

**Motivation: Von Verifikation über Analyse zur
Transformation – Optimierung am Beispiel
“code motion”-basierter Transformationen (Teil 1)**

Analyse und Verifikation (WS 2006/2007) / 7. Teil (05.12.2006)

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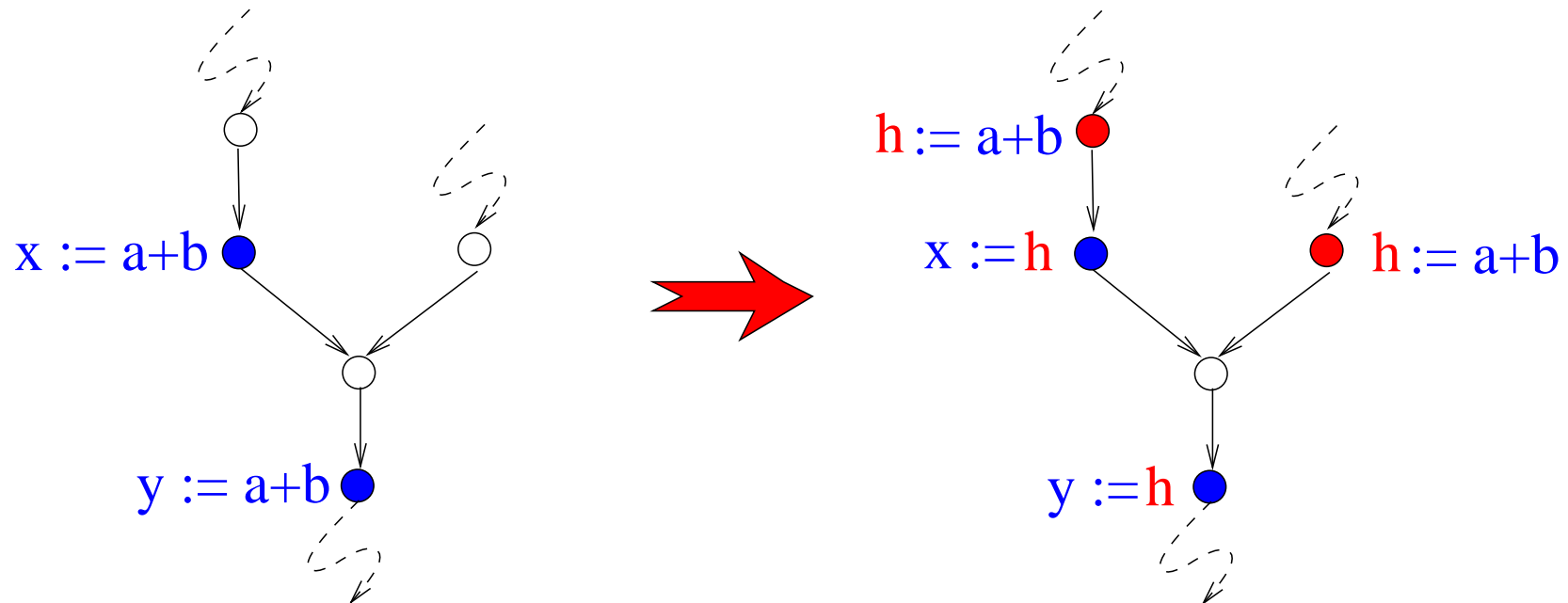


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CM – What's it all about?

...essentially, CM aims at avoiding recomputing values



Why Considering Code Motion (CM)? (1)

...because it is

- **Relevant** ...widely used in practice
- **General** ...a family of optimizations rather than a single one
- **Well-understood** ...manually proven correct and optimal
- **Challenging** ...conceptually simple, but exhibits lots of thought-provoking phenomena

Why Considering Code Motion (CM)? (2)

Last but not least, it is...

- Truly classical ...has a long history
 - Morel, E. and Renvoise, C. *Global Optimization by Suppression of Partial Redundancies*. CACM 22 (2), 96 - 103, 1979.
 - Ershov, A. P. *On Programming of Arithmetic Operations*. CACM 1 (8), 3 - 6, 1958.

Conceptually

...code motion can be considered a two-stage process

1. Expression hoisting

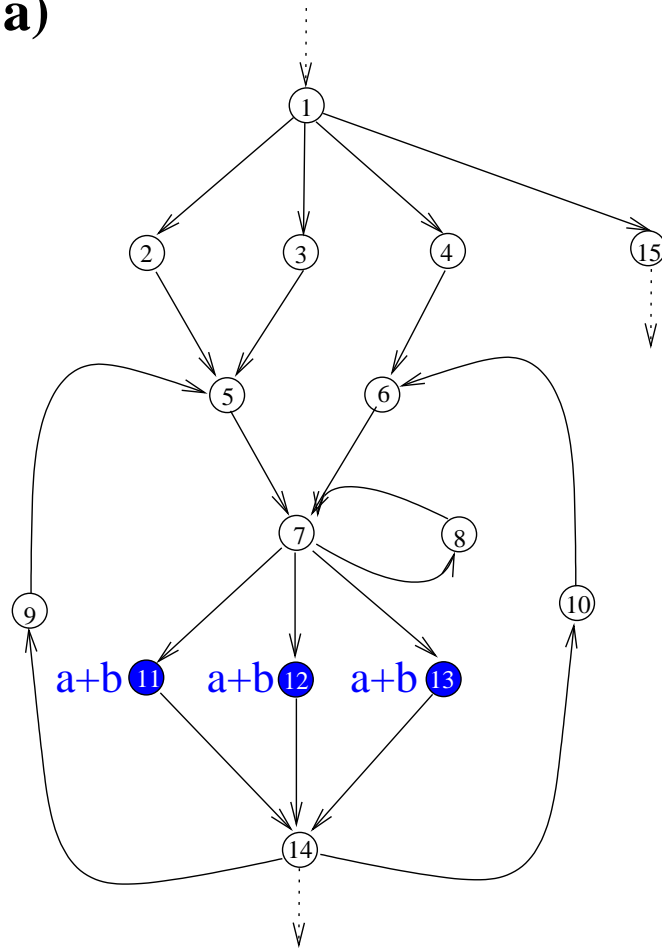
...hoisting expressions to “earlier” safe computation points

2. Total redundancy elimination

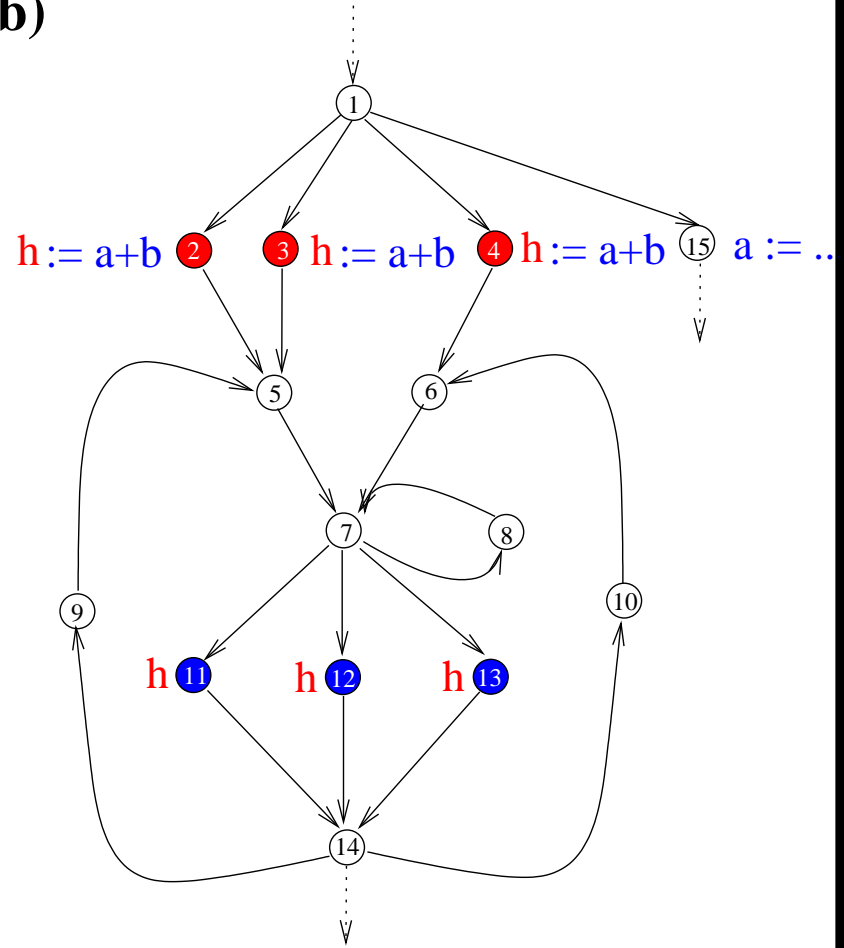
...eliminating computations which became totally redundant

The Effect of CM applied to a More Complex Example

a)



b)



Correctness, Optimality

We can prove...

- Correctness

Theorem ["Essence"]

...at every use site of a temporary, recomputing the expression yields the same value which is stored in the temporary

- Optimality

Theorem [Earliestness principle]

...hoisting expressions to their **earliest** safe computation points leads to **computationally optimal** programs

~> ...known as **Busy Code Motion** (PLDI'92, Knoop et al.)

Note

Traditionally,

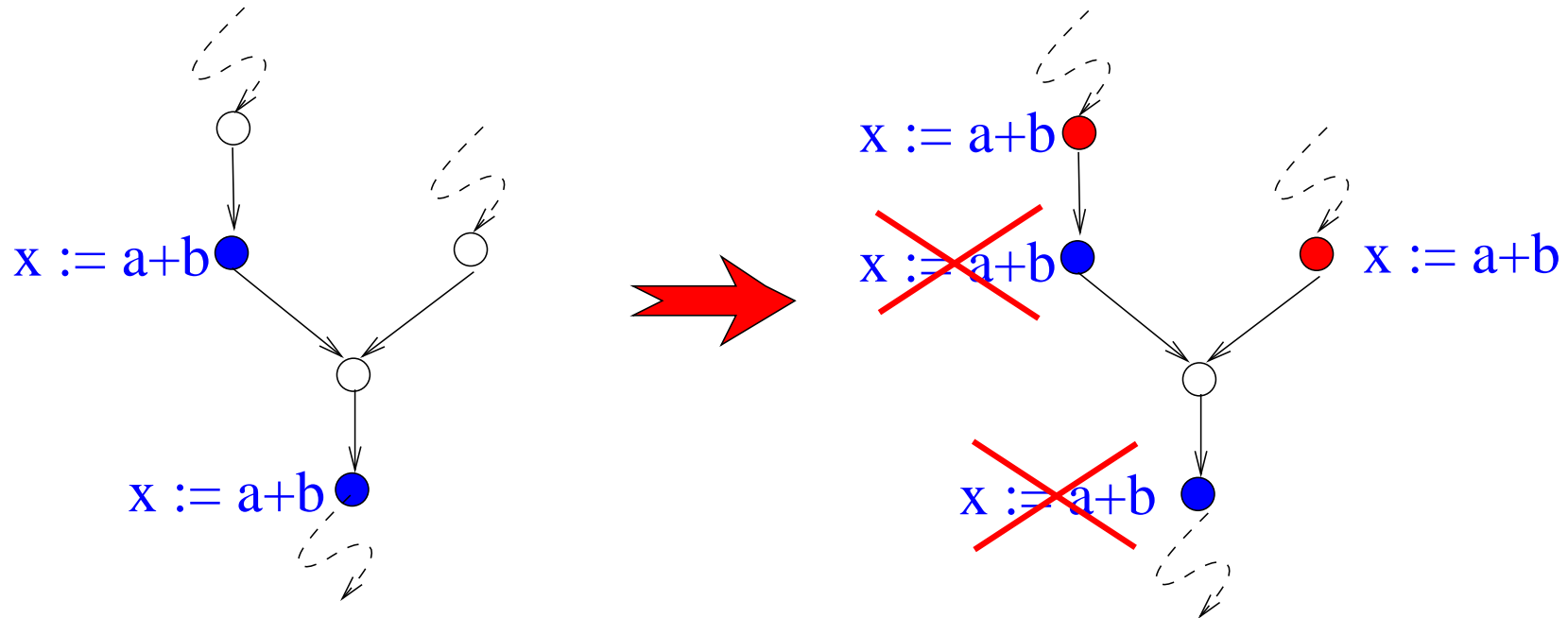
- Code (C) means expressions
- Motion (M) means hoisting

But...

- CM is more than hoisting of expressions and PR(E)E!

For example, code...

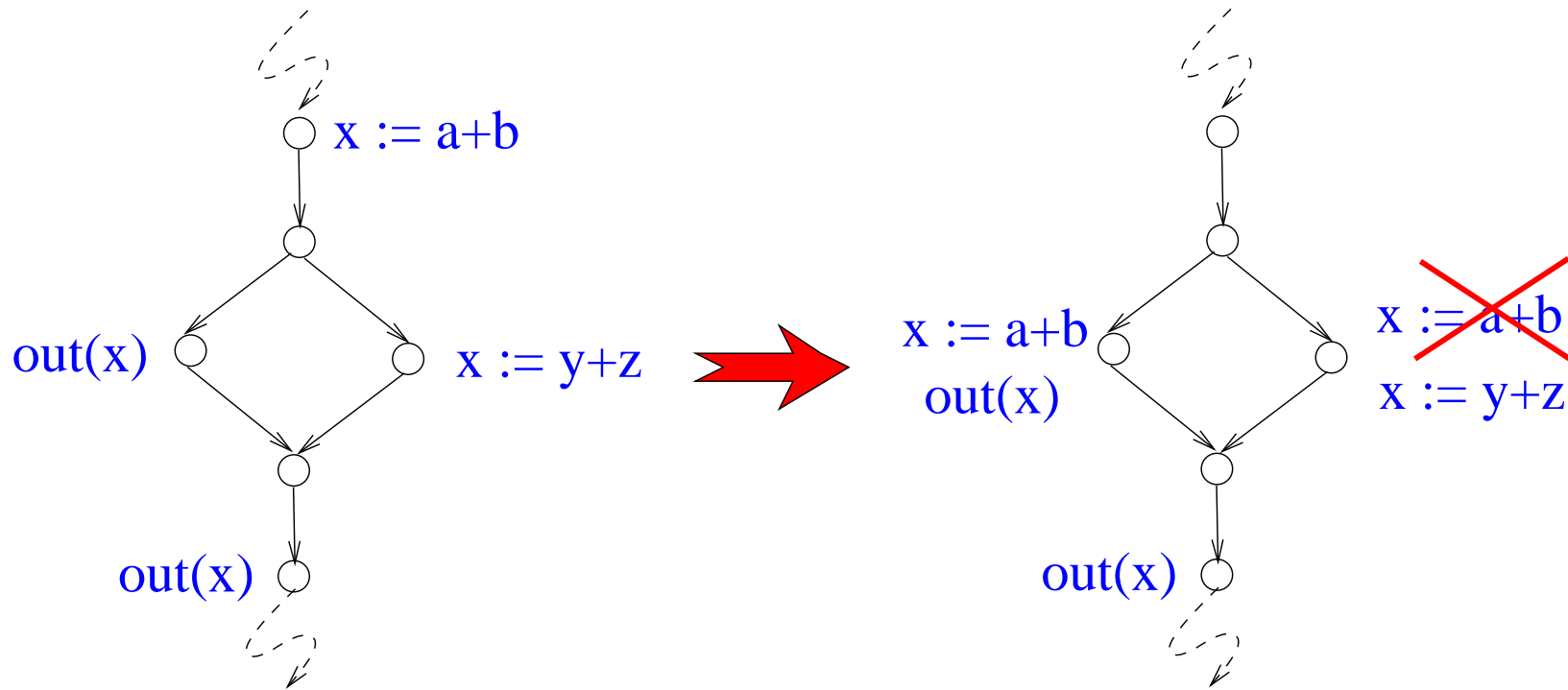
...can be assignments, too.



- Here, **CM** means **partially redundant assignment elimination (PRAE)**

In contrast to expressions, assignments...

...might also be **sunk**.



- Now, **CM** means **partially dead code elimination (PDCE)**

Towards the Design Space of CM-Algorithms...

More generally...

- Code means expressions/assignments
- Motion means hoisting/sinking

Code / Motion	Hoisting	Sinking
Expressions	EH	·/·
Assignments	AH	AS

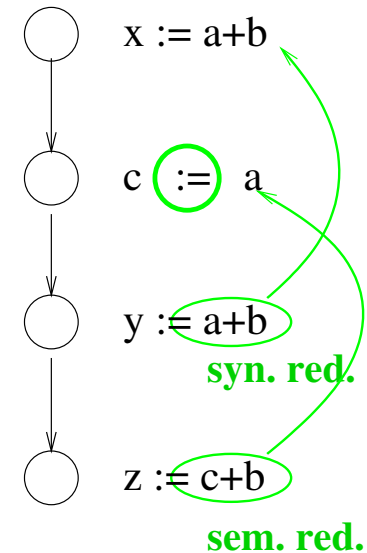
Refining the Design Space of CM-Algorithms Further...

Paradigm

- Intraprocedural
- Interprocedural
- Parallelism
- Predicated code
- ...

EH
AH, AS

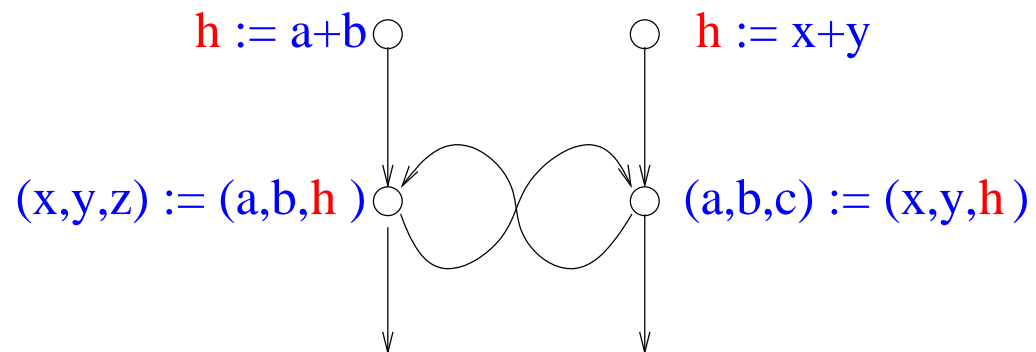
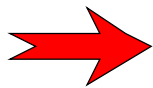
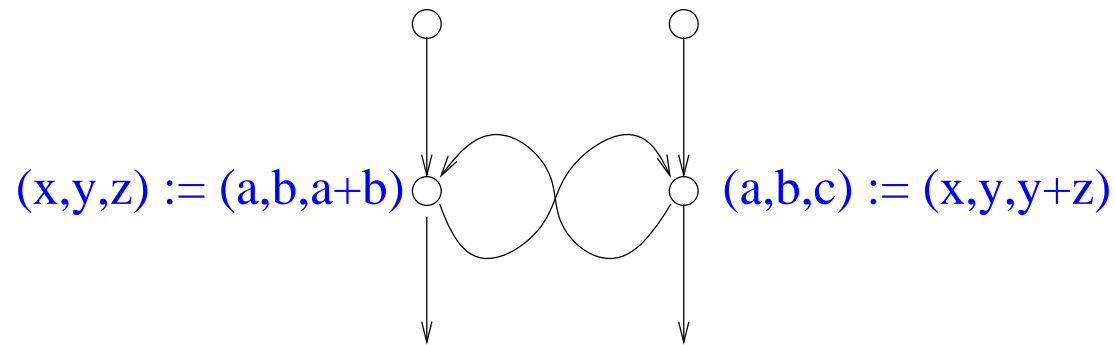
Syntactic
Semantic



Introducing semantics... !

Semantic Code Motion...

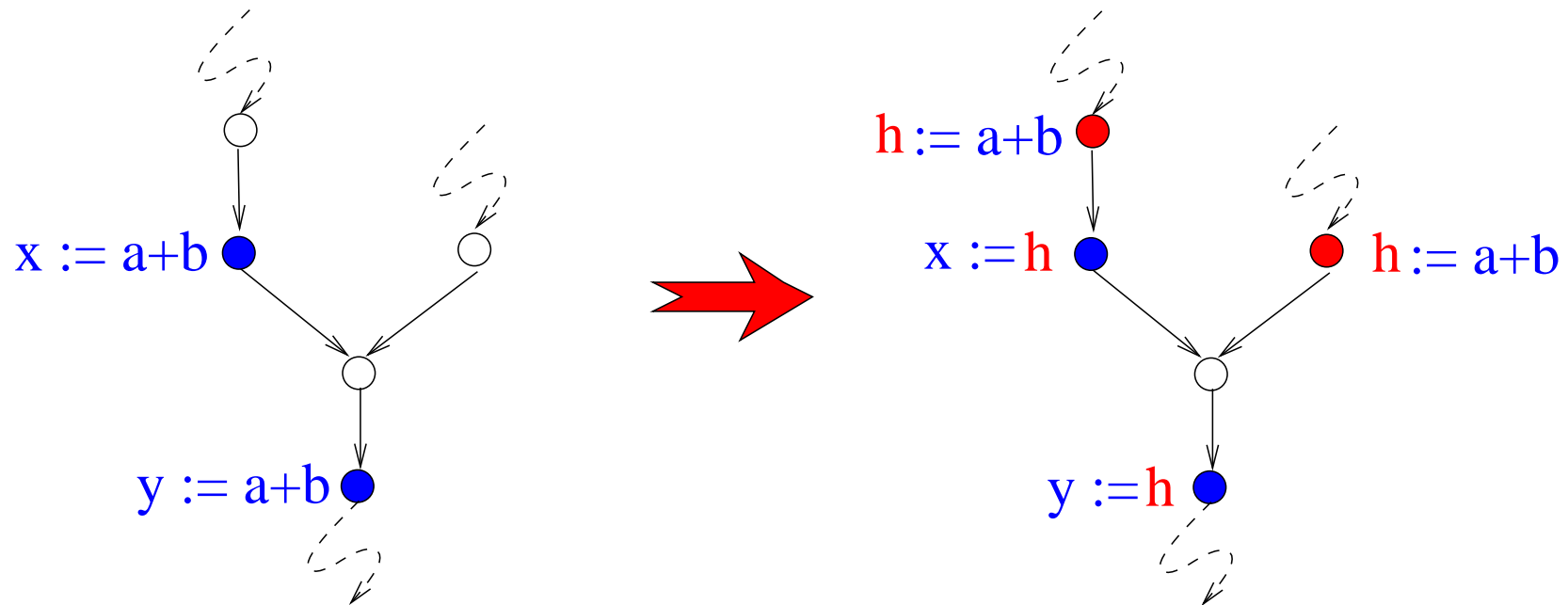
allows more powerful optimizations!



(example by B. Steffen, TAPSOFT'87)

In the following...

...we first focus on (syntactic) PRE(E), the basic variant of CM-based program optimizations.



**...while taking New Challenges of Program
Optimization into Account**

...there is more than speed!

1999 World Market for Microprocessors

Chip Category	Number Sold
Embedded 4-bit	2000 million
Embedded 8-bit	4700 million
Embedded 16-bit	700 million
Embedded 32-bit	400 million
DSP	600 million
Desktop 32/64-bit	150 million

... [David Tennenhouse](#) (Intel Director of Research). Keynote Speech at the *20th IEEE Real-Time Systems Symposium (RTSS'99)*, Phoenix, Arizona, December 1999.

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~ 2%

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Think of...

... domain-specific processors as used in embedded systems

- **Telecom**

- Cell phones, pagers, ...

- **Consumer Electronics**

- MP3 player, cameras, pocket games, ...

- **Automotive**

- GPS navigation, airbags, ...

- ...

Code for Embedded Systems

Requirements...

- Performance (often real-time constraints)
- Code size (system-on-chip, on-chip RAM/ROM)
- ...

For embedded systems...

...**code size** is often more critical than **speed**!

Code for Embedded Systems (Cont'd)

Requirements ...and how they are commonly addressed:

- Assembly programming
- Manual postpass optimizations

Shortcomings...

- Error-prone
- Extended time-to-market

... problems getting even worse with increasing complexity.

Hence, we observe...

...a trend towards HLL programming (C/C++)

Given this trend...

...how does **traditional** compiler and optimizer technology support the specific requirement profile of code for embedded systems?



Unfortunately, little.

As a Matter of Fact...

Traditional optimizations...

- ...are strongly biased towards performance optimization
- ...are not code-size sensitive and usually don't offer any control about their impact on code size

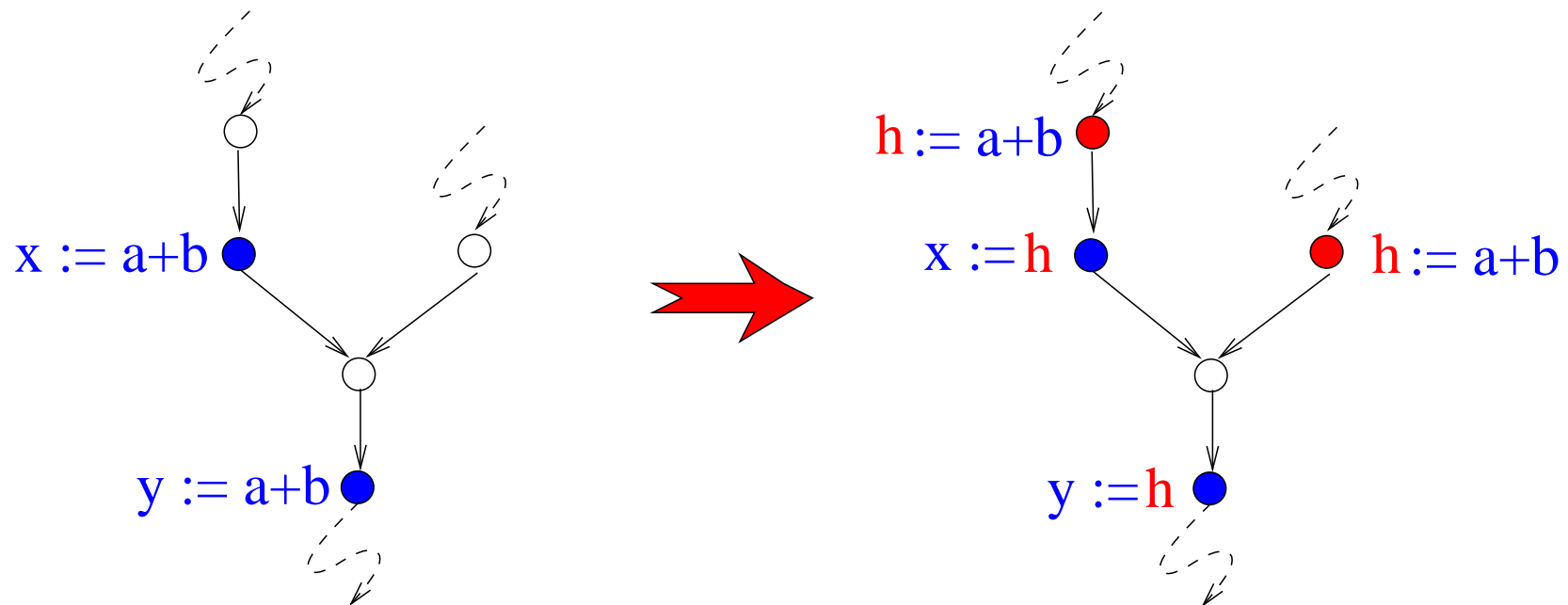
In the following, we demonstrate this considering

- **Partial Redundancy (Expression) Elimination (PR(E)E)**

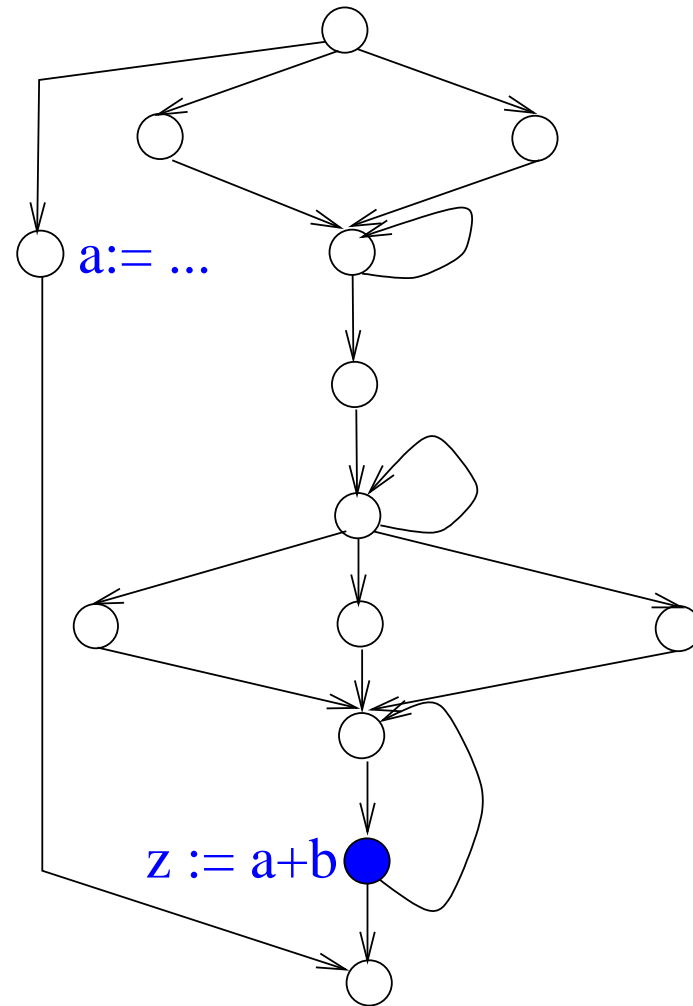
as example.

Recall the Essence of PRE

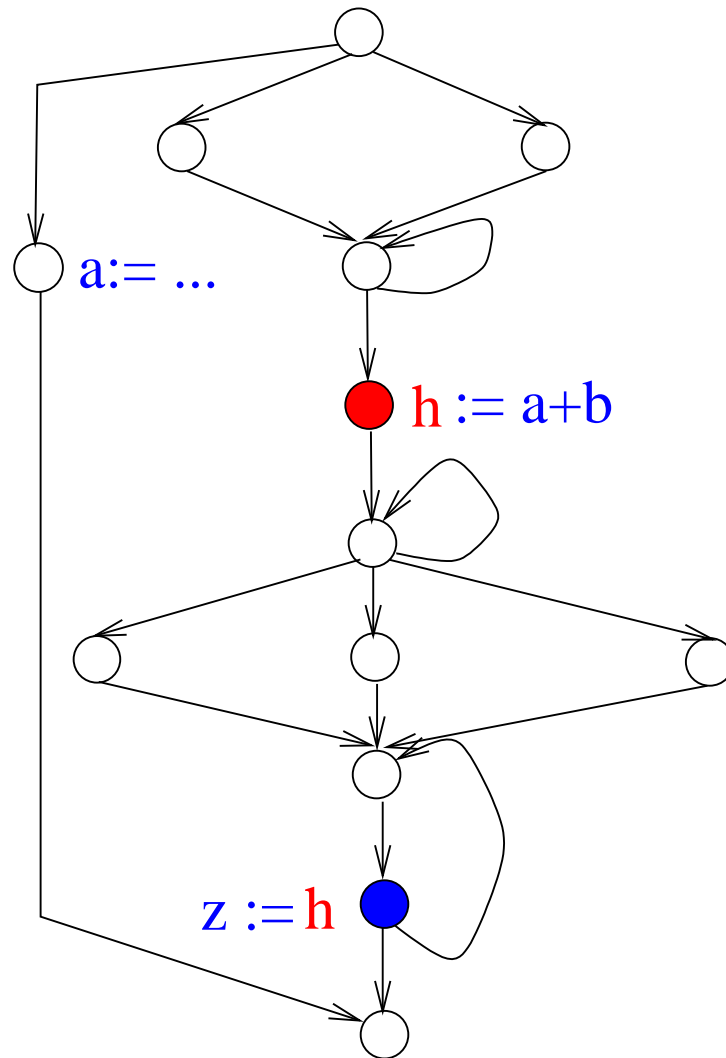
...essentially, PRE aims at avoiding recomputing values



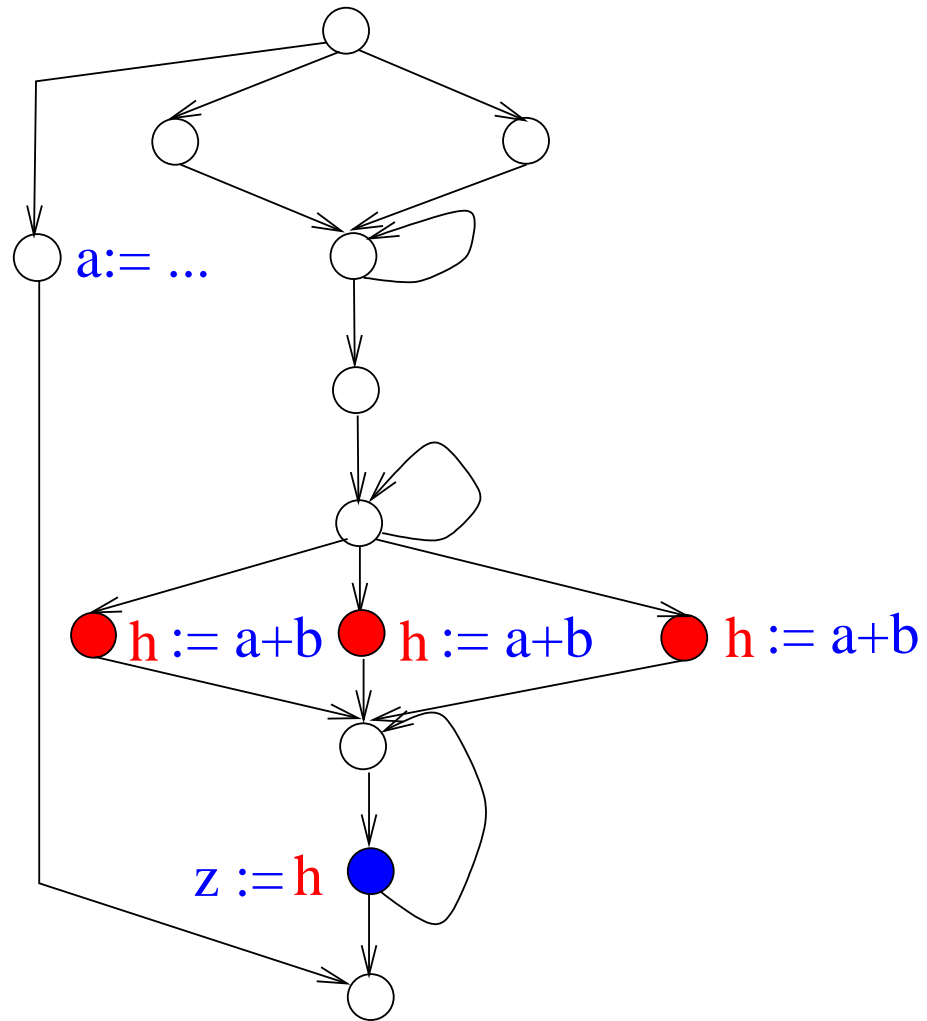
PRE – especially profitable if loops are involved...



Of course, we would like to have...



What we receive using a state-of-the-art compiler...



As we have observed already: Conceptually...

PRE can be considered a two-stage process...

1. Expression hoisting

...hoisting expressions to “earlier” safe computation points

2. Total redundancy elimination

...eliminating computations becoming totally redundant

Extreme Strategy – Earliestness Principle

Placing computations as early as possible...

- Theorem [Computational Optimality]

...hoisting expressions to their earliest safe computation points yields computationally optimal programs

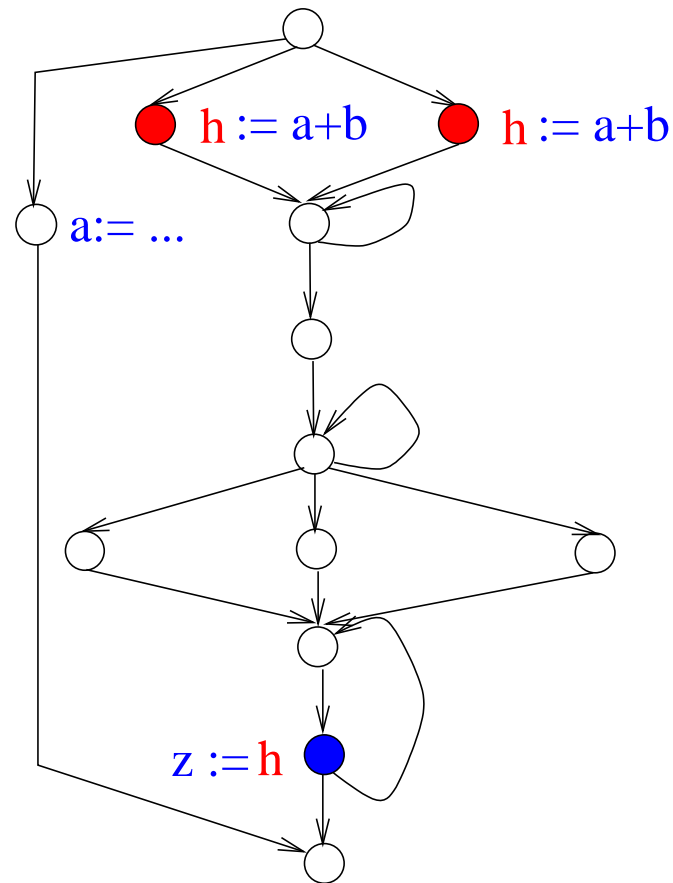
~> ...known as Busy Code Motion (PLDI'92, Knoop et al.)

...already known to Morel and Renvoise (though no theorem or proof).

Earliestness Principle

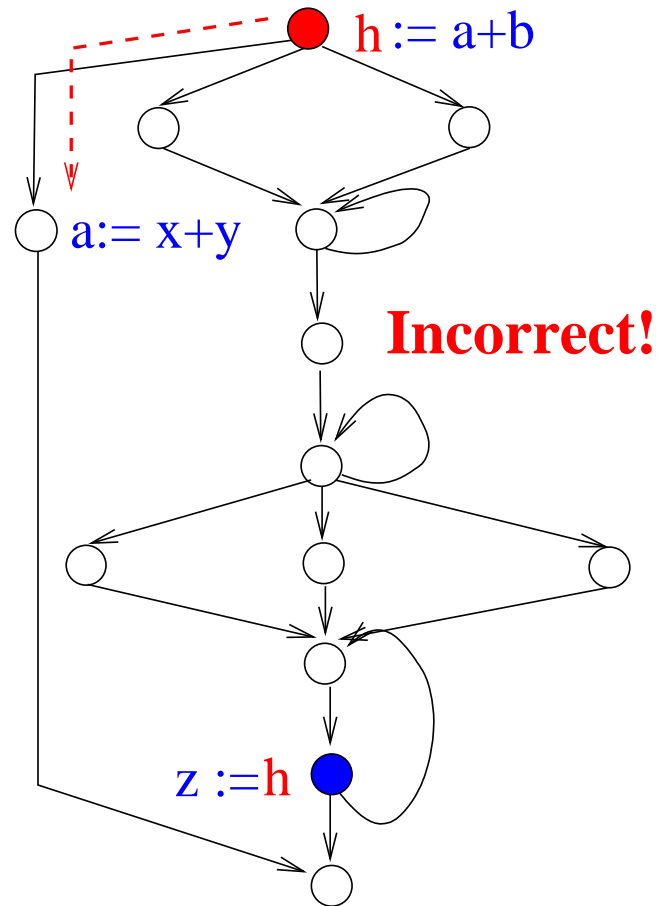
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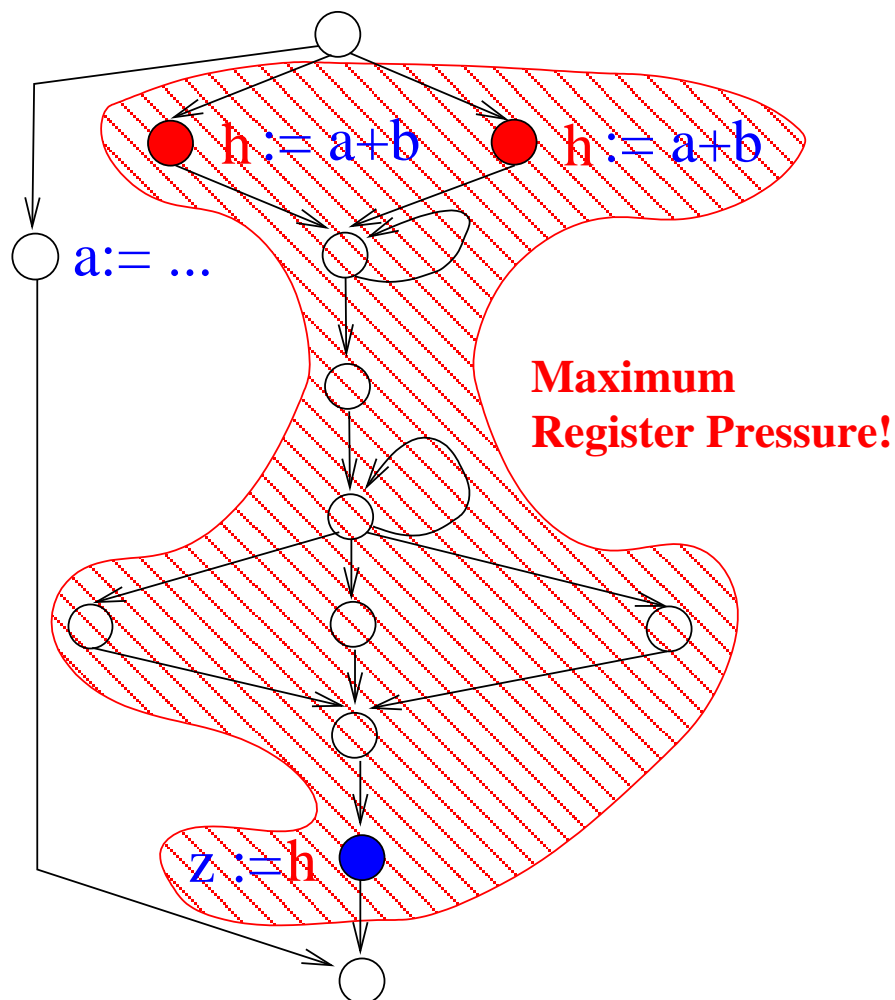
Note: Earliestness means in fact...

...as early as possible, but not earlier!



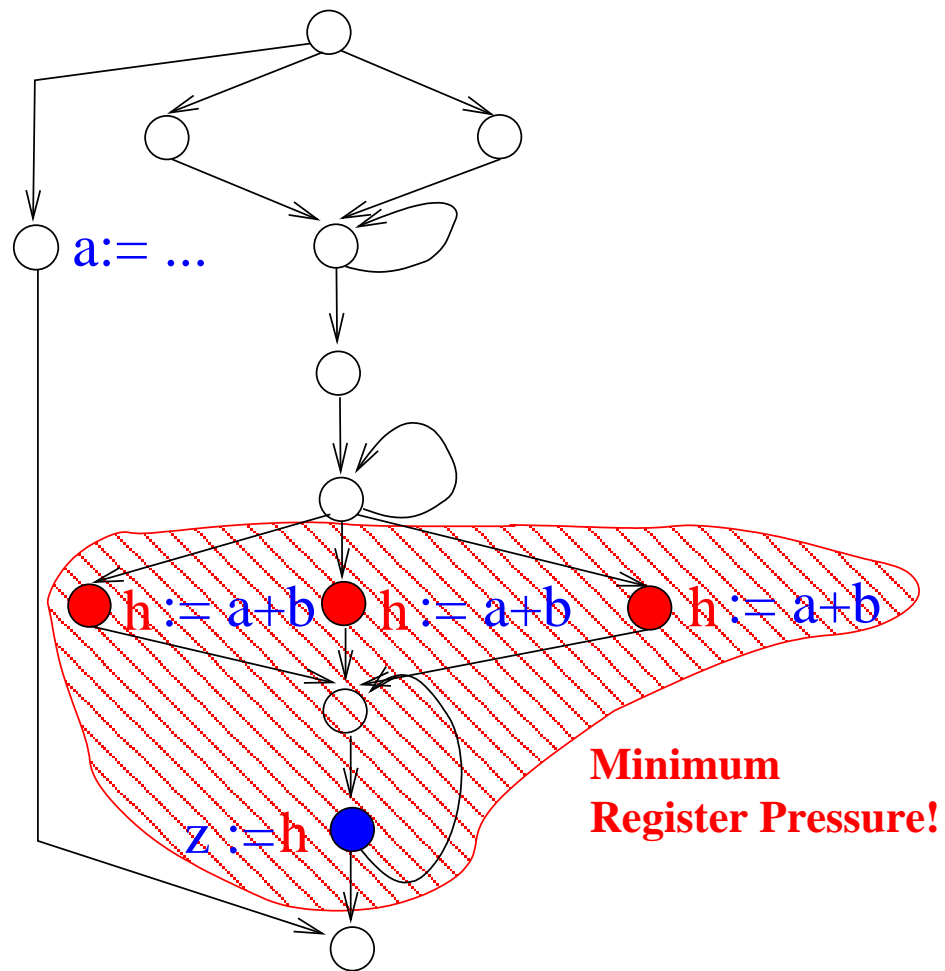
Earliestness Principle: Important Drawback

...computationally optimal, but maximum register pressure



For comparison, the previous program

...computationally optimal, too, but minimum register pressure!



Dual Extreme Strategy – Latestness Principle

Placing computations as late as possible...

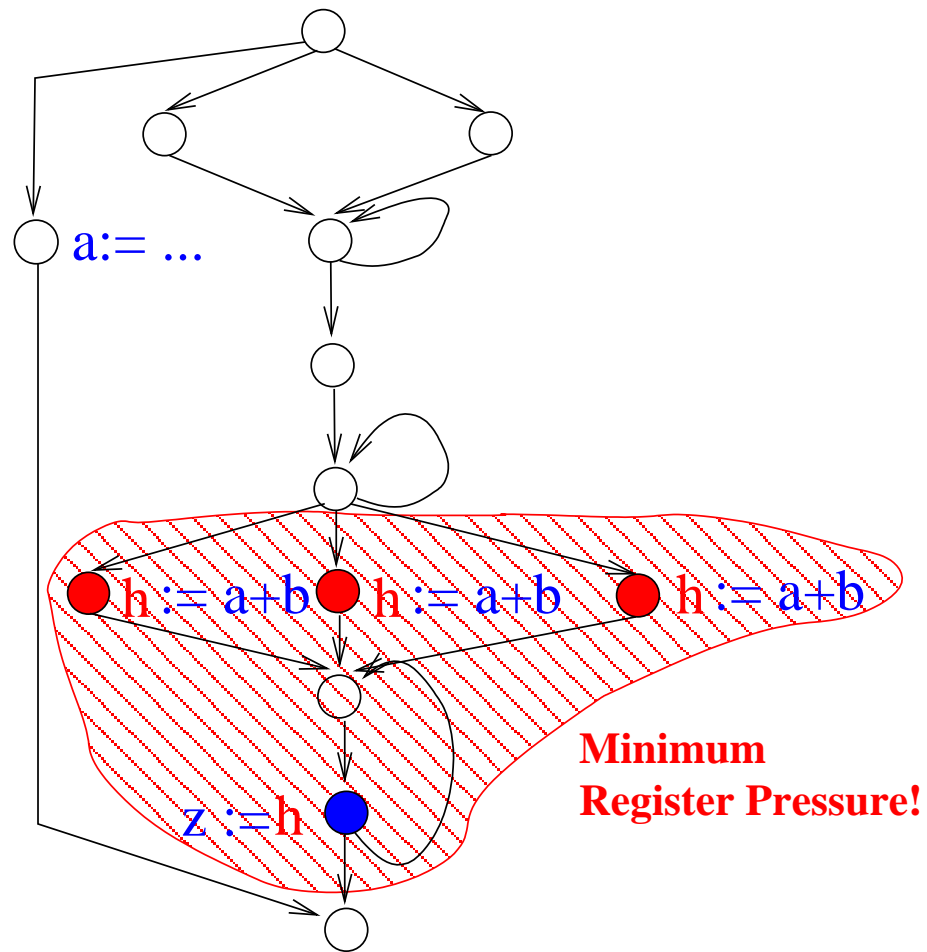
- Theorem [Optimality]

...hoisting expressions to their latest safe computation points yields computationally optimal programs with minimum register pressure

~> ...known as Lazy Code Motion (PLDI'92, Knoop et al.)

That's what we have seen...

LCM: ...computationally optimal with minimum register pressure!



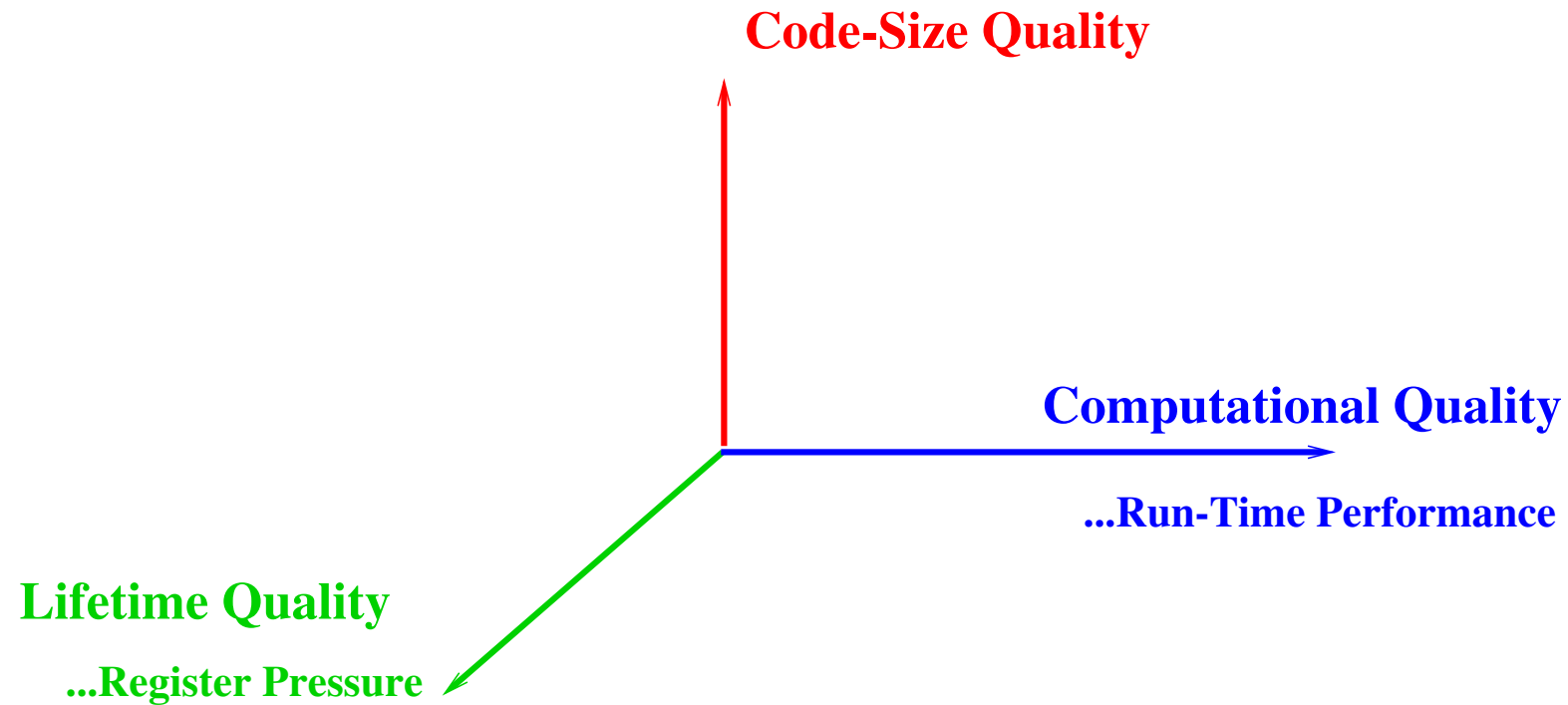
These days...

Lazy Code Motion is...

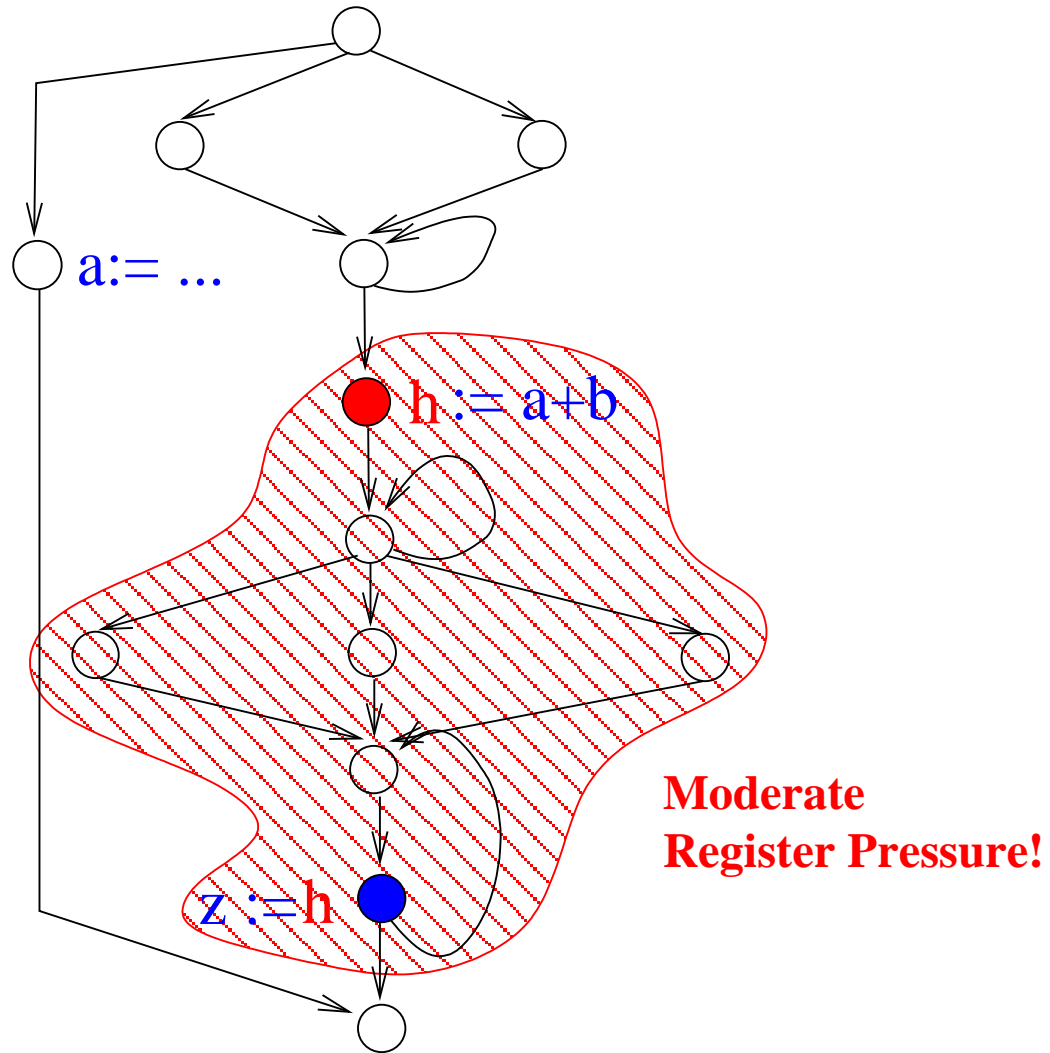
- ...the de-facto standard algorithm for **PRE** used in contemporary state-of-the-art compilers
 - Gnu compiler family
 - Sun Sparc compiler family
 - ...

This lecture...

...enhancing **LCM** to take a user's priorities into account!



...rendering possible this transformation, too:



Towards Code-Size Sensitive PRE...

- **Background: Classical PRE**

- ↪ **Busy CM (BCM) / Lazy CM (LCM)** (Knoop et al., PLDI'92)

- Received the *ACM SIGPLAN Most Influential PLDI Paper Award 2002 (for 1992)*
 - Selected for *“20 Years of the ACM SIGPLAN PLDI: A Selection”* (60 papers out of ca. 600 papers)

- **Code-Size Sensitive PRE** (Knoop et al., POPL'00)

- ↪ ...modular extension of **BCM/LCM**

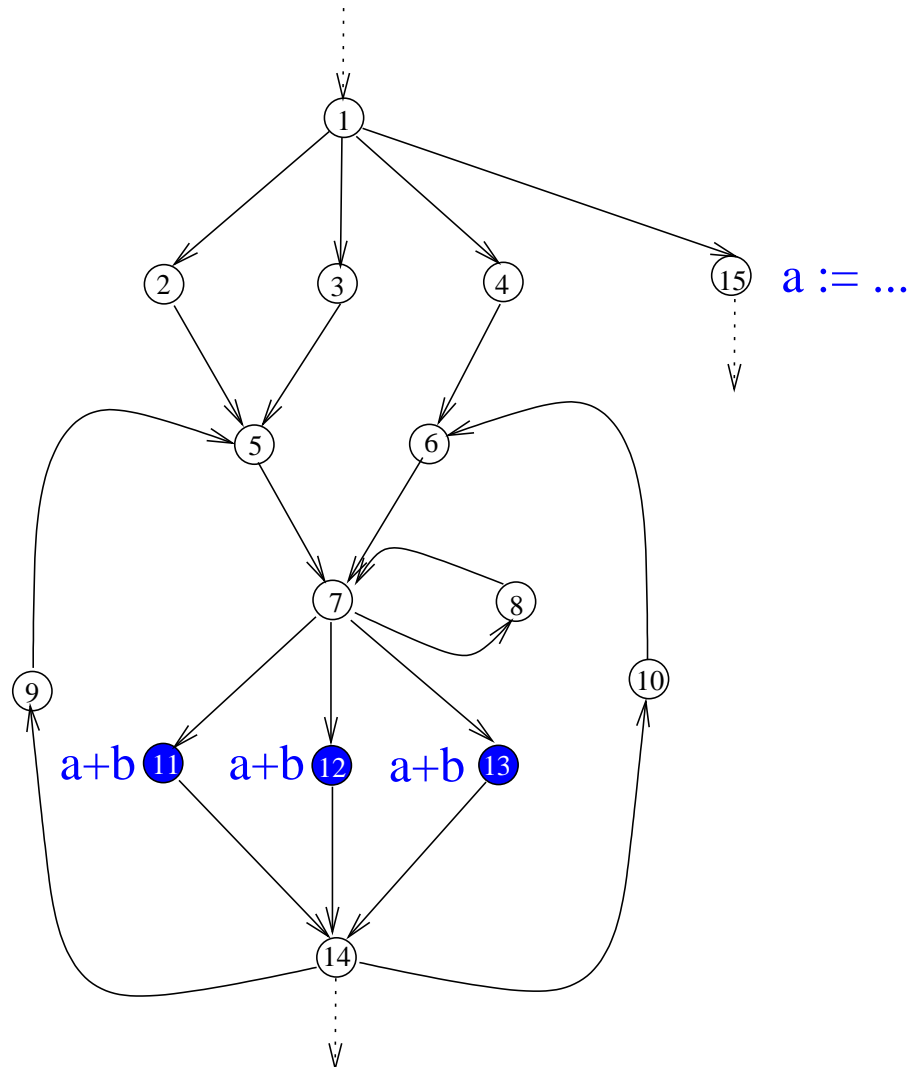
- * Modelling and Solving the Problem

- ...based on **graph-theoretical means**

- * Main Results

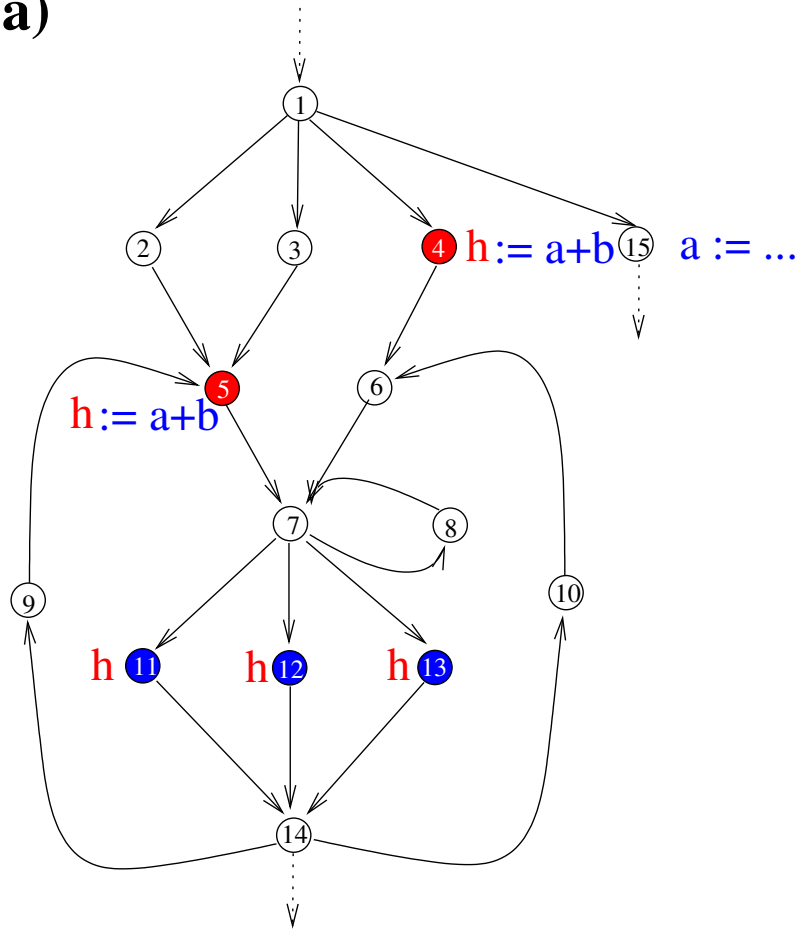
- ...**correctness, optimality**

The Running Example

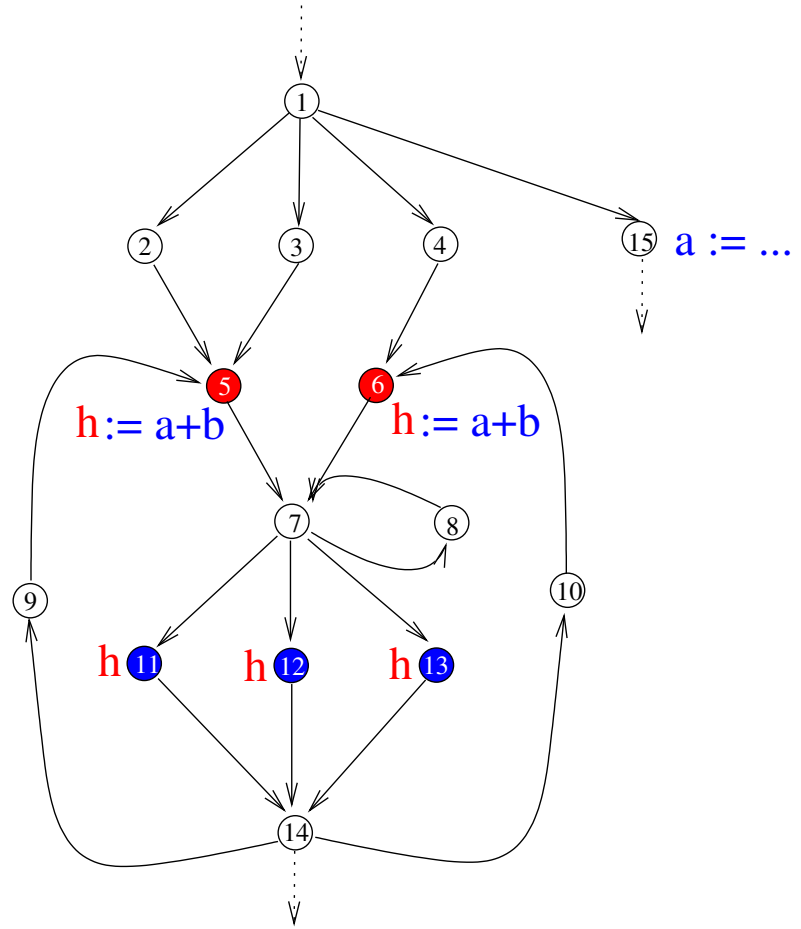


The Running Example (Cont'd)

a)



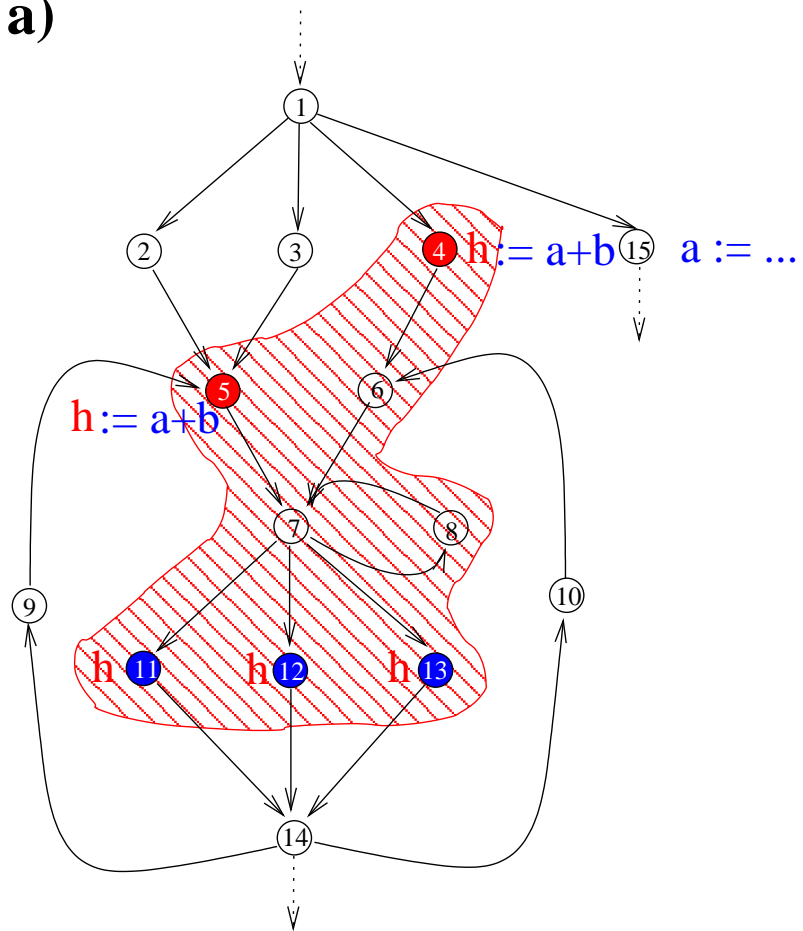
b)



Two Code-size Optimal Programs

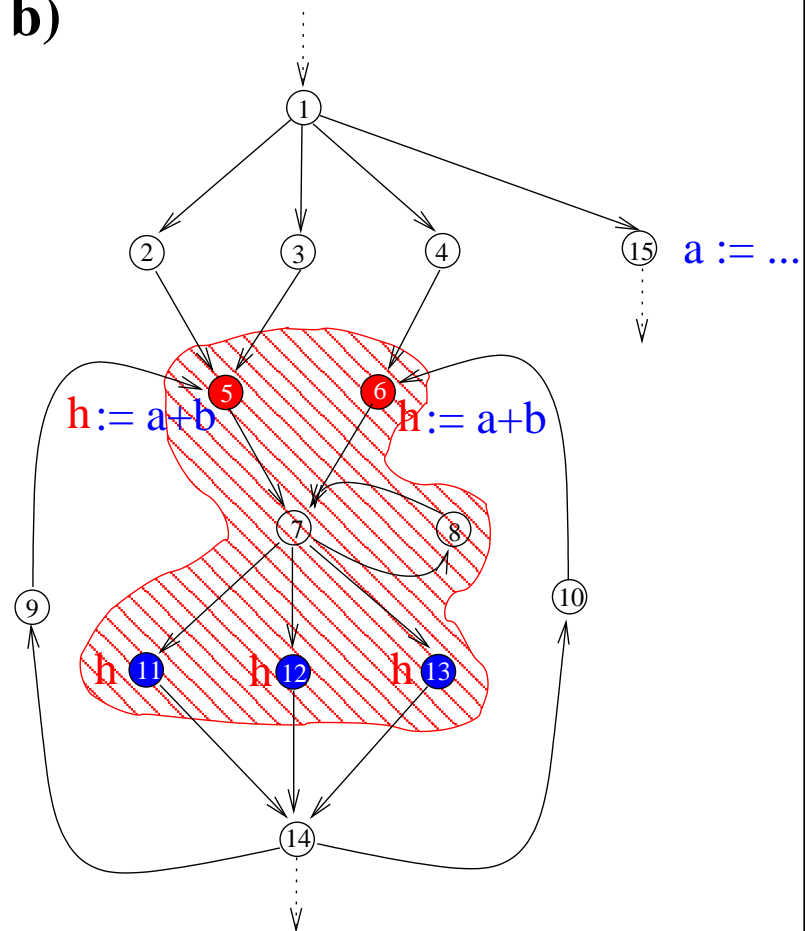
The Running Example (Cont'd)

a)



SQ > **CQ** > **LQ**

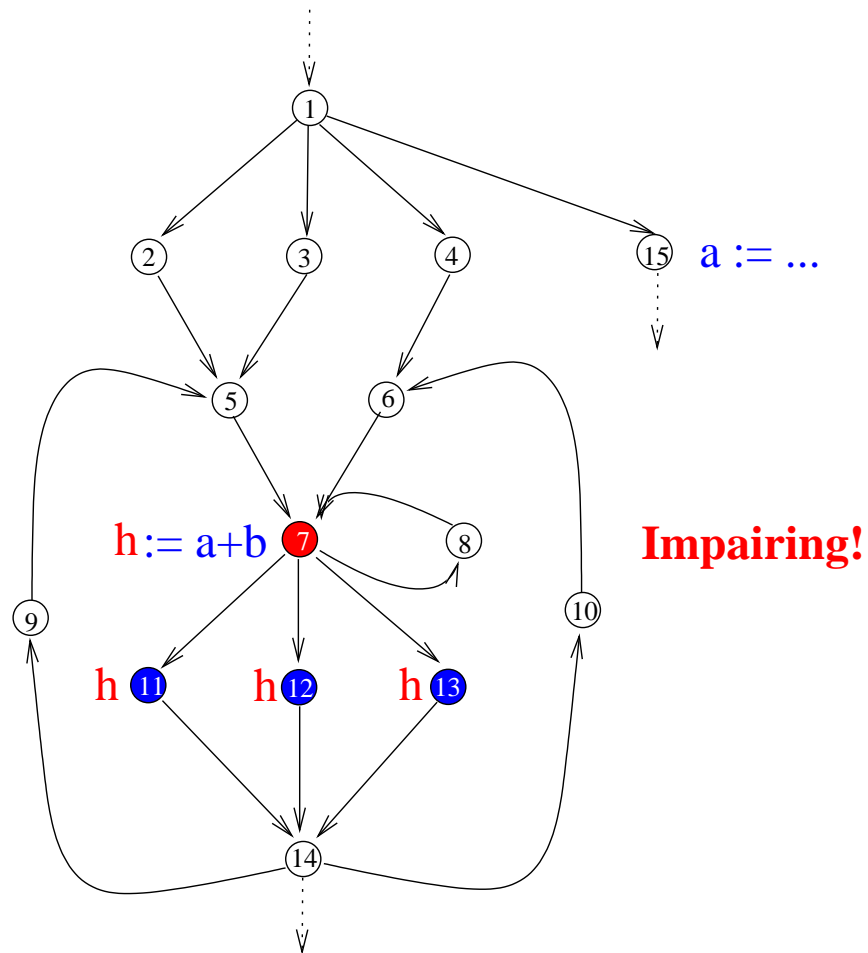
b)



SQ > **LQ** > **CQ**

The Running Example (Cont'd)

Note, we do not want the following transformation: It's **no** option!



Code-Size Sensitive PRE

~> The Problem

...how to get a **code-size minimal** placement of computations, i.e., a placement which is

- admissible (semantics & performance preserving)
- **code-size minimal**

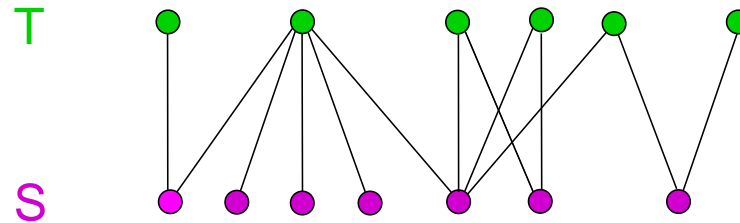
~> Solution: A Fresh Look at PRE

...considering PRE a **trade-off** problem: trading the original computations against newly inserted ones!

~> The Clou: Use Graph Theory!

...reducing the **trade-off** problem to the computation of **tight sets** in **bipartite graphs** based on **maximum matchings**!

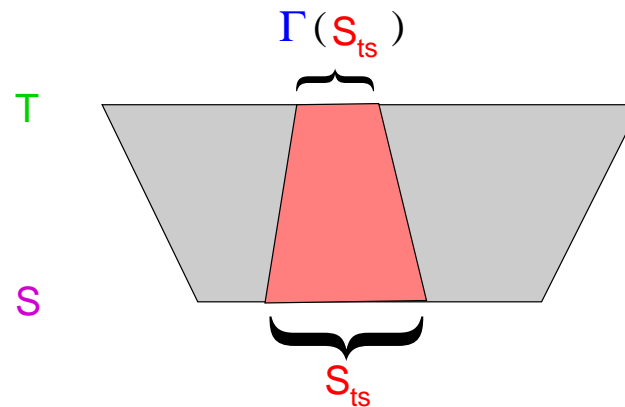
Bipartite Graph



Tight Set

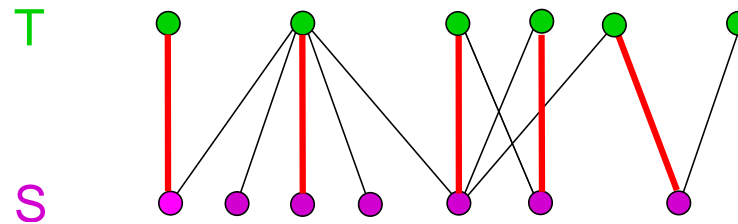
... of a bipartite graph $(S \cup T, E)$ is a subset $S_{ts} \subseteq S$ such that

$$\forall S' \subseteq S. |S_{ts}| - |\Gamma(S_{ts})| \geq |S'| - |\Gamma(S')|$$



Two Variants: (1) **Largest** Tight Sets (2) **Smallest** Tight Sets

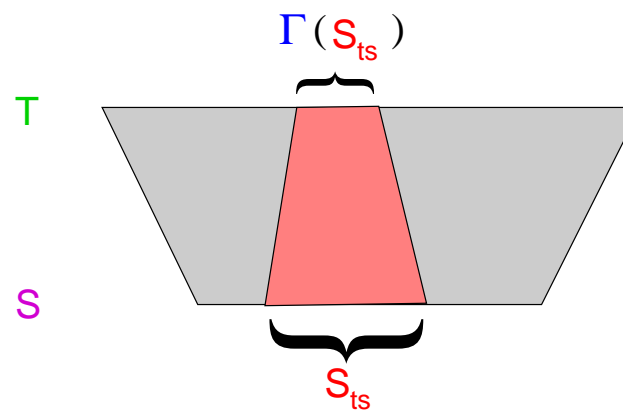
Bipartite Graph



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Two Variants: (1) **Largest** Tight Sets (2) **Smallest** Tight Sets

Apparently

Off-the-shelf algorithms of **graph theory** can be used to compute...

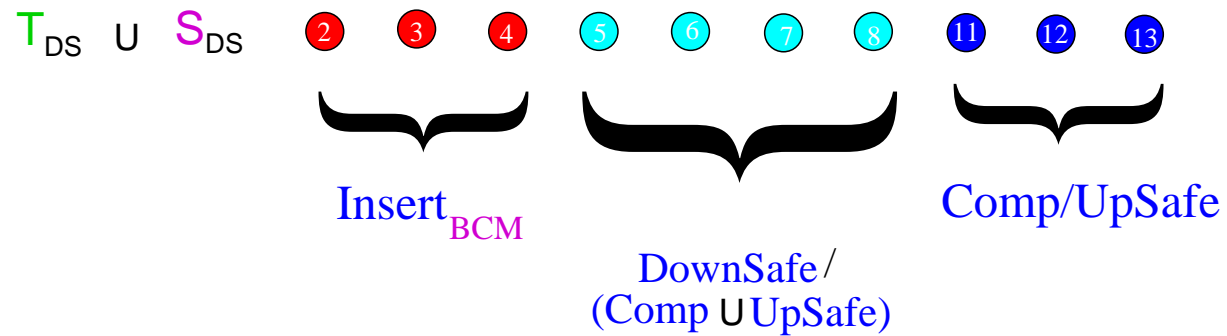
- **Maximum matchings** and
- **Tight sets**

Hence, our **PRE** problem boils down to...

...constructing the bipartite graph modelling the problem!

Modelling the Trade-Off Problem

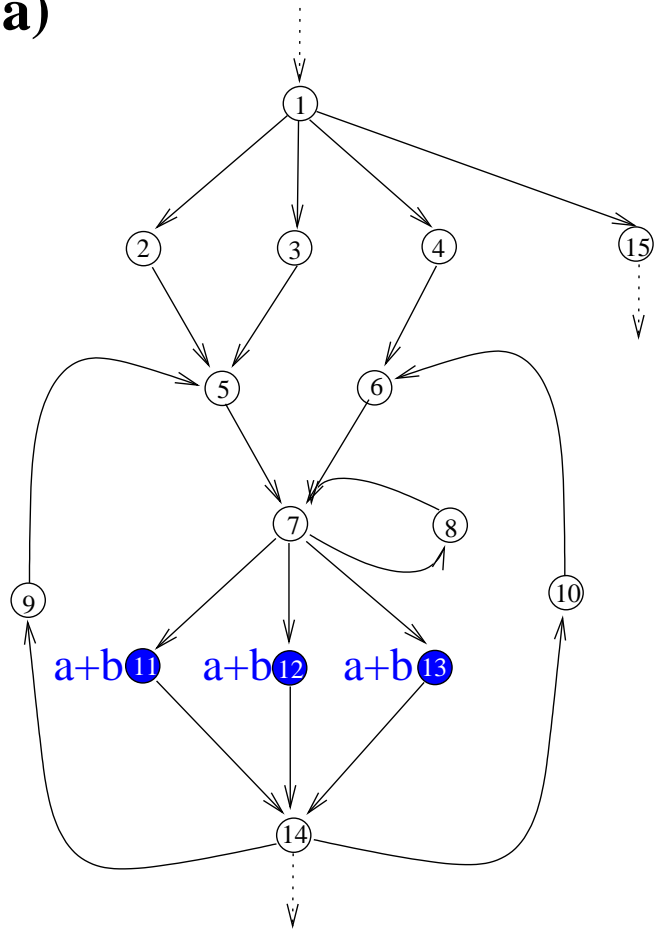
The Set of Nodes



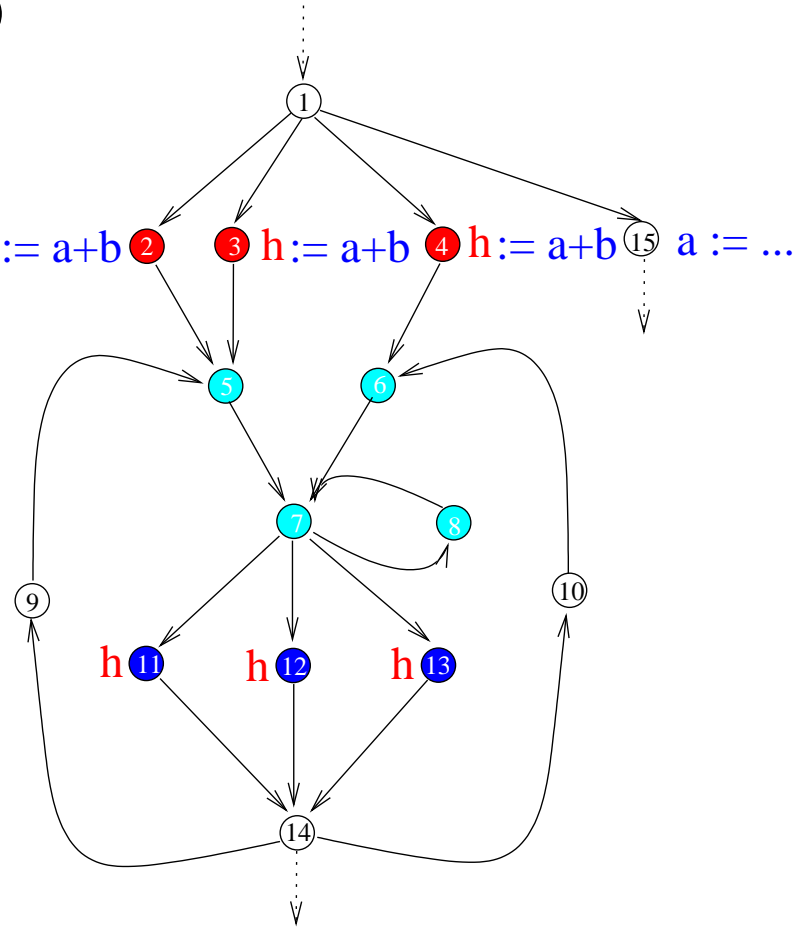
The Set of Edges...

The Set of Nodes

a)

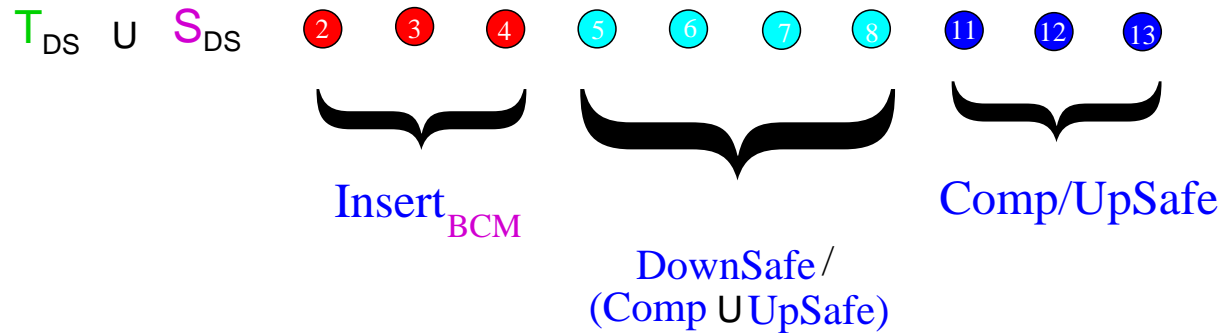


b)

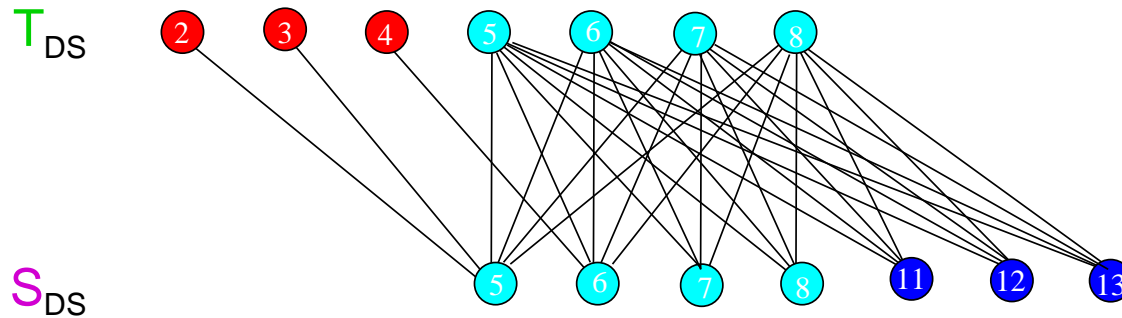


Modelling the Trade-Off Problem

The Set of Nodes



The Bipartite Graph



The Set of Edges ... $\forall n \in S_{DS} \forall m \in T_{DS}$.

$$\{n, m\} \in E_{DS} \iff_{df} m \in \text{Closure}(\text{pred}(n))$$

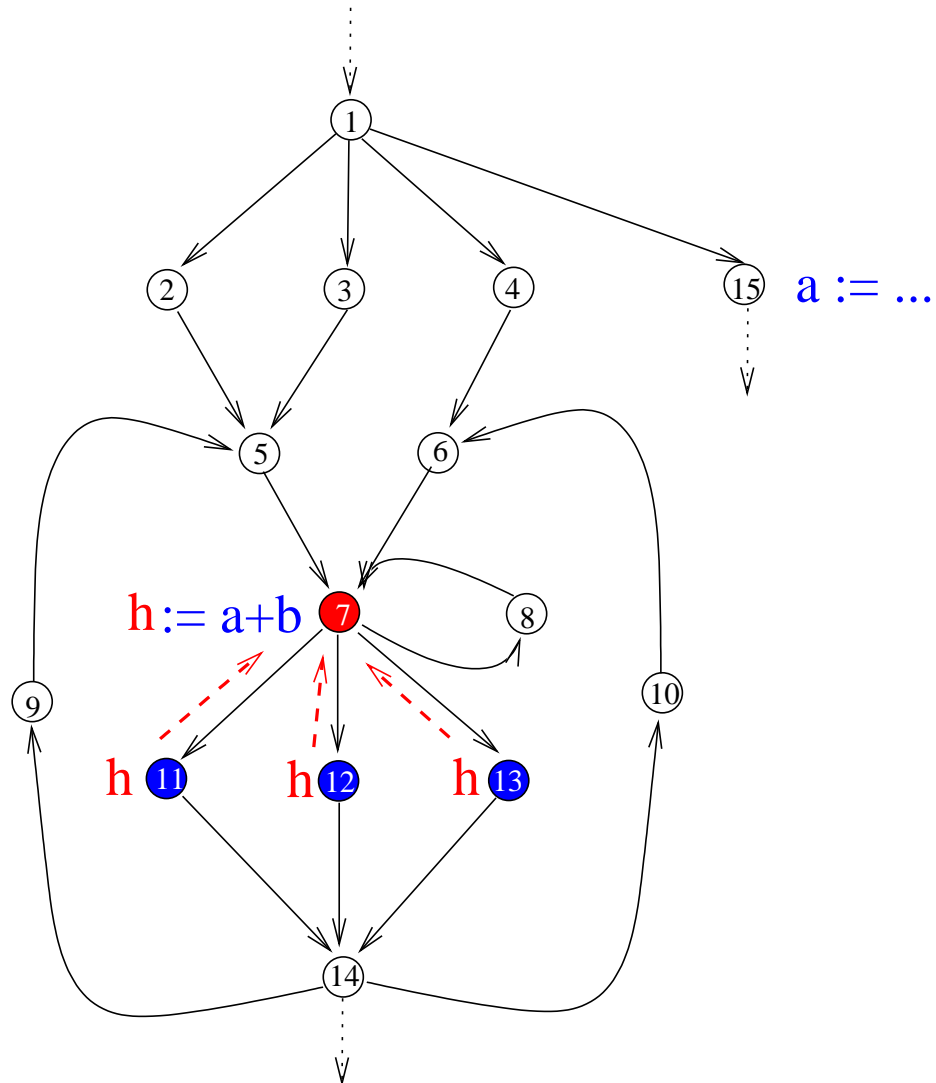
DownSafety Closures

DownSafety Closure

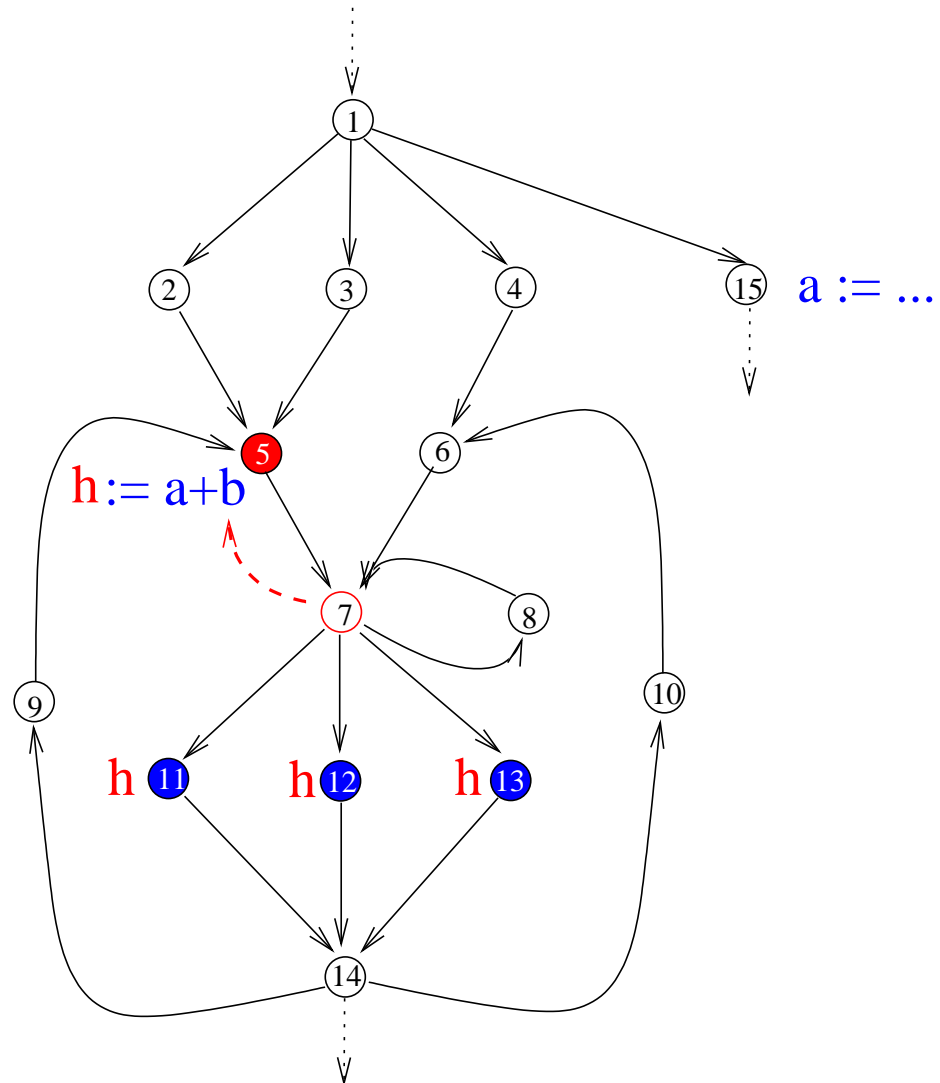
For $n \in \text{DownSafe/UpSafe}$ the DownSafety Closure $\text{Closure}(n)$ is the smallest set of nodes satisfying

1. $n \in \text{Closure}(n)$
2. $\forall m \in \text{Closure}(n) \setminus \text{Comp. succ}(m) \subseteq \text{Closure}(n)$
3. $\forall m \in \text{Closure}(n). \text{pred}(m) \cap \text{Closure}(n) \neq \emptyset \Rightarrow \text{pred}(m) \setminus \text{UpSafe} \subseteq \text{Closure}(n)$

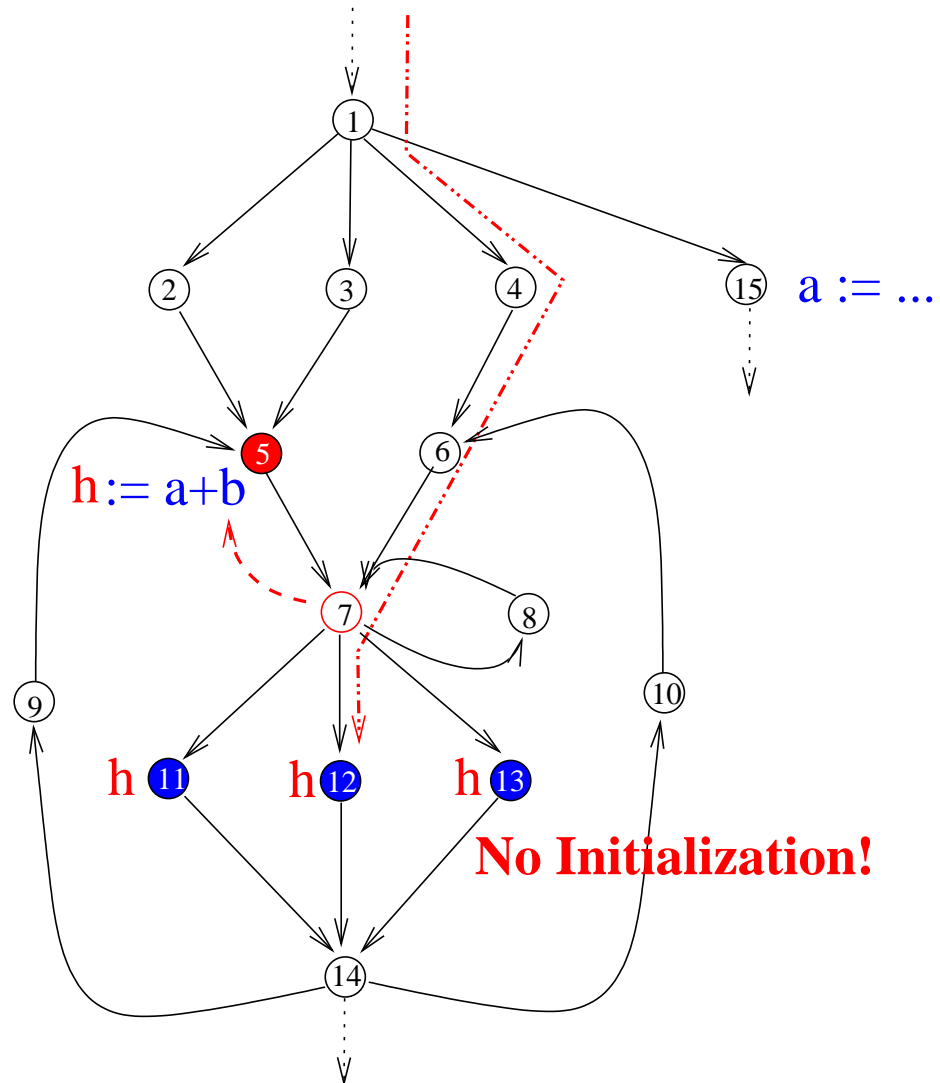
DownSafety Closures – The Very Idea 1(4)



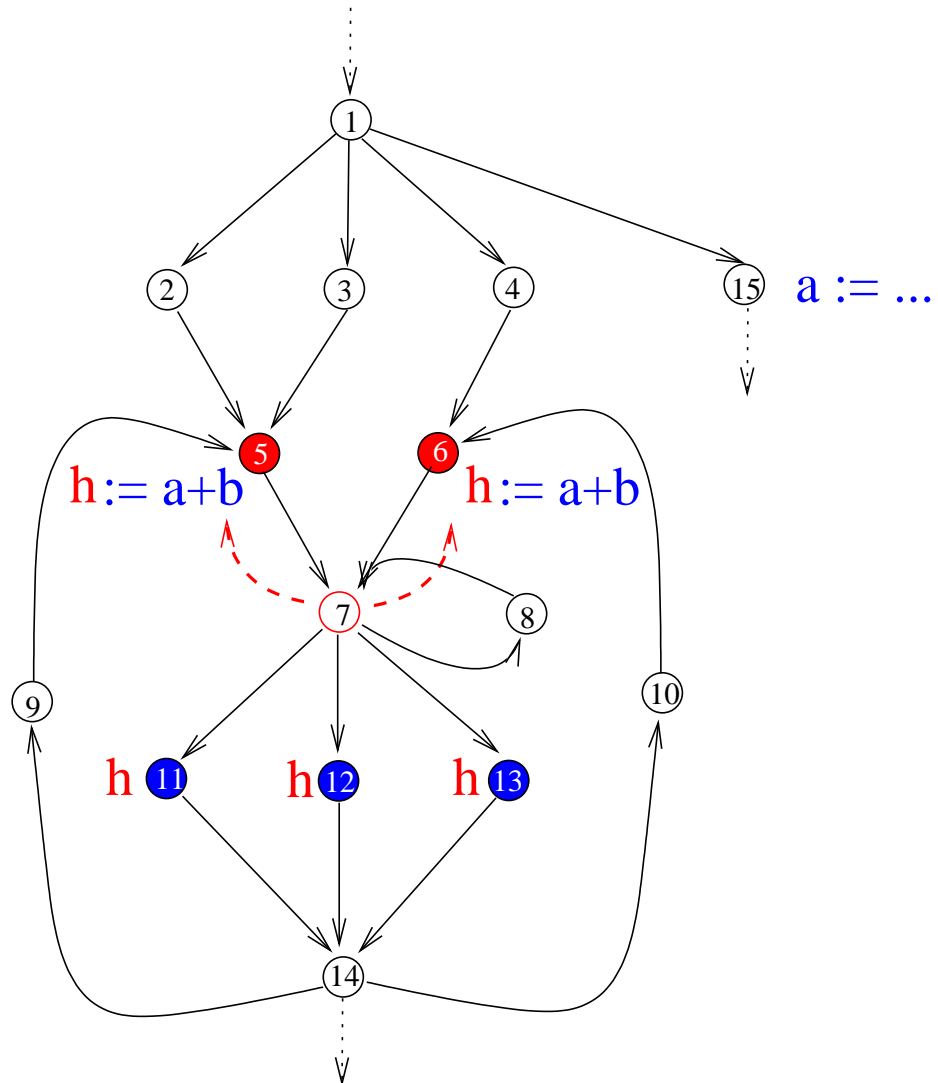
DownSafety Closures – The Very Idea 2(4)



DownSafety Closures – The Very Idea 3(4)



DownSafety Closures – The Very Idea 4(4)



DownSafety Closures

DownSafety Closure

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DownSafety Regions

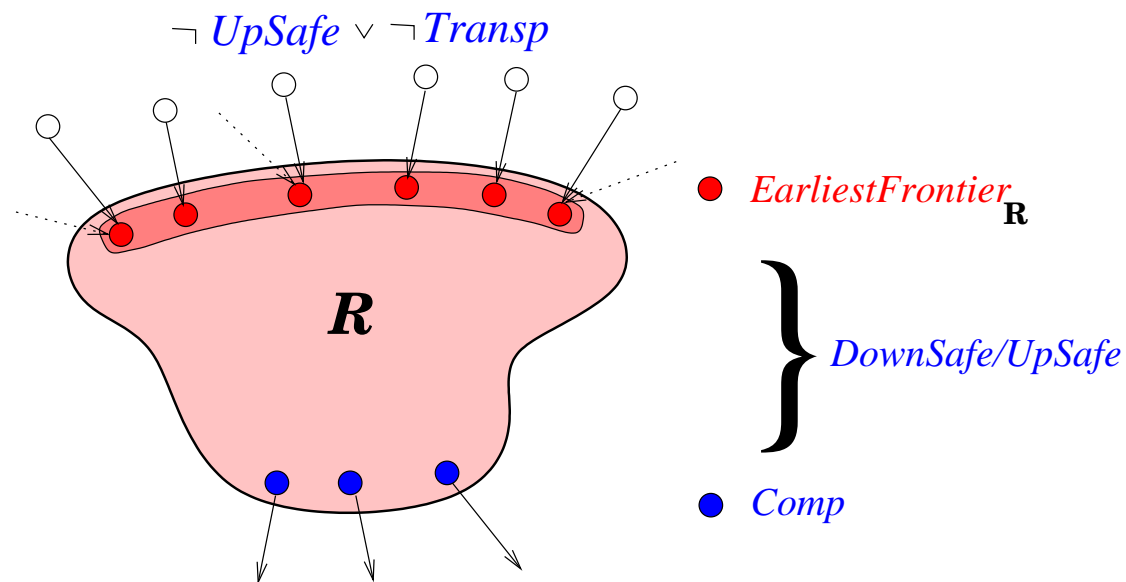
Some subsets of nodes are distinguished. We call each of these sets a **DownSafety Region**...

- A set $\mathcal{R} \subseteq N$ of nodes is a **DownSafety Region** if and only if
 1. $Comp \setminus UpSafe \subseteq \mathcal{R} \subseteq DownSafe \setminus UpSafe$
 2. $Closure(\mathcal{R}) = \mathcal{R}$

Fundamental...

Insertion Theorem

Insertions of **admissible** PRE-Transformations are always at “**earliest-frontiers**” of **DownSafety** regions.



...characterizes for the first time all **semantics preserving PRE-transformations**.

The Key Questions

...concerning correctness and optimality:

1. Where to insert computations, why is it correct?
2. What is the impact on the code size?
3. Why is it optimal, i.e., code-size minimal?

...three theorems answering one of these questions each.

Main Results / First Question

1. Where to insert computations, why is it correct?

Intuitively, at the earliestness frontier of the DS-region induced by the tight set...

Theorem 1 [Tight Sets: Insertion Points]

Let $TS \subseteq S_{DS}$ be a tight set.

Then $\mathcal{R}_{TS} =_{df} \Gamma(TS) \cup (Comp \setminus UpSafe)$

is a DownSafety Region with $Body_{\mathcal{R}_{TS}} = TS$

Correctness

...immediate corollary of Theorem 1 and Insertion Theorem

Main Results / Second Question

2. What is the impact on the code size?

Intuitively, the difference between computations inserted and replaced...

Theorem 2 [DownSafety Regions: Space Gain]

Let \mathcal{R} be a DownSafety Region

with $Body_{\mathcal{R}} =_{df} \mathcal{R} \setminus EarliestFrontier_{\mathcal{R}}$

Then

- **Space Gain of Inserting at EarliestFrontier $_{\mathcal{R}}$:**

$$|Comp \setminus UpSafe| - |EarliestFrontier_{\mathcal{R}}| =$$

$$|Body_{\mathcal{R}}| - |\Gamma(Body_{\mathcal{R}})| \quad df = defic(Body_{\mathcal{R}})$$

Main Results / Third Question

3. Why is it optimal, i.e., code-size minimal?

Due to an inherent property of tight sets (non-negative deficiency!)...

Optimality Theorem [The Transformation]

Let $TS \subseteq S_{DS}$ be a **tight set**.

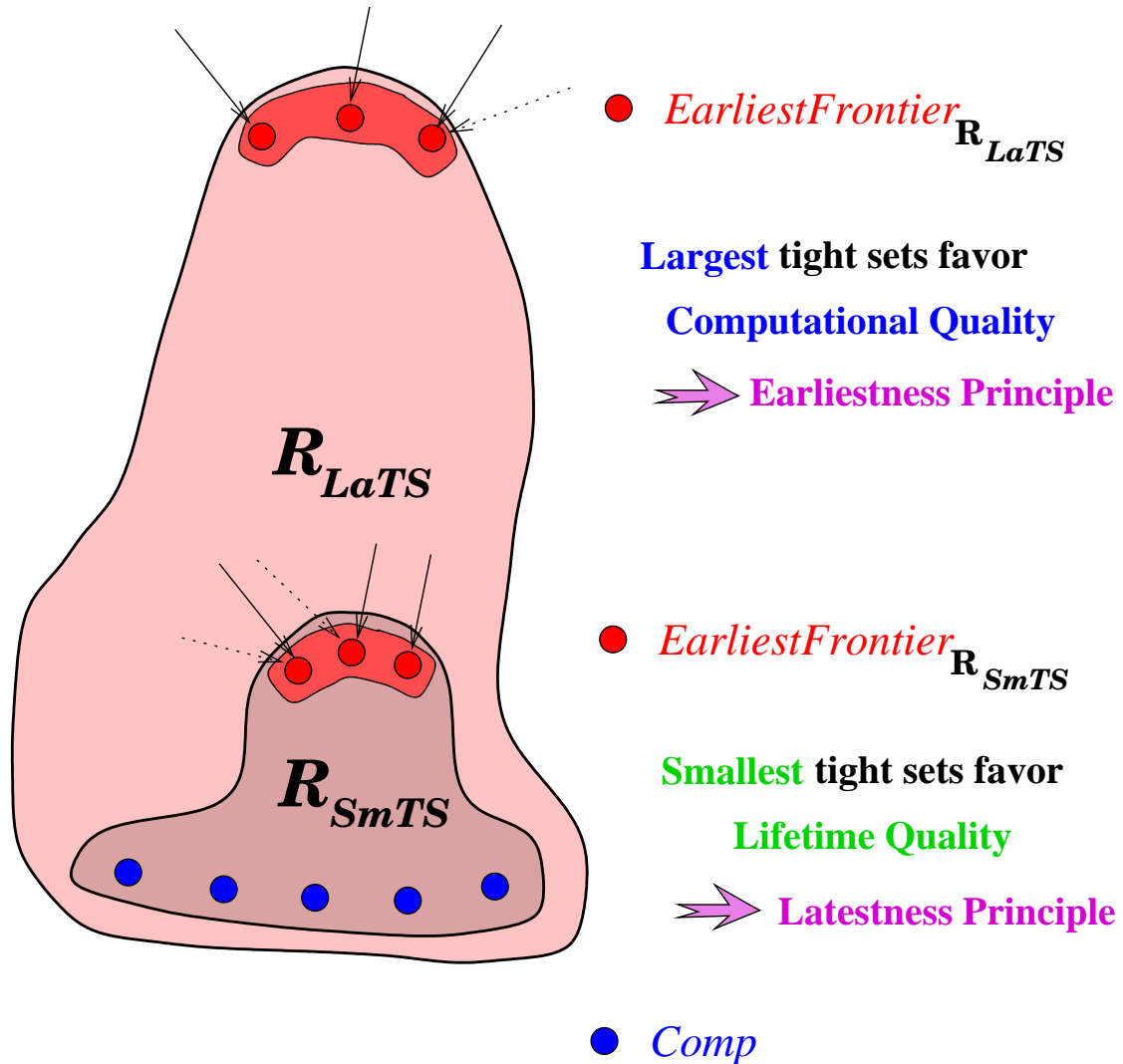
- **Insertion Points:**

$$\text{Insert}_{SpCM} =_{df} \text{EarliestFrontier}_{\mathcal{R}_{TS}} = \mathcal{R}_{TS} \setminus TS$$

- **Space Gain:**

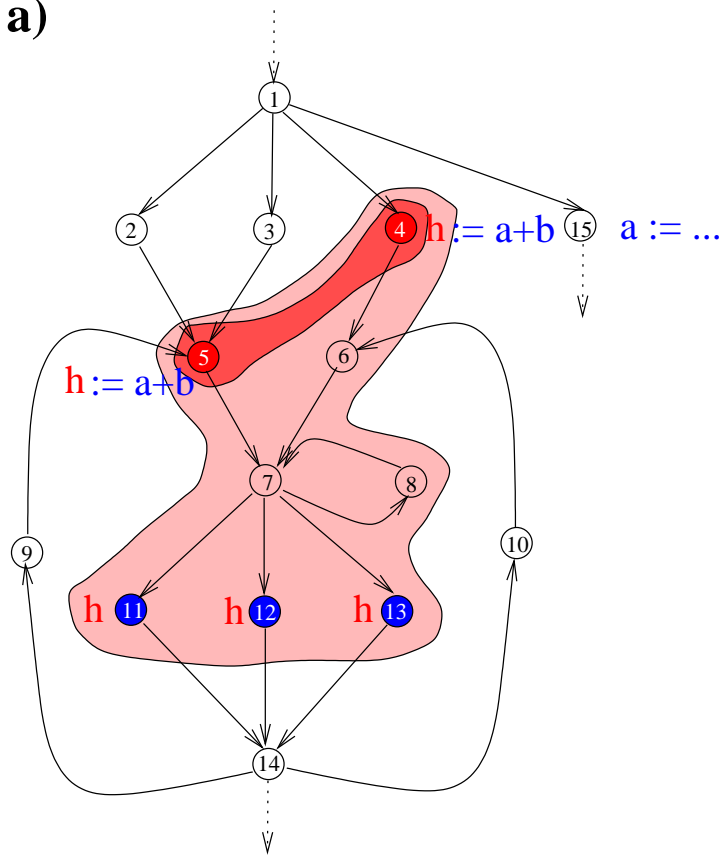
$$\text{defic}(TS) =_{df} |TS| - |\Gamma(TS)| \geq 0 \text{ max.}$$

Largest vs. Smallest Tight Sets: The Impact



Recall the Running Example

a)

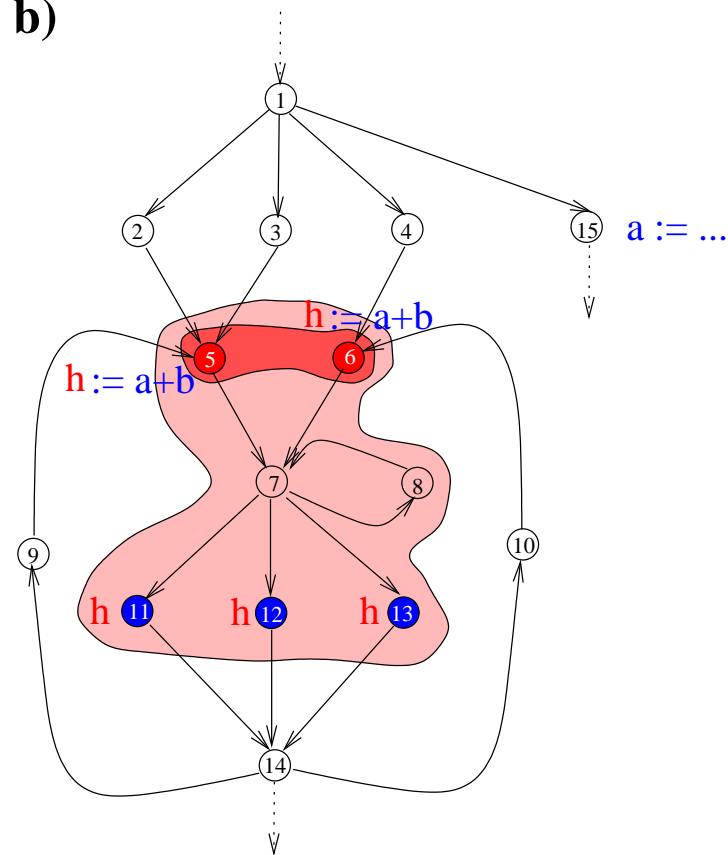


Largest Tight Set

(SQ > CQ)

Earliestness Principle

b)



Smallest Tight Set

(SQ > LQ)

Latestness Principle

Code-Size Sensitive PRE at a Glance

Preprocess

- **Optional:** Perform **LCM** (3 GEN/KILL-DFAs)
- Compute Predicates of **BCM** for **G** resp. **LCM (G)** (2 GEN/KILL-DFAs)



Main Process

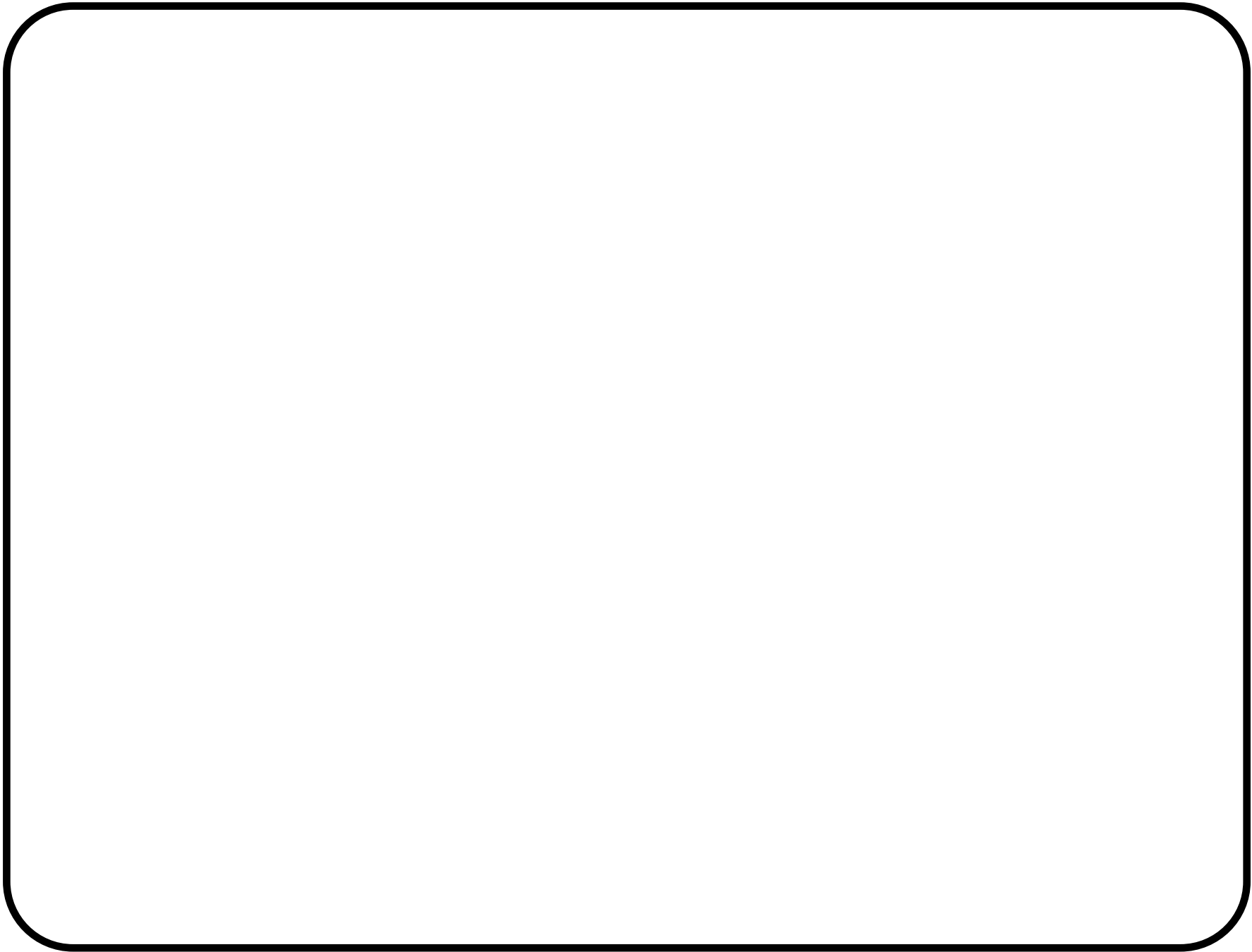
Reduction Phase

- **Construct Bipartite Graph**
- **Compute Maximum Matching**



Optimization Phase

- **Compute Largest/Smallest Tight Set**
- **Determine Insertion Points**



Choice of Priority	Apply	To	Using	Yields	Auxiliary Information Required
\mathcal{LQ}	Not meaningful: The identity, i.e., G itself is optimal!				
\mathcal{SQ}	Subsumed by $\mathcal{SQ} > \mathcal{CQ}$ and $\mathcal{SQ} > \mathcal{LQ}$!				
\mathcal{CQ}	BCM	G			UpSafe(G), DownSafe(G)
$\mathcal{CQ} > \mathcal{LQ}$	LCM	G		LCM(G)	UpSafe(G), DownSafe(G), Delay(G)
$\mathcal{SQ} > \mathcal{CQ}$	SpCM	G	Largest tight set	SpCM _{LTS} (G)	UpSafe(G), DownSafe(G)
$\mathcal{SQ} > \mathcal{LQ}$	SpCM	G	Smallest tight set		UpSafe(G), DownSafe(G)
$\mathcal{CQ} > \mathcal{SQ}$	SpCM	LCM(G)	Largest tight set		UpSafe(G), DownSafe(G), Delay(G) UpSafe(LCM(G)), DownSafe(LCM(G))
$\mathcal{CQ} > \mathcal{SQ} > \mathcal{LQ}$	SpCM	LCM(G)	Smallest tight set		UpSafe(G), DownSafe(G), Delay(G) UpSafe(LCM(G)), DownSafe(LCM(G))
$\mathcal{SQ} > \mathcal{CQ} > \mathcal{LQ}$	SpCM	DL(SpCM _{LTS} (G))	Smallest tight set		UpSafe(G), DownSafe(G), Delay(SpCM _{LTS} (G)), UpSafe(DL(SpCM _{LTS} (G))), DownSafe(DL(SpCM _{LTS} (G)))

Conclusions, Perspectives

A brief survey of PRE...

- 1958: *...first glimpse of PRE*
 - ~> Ershov's work on *On Programming of Arithmetic Operations*.
- **1979**: *...origin of contemporary PRE*
 - ~> Morel/Renvoise's seminal work on PRE
- **1992**: *...LCM* [Knoop et al., PLDI'92]
 - ~> ...first to achieve **comp. optimality with minimum register pressure**
 - ~> ...first to **rigorously be proven correct and optimal**
- **2000**: *...origin of code-size sensitive PRE* [Knoop et al., POPL 2000]
 - ~> ...first to allow **prioritization of goals**
 - ~> ...**rigorously be proven correct and optimal**
 - ~> ...first to bridge the gap between traditional compilation and compilation for embedded systems

Conclusions, Perspectives (Cont'd)

- ca. since 1997: *...a new strand of research on PRE*
 - ~> Speculative PRE: Gupta, Horspool, Soffa, Xue, Scholz, Knoop,...
- **2005**: *...another fresh look at PRE (as maximum flow problem)*
 - ~> Unifying PRE and Speculative PRE [Jingling Xue and J. Knoop]

Another Look at the History of PRE

- < 1979 ... Special Techniques
 - ~> Total Redundancy Elimination, Loop Invariant Code Motion
- 1979 ... Partial Redundancy Elimination
 - ~> **Pioneering** ... Morel/Renvoise's **bidirectional** algorithm [1979]
 - ~> **Heuristic improvements** ... Dhamdhere [1988, 1991], Drechsler/Stadel [1988], Sorkin [1989], Dhamdhere/Rosen/Zadeck [1992], ...
- 1992 ... BCM & LCM [Knoop et al., PLDI'92]
 - ~> **BCM** ... first to achieve **Computational Optimality: Earliestness Principle**
 - ~> **LCM** ... first to achieve **Comp. & Lifetime Optimality: Latestness Principle**
... first to be purely **unidirectional**, however, **not yet code-size sensitive**.
- 2000/2004: **Code-Size Sensitive PRE** [Knoop et al., POPL 2000, LCTES 2004]
- 2005: Unifying **PRE** and **Speculative PRE** [Jingling Xue and Knoop]