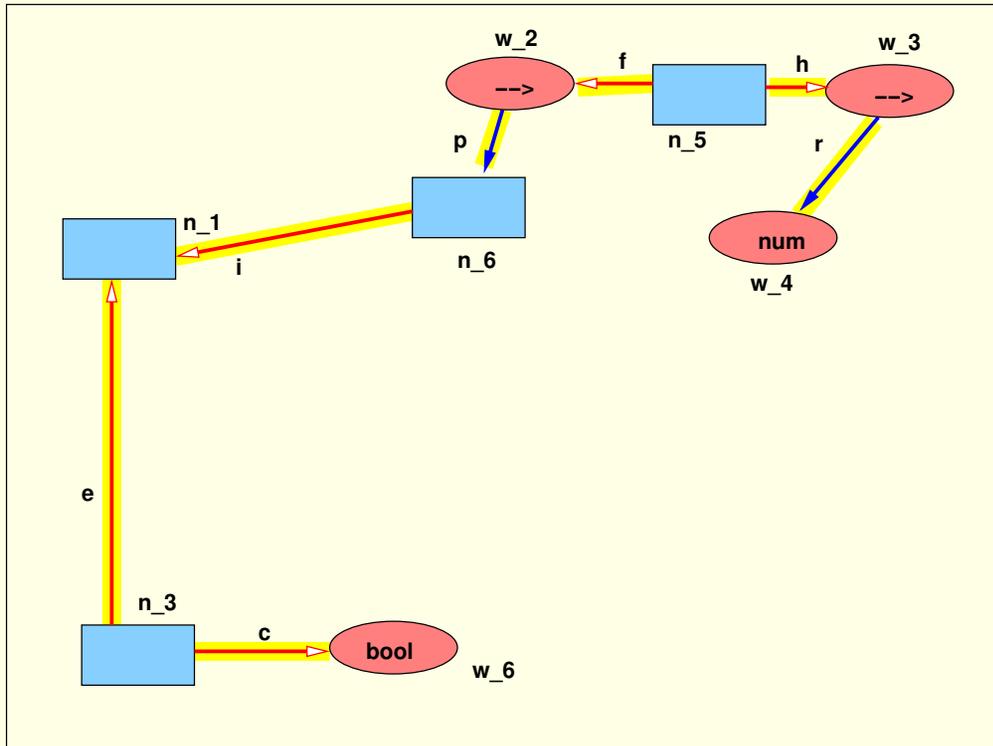
Framework

**Example Wrap up: Program Slicing**

Related Research

Future Work and Conclusions

# Type Equation Slice for clash 1



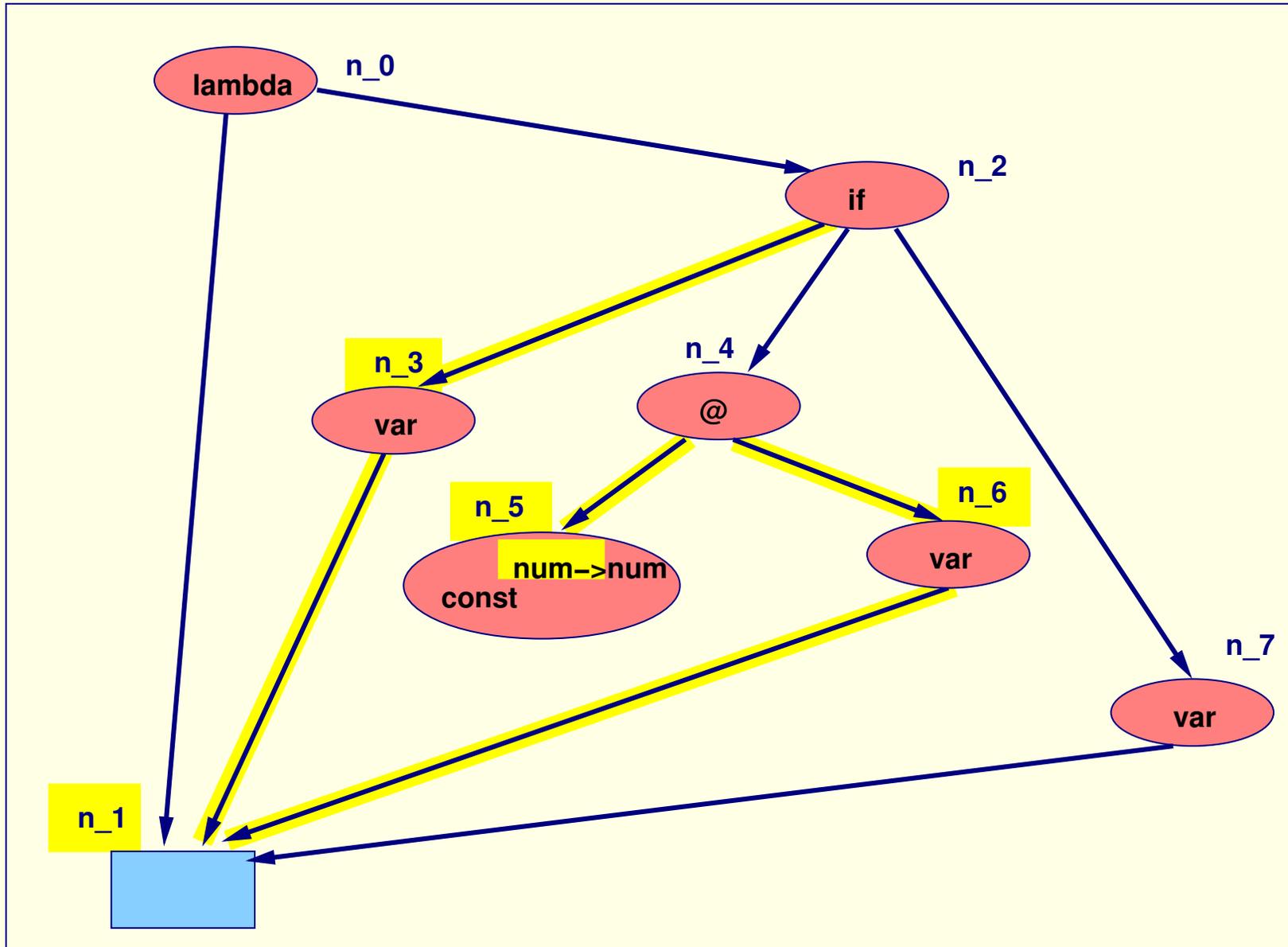
$$\begin{array}{l}
 \text{bool} \stackrel{?}{=} n_3 \\
 n_3 \stackrel{?}{=} n_1 \\
 n_1 \stackrel{?}{=} n_6 \\
 n_5 \stackrel{?}{=} n_6 \rightarrow \square \\
 n_5 \stackrel{?}{=} \text{num} \rightarrow \square
 \end{array}$$

# Program Slice for clash 1

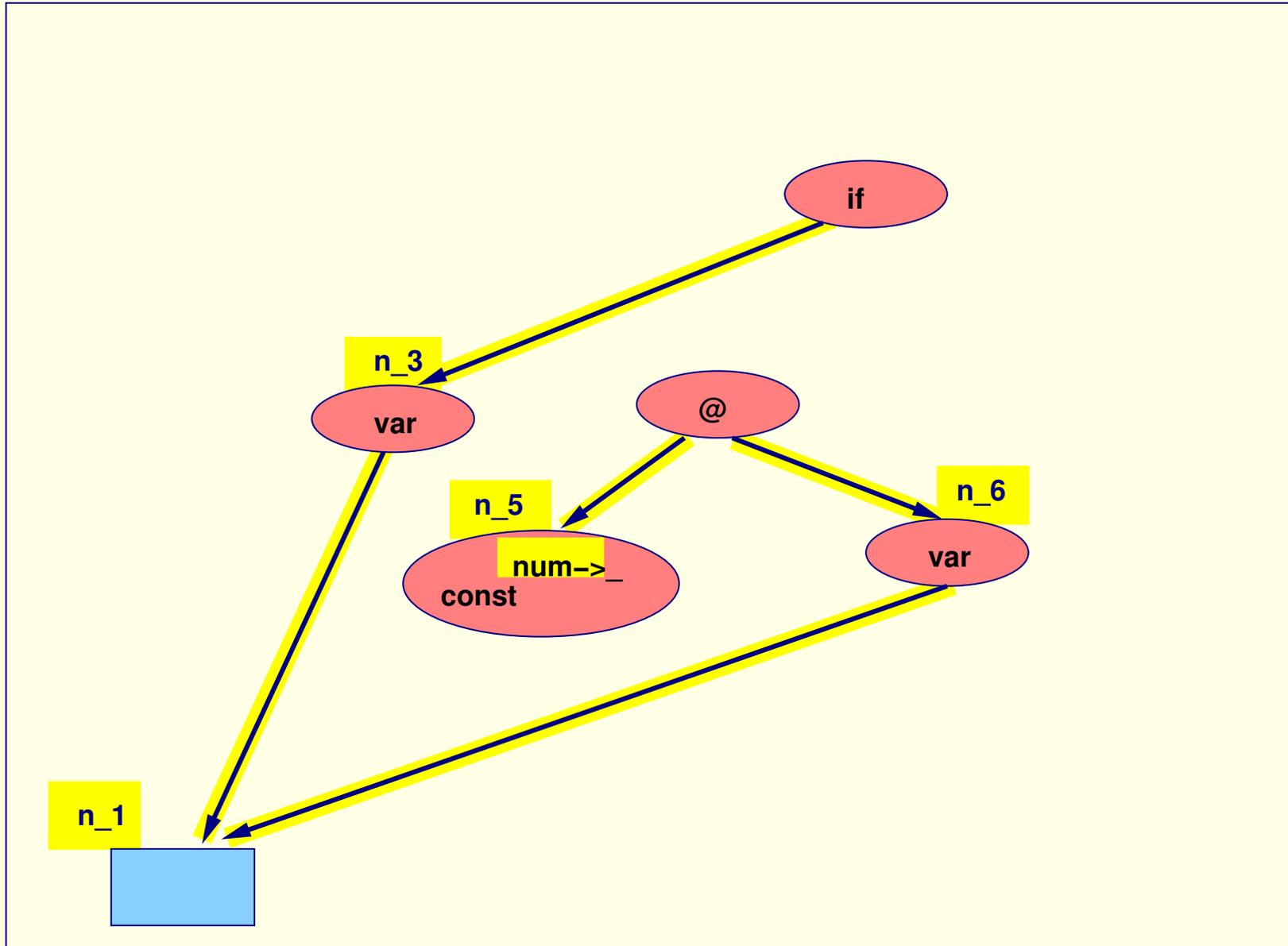
$$\begin{array}{llll} \square & = & \text{if}(n_3, \square, \square) & \mapsto \text{bool} \stackrel{?}{=} n_3 \\ n_3 & = & \lambda\text{var}(n_1) & \mapsto n_3 \stackrel{?}{=} n_1 \\ n_6 & = & \lambda\text{var}(n_1) & \mapsto n_1 \stackrel{?}{=} n_6 \\ \square & = & \text{@}(n_5, n_6) & \mapsto n_5 \stackrel{?}{=} n_6 \rightarrow \square \\ n_5 & = & \text{const}(num \rightarrow \square) & \mapsto n_5 \stackrel{?}{=} num \rightarrow \square \end{array}$$

# Graph of Program Slice $S_1$

# Graph of Program Slice $S_1$



# Graph of Program Slice $S_1$



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# Related Research

Reason lists [Wand '86]

- Not enough reasons accumulated to simulate error

- Can't eliminating irrelevant reasons: lacks cancellative rules

Flow techniques [Johnson-Walz'86]

- Error-tolerant unification

- Complicated algorithm, informally stated

Explanation-based systems [Stansifer '94, Duggan '94]

- Interactive graph navigation

- Lack automation

Logic Programming

- Maximally unifiable subsets [Cox,'84, Chen et al.'86]

- Unification failure [Cox, '87, Port, '88]

Origin Tracking in Rewrite Systems [Bertot, '95, van Deursen et al. '93]

# Future Work

## Measurements

- Evaluate efficiency and output sizes of algorithms for realistic unification problems.
- How bad is the non-optimal algorithm in practice.
- How effective is simplification
- How to generate minimal proofs

## Applications

- Diagnosis of errors in Hindley-Milner type inference
- Prolog debugging and backtracking

## Extensions

- Semi-Unification (useful for Polymorphic Type Inference with Recursion)
- does this framework extend easily to other unification theories?

# Conclusions

Relate unification with Path Problems

Simple Logic to compute well-formed “explanations”

Algorithms for computing and simplifying source-tracking information

Interactive generation of unification source-tracking information  
prototype implemented in Chez Scheme

<http://www.cs.indiana.edu/hyplan/chaynes/unif.tar.gz>

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Overflow

- Rewrite Rules for Path Simplification
- Subject Reduction Properties

# Unification Closure $\sim_G$

$$\text{EQ} \quad \frac{}{u \sim v} \quad u \xrightarrow{\epsilon} v \in G$$

$$\text{REF} \quad \frac{}{u \sim u} \quad u \in G$$

$$\text{SYM} \quad \frac{v \sim u}{u \sim v}$$

$$\text{TRANS} \quad \frac{u \sim v' \quad v' \sim v}{u \sim v}$$

$$\text{DN} \quad \frac{w \sim w'}{u \sim v} \quad \begin{array}{l} w \xrightarrow{f.i} u \\ w' \xrightarrow{f.i} v \end{array}$$

# Path Simplification

Associativity	$(pq)r$	$=$	$p(qr)$	$=$	$pqr$
1	$(pq)^{-1}$	$\longrightarrow$	$q^{-1}p^{-1}$		
2	$(p^{-1})^{-1}$	$\longrightarrow$	$p$		
3	$\epsilon^{-1}$	$\longrightarrow$	$\epsilon$		
4	$p\epsilon$	$\longrightarrow$	$p$		
5	$\epsilon p$	$\longrightarrow$	$p$		
6	$pp^{-1}$	$\longrightarrow$	$\epsilon$		
7	$p^{-1}p$	$\longrightarrow$	$\epsilon$		

Figure 3: Equational rewrite system  $R/A$  for free groups, where  $A$  consists of the equational rule of associativity, and  $R$  consists of the remaining rules (Peterson and Stickel, 1981).

$R/A$  is strongly normalizing. Reduction under  $R/A$  yields unique normal forms.

# Subject Reduction Properties

Rewriting with  $R/A$  destroys  $P^U$  proofs ... temporarily.

Let

$$a : w \xrightarrow{\epsilon} w'$$

$$b_1 : w \xrightarrow{f.i} u$$

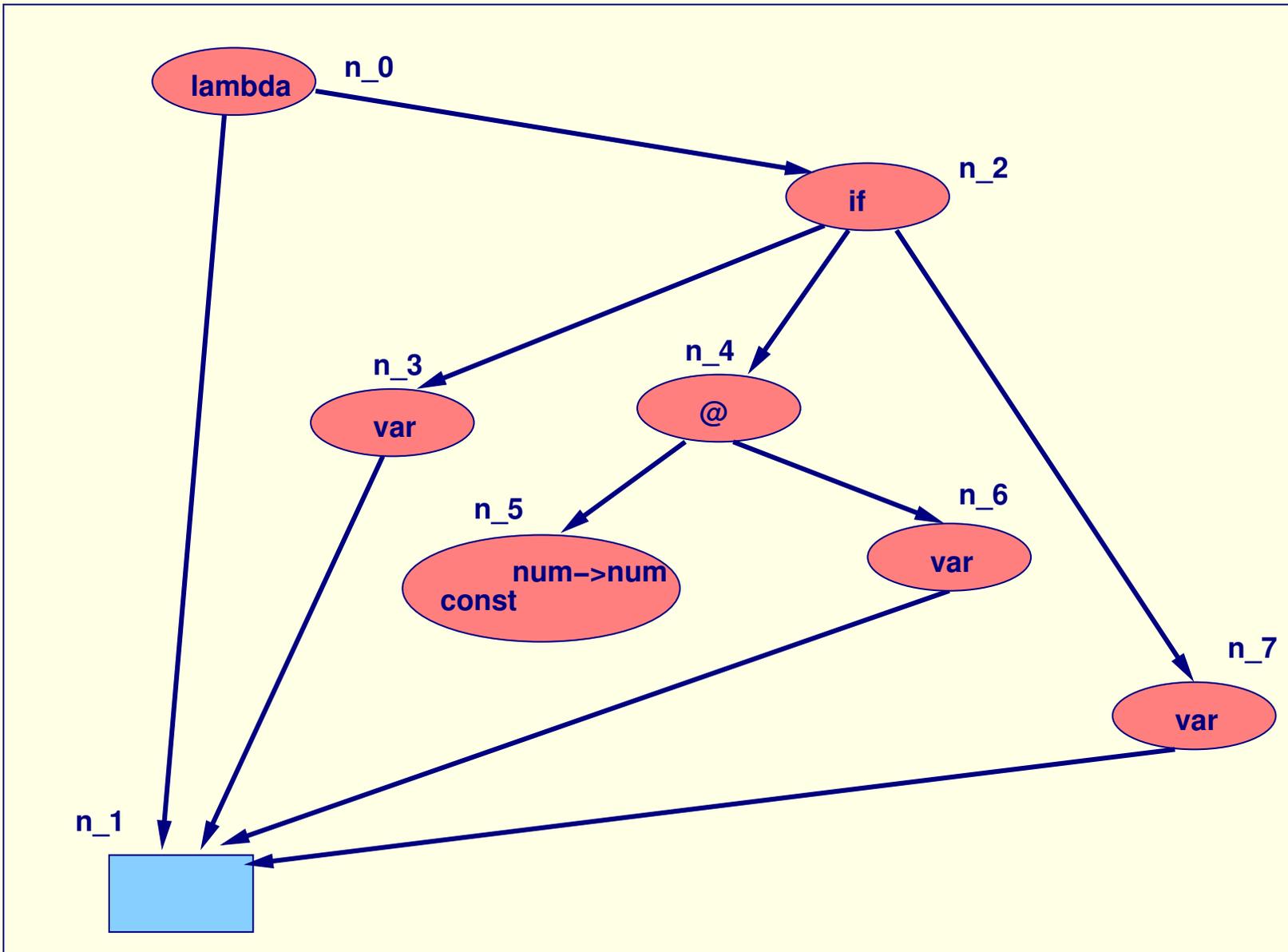
$$b_2 : w' \xrightarrow{f.i} v$$

$$\begin{array}{ll} ((b_1)^{-1}ab_2)^{-1} & \xrightarrow{R} (b_2)^{-1}((b_1)^{-1}a)^{-1} \notin P^U \\ & \xrightarrow{*R} (b_2)^{-1}a^{-1}b_1 \in P^U \end{array}$$

**Theorem 1.** ( $P^U$  Weak Subject Reduction)

Let  $G$  be a unification graph and let  $G \vdash_{P^U} p : u \xrightarrow{l} v$ . If  $p'$  is the normal form of  $p$  under  $R/A$  rewriting, then,  $G \vdash_{P^U} p' : u \xrightarrow{l} v$ .

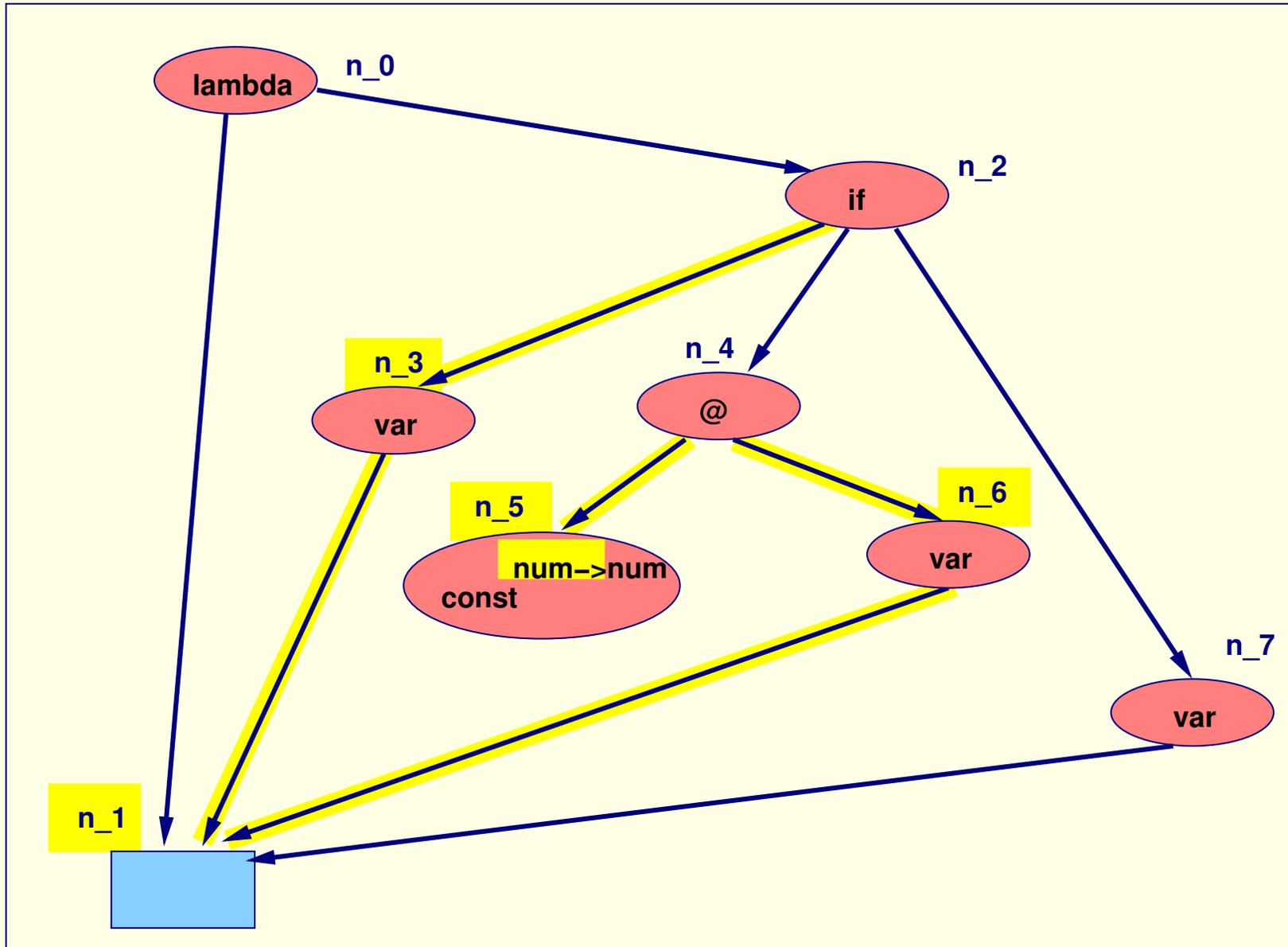
# Abstract Syntax Graph



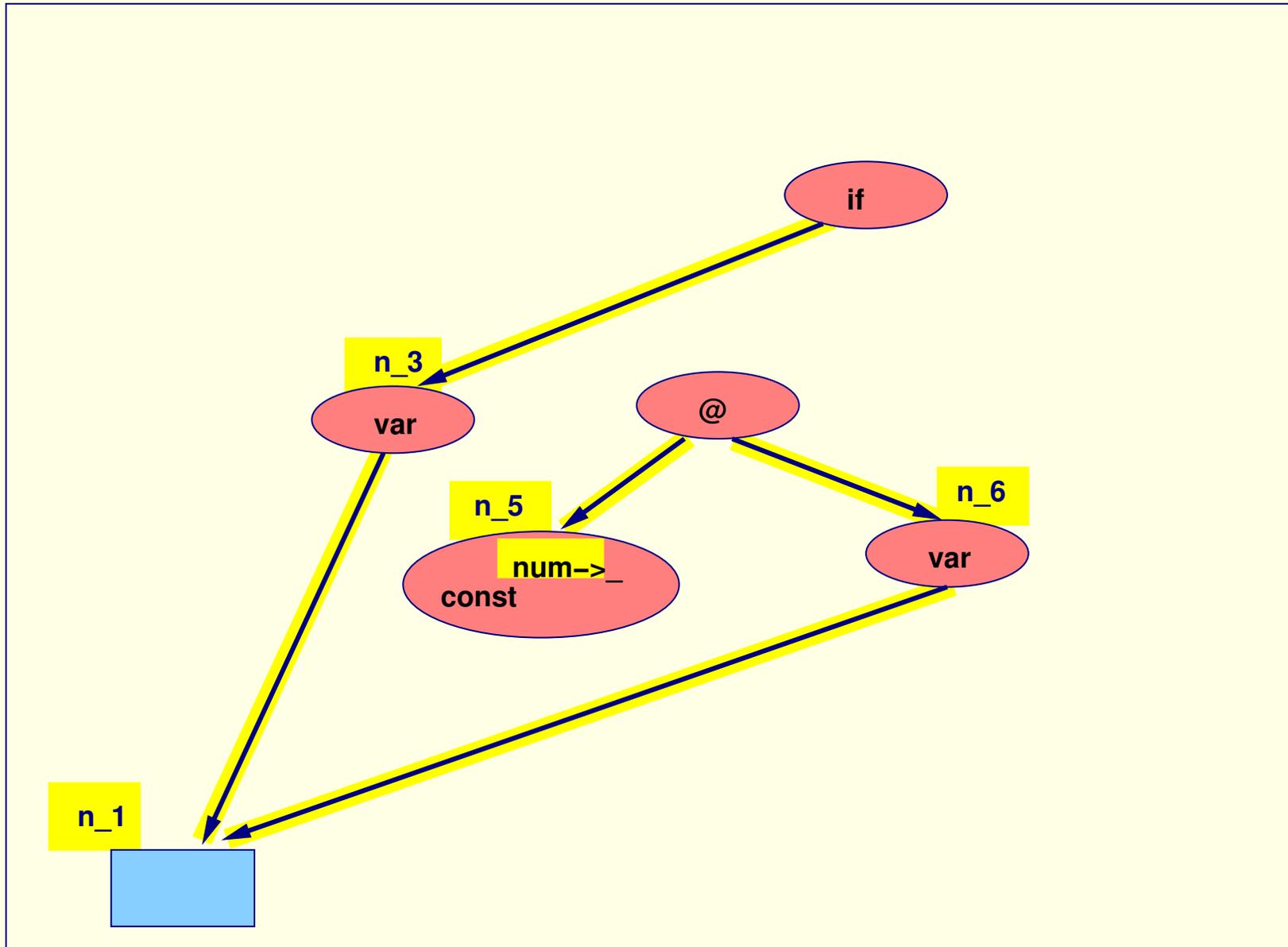
$\lambda_0 x_1. \text{if}_2 x_3 \text{ then } @_4(\text{inc}_5 x_6) \text{ else } x_7$

# Graph of Program Slice for clash 1

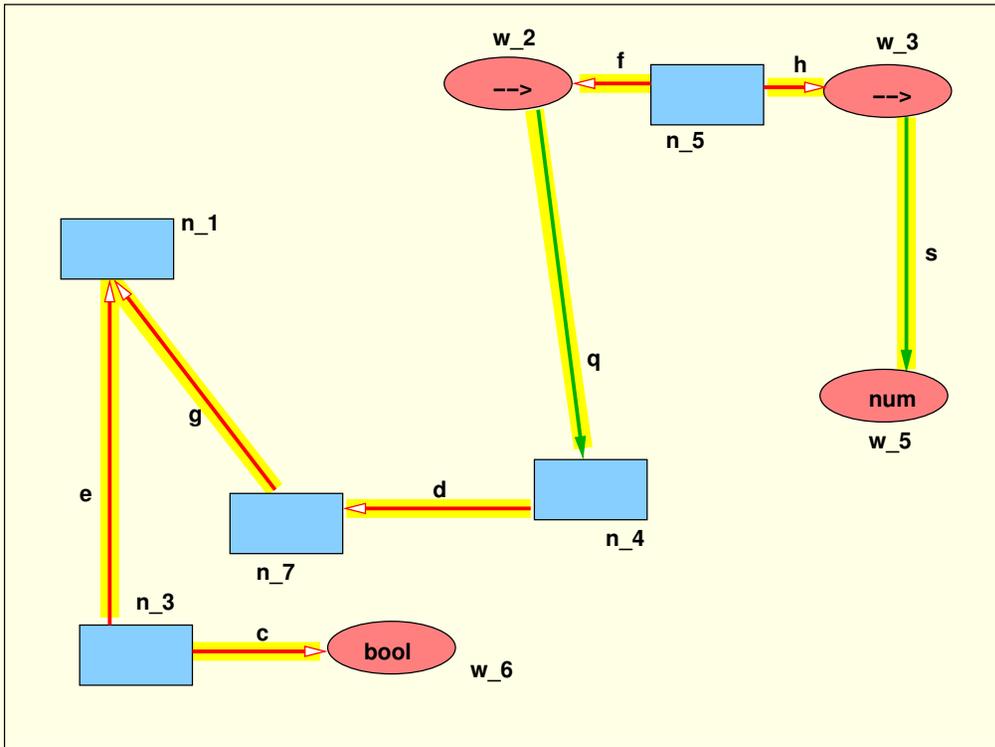
# Graph of Program Slice for clash 1



# Graph of Program Slice for clash 1



# Type Equation Slice for class 2



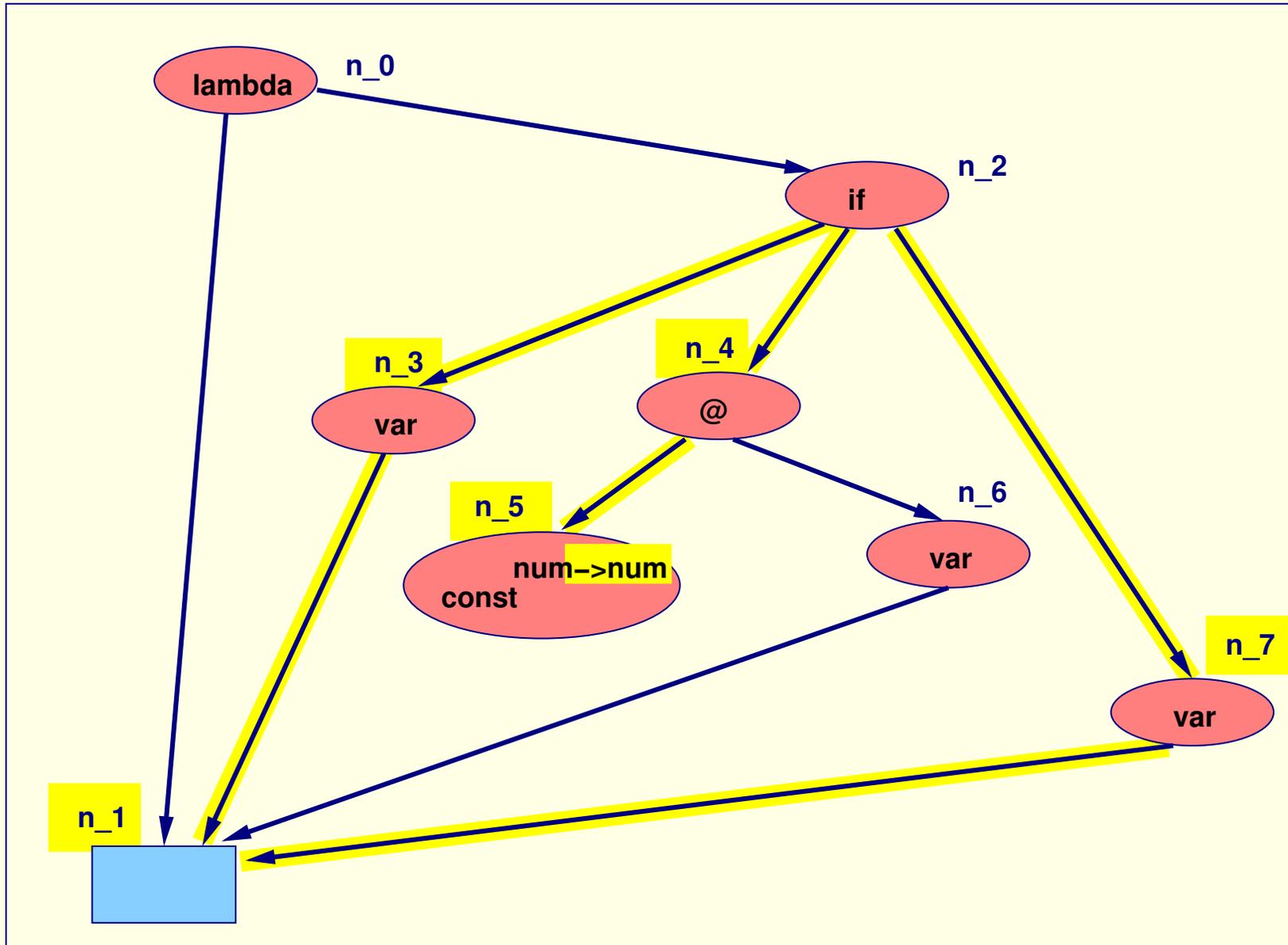
$bool \stackrel{?}{=} n_3$   
 $n_3 \stackrel{?}{=} n_1$   
 $n_1 \stackrel{?}{=} n_7$   
 $n_7 \stackrel{?}{=} n_4$   
 $n_5 \stackrel{?}{=} \square \rightarrow n_4$   
 $n_5 \stackrel{?}{=} \square \rightarrow num$

## Program Slice $S_2$

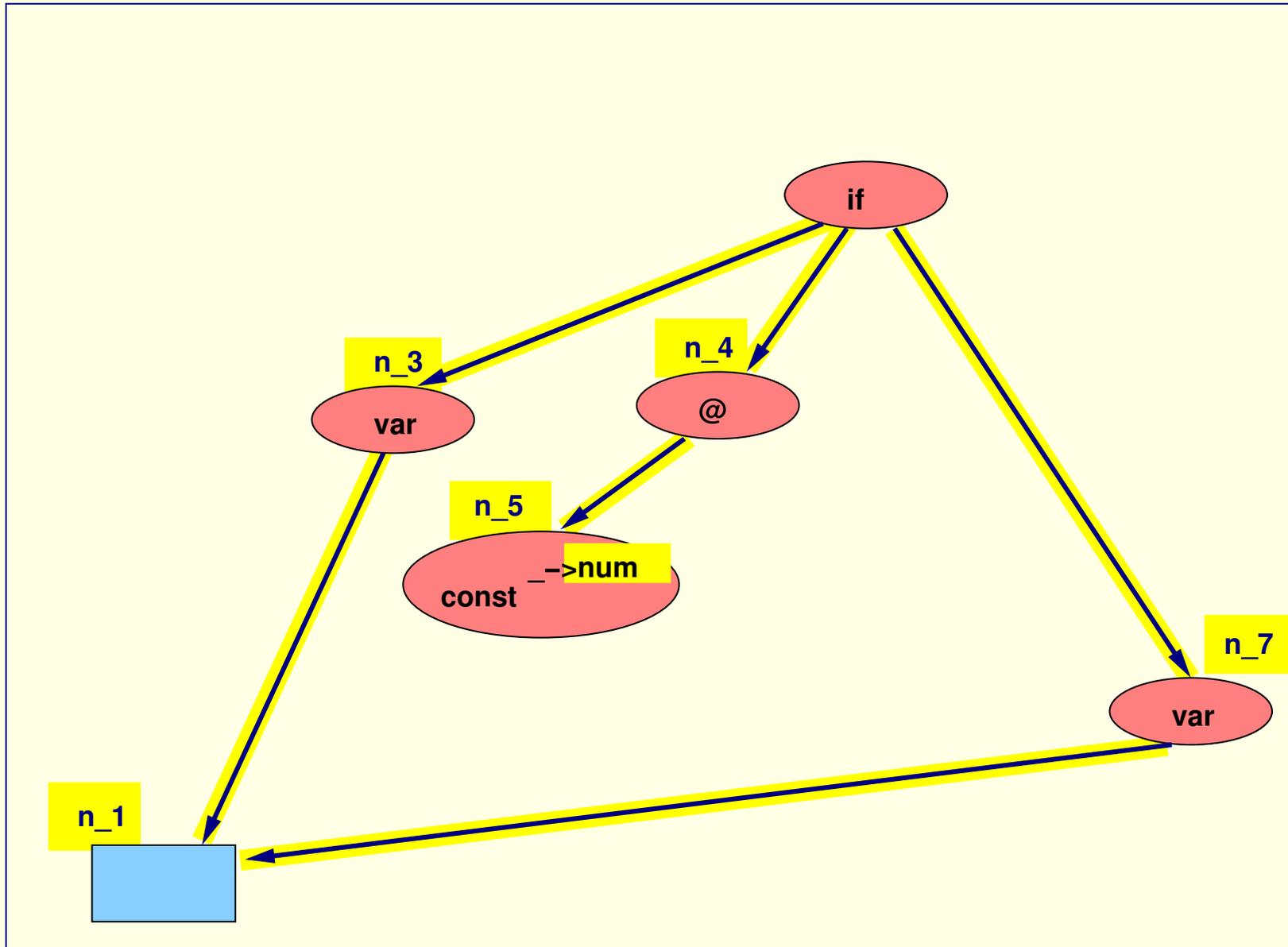
$$\begin{array}{llllll} \square & = & \text{if}(n_3, \square, \square) & \mapsto & \text{bool} & \stackrel{?}{=} & n_3 \\ n_3 & = & \lambda\text{var}(n_1) & \mapsto & n_3 & \stackrel{?}{=} & n_1 \\ n_7 & = & \lambda\text{var}(n_1) & \mapsto & n_7 & \stackrel{?}{=} & n_1 \\ \square & = & \text{if}(\square, n_4, n_7) & \mapsto & n_4 & \stackrel{?}{=} & n_7 \\ n_4 & = & \text{@}(n_5, \square) & \mapsto & n_5 & \stackrel{?}{=} & \square \rightarrow n_4 \\ n_5 & = & \text{const}(\square \rightarrow \text{num}) & \mapsto & n_5 & \stackrel{?}{=} & \square \rightarrow \text{num} \end{array}$$

# Graph of Program Slice $S_2$

# Graph of Program Slice $S_2$



# Graph of Program Slice $S_2$



# Related Research

## Reason lists [Wand '86]

- Accumulate reason lists during unification

- Lacks soundness: not enough reasons accumulated to simulate error

- No way of eliminating unwanted reasons: lacks cancellative rules

## Flow techniques [Johnson-Walz'86]

- Error-tolerant unification

- Complicated algorithm, informally stated

## Explanation-based systems [Stansifer '94, Duggan '94, Soosaipillai '90]

- Interactive graph navigation

- Lack automation

## Others Approaches:

- Automata-based approach [Gandhe et al. '96]

- TCC explanation in PVS [SRI, '98]

## Logic Programming

Unification failure [Cox, '87, Port, '88]

Maximally unifiable subsets [Cox,'84, Chen et al.'86]

Tracing [Ducassé, '99]

Visual Debuggers [Deransart, '2000]

## Rewrite Systems

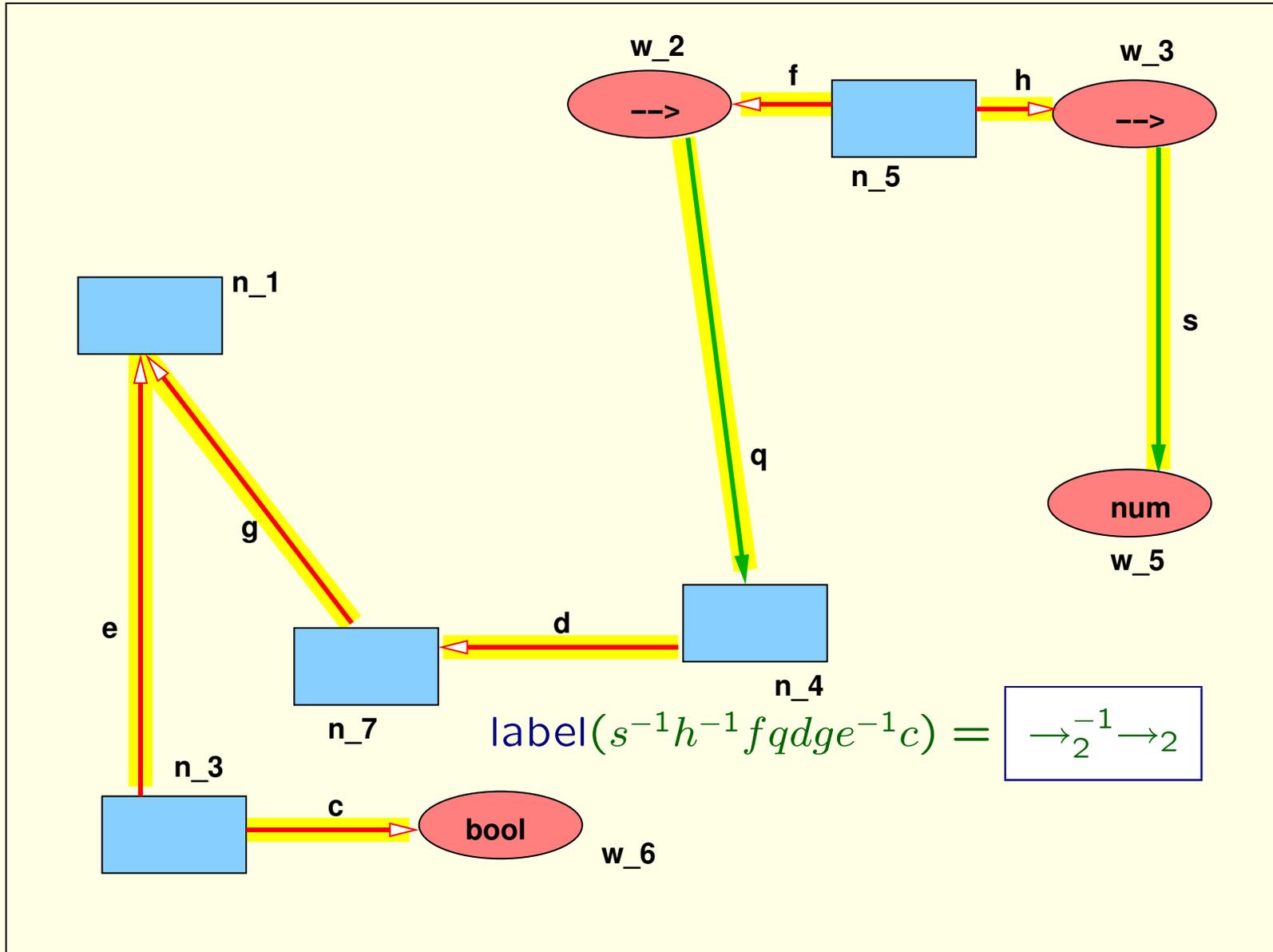
Origin tracking [Bertot, '95, van Deursen et al. 93]

## Artificial Intelligence

conflict sets [Reiter '87, de Kleer '92]

Explanation-based diagnosis [Genesereth '84, Wick and Thompson '92]

# Clash 2



# Unification Logic $LE_0$ of Le Chenadec

$$\begin{array}{l}
 s \quad \frac{M = N}{N = M} \\
 t \quad \frac{M = x \quad x = N}{M = N} \\
 s_i \quad \frac{f(M_1, M_2) = f(N_1, N_2)}{M_i = N_i} \quad i \in \{1, 2\} \\
 su \quad \frac{x = M \quad y = C[x]}{y = C[M]}
 \end{array}$$

$LE_0$  is sound and complete with respect to path connectivity in the quotient graph [Proposition 2.10, Le Chenadec '89]

$P^U$  and  $LE_0$  are equivalent because they are sound and complete with respect to the same model.

$P^U$  works on vertices of a labeled directed graph, making apparent the integration with unification algorithms.

Geometric interpretation of proofs due to Le Chenadec. But connection

with semi-Dyck sets provides opportunity to apply algorithms for formal language path problems to unification source tracking.