

Circuit versus CNF Reasoning for Equivalence Checking

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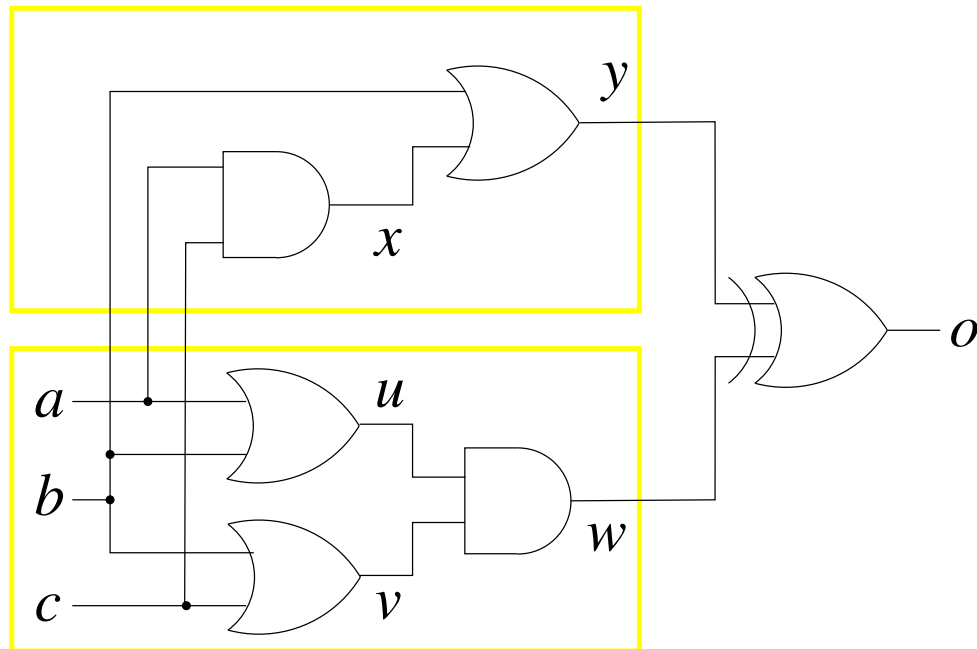
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Example of Tseitin Transformation: Circuit to CNF

[Tseitin'68]



$$\begin{aligned}
 & o \wedge \\
 & (x \leftrightarrow a \wedge c) \wedge \\
 & (y \leftrightarrow b \vee x) \wedge \\
 & (u \leftrightarrow a \vee b) \wedge \\
 & (v \leftrightarrow b \vee c) \wedge \\
 & (w \leftrightarrow u \wedge v) \wedge \\
 & (o \leftrightarrow y \oplus w)
 \end{aligned}$$

$$o \wedge (x \rightarrow a) \wedge (x \rightarrow c) \wedge (x \leftarrow a \wedge c) \wedge \dots$$

$$o \wedge (\bar{x} \vee a) \wedge (\bar{x} \vee c) \wedge (x \vee \bar{a} \vee \bar{c}) \wedge \dots$$

Preprocessing SAT

- general idea:
 - simplify CNF before applying complete DPLL algorithm
 - heuristic: simpler CNF is easier to solve
 - metric for simpler: smaller, e.g. less clauses or literals
- for instance **failed literal rule**
 - *assume* one literal l by setting it to *true*
 - perform boolean constraint propagation (BCP)
 - if BCP generates conflict (empty clause), then permanently add l
 - continue until no more literals are added \Rightarrow **saturate**

Resolution

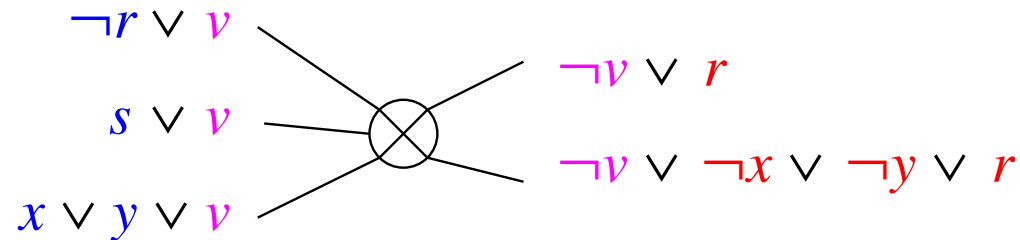
[Robinson]

- method to derive logically implied clauses
 - applicable to **resolvents** $(l_1 \vee \dots \vee l_n \vee v)$ and $(\neg v \vee k_1 \vee \dots \vee k_m)$
 - with matching variable v
 - implied **resolvent** $(l_1 \vee \dots \vee l_n \vee k_1 \vee \dots \vee k_m)$ can be added
- special cases
 - trivial resolvent: $(a \vee b \vee v) \otimes (\bar{v} \vee \bar{a}) \equiv (a \vee b \vee \bar{a}) \equiv 1$
 - unit resolution: $(l_1 \vee \dots \vee l_n \vee v) \otimes (\bar{v}) \equiv (l_1 \vee \dots \vee l_n)$
 - resolution of empty clause: $(v) \otimes (\bar{v})$

Elimination of Variables by Resolution (Clause Distribution)

[DavisPutnam'60]

original clauses in which v or \bar{v} occurs:



add non-trivial resolvents:

$$(s \vee r), \quad (x \vee y \vee r), \quad \text{and} \quad (s \vee \neg x \vee \neg y \vee r)$$

remove original clauses

Issues with Clause Distribution

- number of added clauses **quadratic** in worst case
 - solvers using only clause distribution explode in space
- still useful for preprocessing
 - resolution may generate trivial clause $(a \vee b \vee \bar{a})$
 - or even better units $(a \vee v) \otimes (\neg v \vee a) \equiv a$
 - empirically generates many subsumed clauses
$$(a \vee b) \text{ subsumes } (a \vee b \vee c)$$
 - trivial and subsumed clauses do not have to be added

Subsumption

- backward subsumption
 - new clause being added to CNF **subsumes** clause already in CNF
 - old subsumed clause can be removed after adding new clause
 - search clause in CNF containing **all** literals of new clause
- forward subsumption
 - new clause **is subsumed** by clause already in CNF
 - new clause does not have to be added
 - search clause in CNF made of a **subset** of literals of new clause

Signature based Subsumption Techniques for Propositional CNF

[Biere'04,ÉenBiere'05]

- signature bit for each literal $h(l) \in \{0, \dots, 31\}$
 - signature of literal is a 32-bit word: $\sigma(l) = 2^{h(l)}$ ($1 \ll h(l)$ in C)
 - signature of clause is a 32-bit word: $\sigma(C) = \bigcup_{l \in C} \sigma(l)$
 - necessary condition: C subsumes $D \Rightarrow \sigma(C) \subseteq \sigma(D)$
- backward subsumption
 - traverse clauses of a single literal of new clause
 - signature subset check avoids full literal subset check in many cases

Signature based Subsumption Techniques for Propositional CNF cont.

- originally implemented in QBF solver Quantor [Biere'04]
 - fast subsumption essential for resolution based variable elimination
- SAT Preprocessor Satelite [ÉenBiere'05]
 - fast subsumption has similar impact as in QBF
 - SateliteGTI = Satelite + Minisat
(new version of Minisat by Sörensen + Éen)
 - SateliteGTI winner of all industrial categories in SAT'05 competition
- forward subsumption: add clauses in reverse order, backward subsume
(faster way: 1-watched literal scheme [Zhang'05])

More Features in Satelite

- self subsuming resolution:
 - allows to remove *single* literals from clauses
 - beside clause distribution and fw/bw subsumption most effective
 - resolvent subsumes one resolvee: $(a \vee \bar{v} \vee c) \otimes (a \vee v) \equiv (a \vee c)$
- efficient scheduler for clause distribution and self subsumption
- functional substitution of gates (cheaper than clause distribution)
- hyper unary resolution: $(a \vee b \vee c) \otimes (\bar{a} \vee b) \otimes (\bar{c} \vee b) \equiv (b)$

Second Level Signature based Subsumption Techniques

[Biere'04]

- avoids traversing occurrence list in many cases
- signature sum of a literal: $\Sigma(l) = \bigcup\{\sigma(D) \mid D \in CNF \text{ and } l \in D\}$
- necessary condition for new clause D to subsume an old clause:

$$\sigma(C) \subseteq \Sigma(l) \quad \text{for all } l \in C$$

- removing clauses
 - it is sound to keep old signature
 - recalculate *accurate* signature sums after many removals
- technique can be extended to *extract gates* and *hyper unary resolution*

Experiments for Second Level Signatures

| | sec | v | v' | red | c | c' | red | l | l' | red | sub | 2nd hit | 1st miss |
|----|------|-----|------|------|-----|------|------|-----|------|------|------|---------|----------|
| 1 | 1.05 | 9 | 2 | 73% | 55 | 21 | 61% | 149 | 68 | 54% | 28 | 76.6% | 62.0% |
| 2 | 0.15 | 2 | 0 | 98% | 11 | 0 | 97% | 28 | 1 | 96% | 8 | 70.1% | 39.6% |
| 3 | 1.43 | 14 | 4 | 73% | 71 | 33 | 54% | 187 | 107 | 43% | 30 | 81.0% | 55.1% |
| 4 | 2.27 | 28 | 3 | 89% | 135 | 25 | 81% | 352 | 83 | 76% | 95 | 72.9% | 43.7% |
| 5 | 0.69 | 9 | 0 | 93% | 39 | 4 | 89% | 100 | 15 | 84% | 30 | 69.6% | 44.1% |
| 6 | 8.98 | 51 | 5 | 90% | 356 | 87 | 76% | 972 | 259 | 73% | 1091 | 31.5% | 16.8% |
| 7 | 0.59 | 7 | 0 | 100% | 40 | 0 | 100% | 102 | 0 | 100% | 29 | 68.9% | 43.7% |
| 8 | 6.22 | 58 | 13 | 76% | 277 | 142 | 49% | 714 | 453 | 36% | 165 | 72.8% | 69.7% |
| 9 | 7.04 | 63 | 15 | 76% | 307 | 162 | 47% | 794 | 520 | 34% | 180 | 72.7% | 70.6% |
| 10 | 6.40 | 59 | 9 | 84% | 322 | 73 | 77% | 850 | 240 | 72% | 322 | 64.6% | 33.0% |
| 11 | 2.78 | 32 | 7 | 76% | 149 | 53 | 64% | 393 | 179 | 54% | 75 | 80.5% | 56.5% |
| 12 | 3.95 | 39 | 11 | 70% | 193 | 89 | 54% | 511 | 302 | 41% | 84 | 80.5% | 55.2% |
| 13 | 1.34 | 13 | 3 | 74% | 65 | 29 | 55% | 172 | 97 | 44% | 25 | 79.8% | 68.1% |

Why Hyper Unary Resolution?

original CNF including clauses modelling an AND gate $a = b \wedge c \wedge d$

$$(\bar{a} \vee b) \wedge (\bar{a} \vee c) \wedge (\bar{a} \vee d) \wedge \underbrace{(a \vee \bar{b} \vee \bar{c} \vee \bar{d})}_{\text{base clause}}$$

new clause $(\bar{b} \vee \bar{c} \vee \bar{d})$

backward subsumes base clause of AND gate and prevents gate extraction

however hyper resolution with the binary side clauses of the AND gate

$$(\bar{a} \vee b) \otimes (\bar{a} \vee c) \otimes (\bar{a} \vee d) \otimes (\bar{b} \vee \bar{c} \vee \bar{d}) \equiv a$$

results in unit clause

similar techniques for other subsumptions of base or side clauses

Automatic Test Pattern Generation (ATPG)

- need to test chips **after** manufacturing
 - manufacturing process introduces faults (< 100% yield)
 - faulty chips can not be sold (should not)
 - generate all test patterns from functional logic description
- simplified failure model
 - at most one wire has a fault
 - fault results in fixing wire to a logic constant:
 - “stuck at zero fault” (s-a-0) “stuck at one fault” (s-a-1)

ATPG with D-Algorithm

[Roth'66]

- adding logic constants D and \bar{D} allows to work with only one circuit

0 represents 0 in fault free and 0 in faulty circuit

1 represents 1 in fault free and 1 in faulty circuit

D represents 1 in fault free and 0 in faulty circuit

\bar{D} represents 0 in fault free and 1 in faulty circuit

- otherwise obvious algebraic rules (propagation rules)

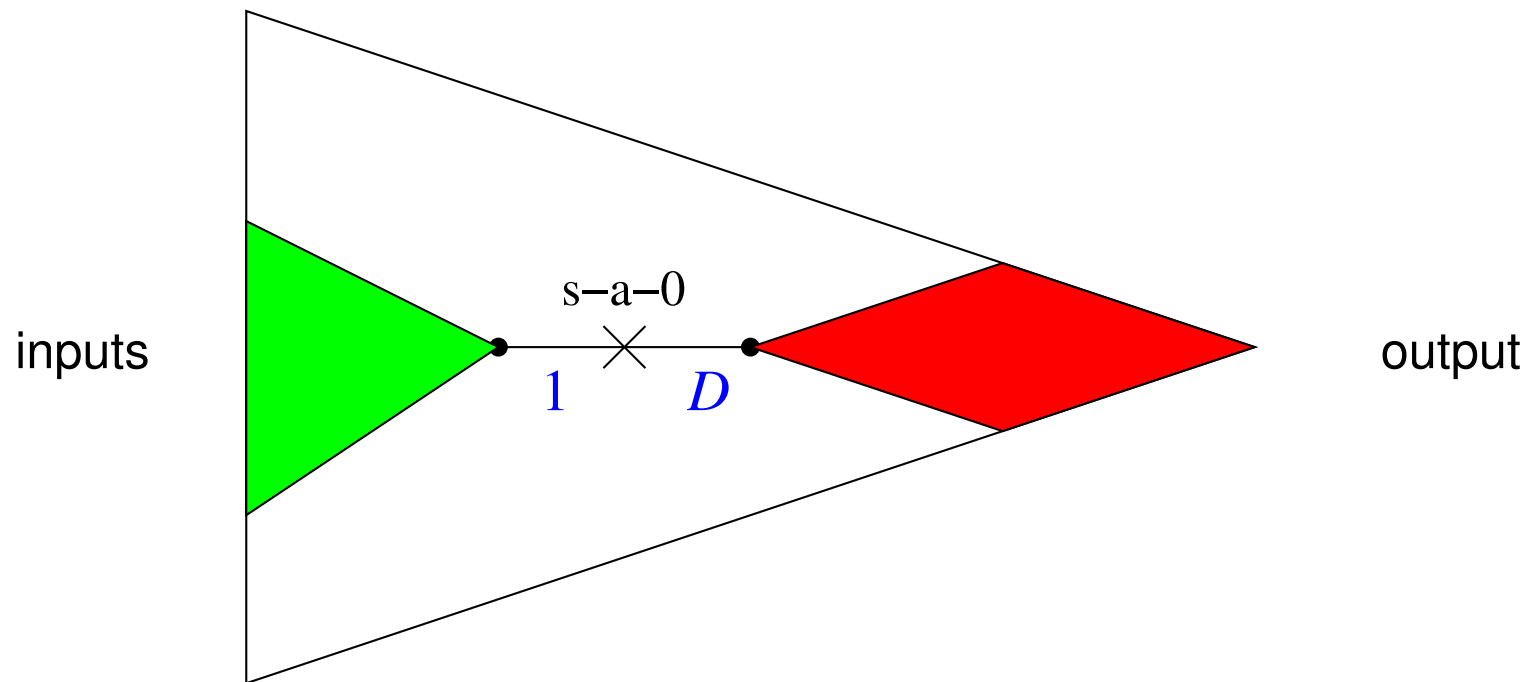
$$1 \wedge D \equiv D \quad 0 \wedge D \equiv 0 \quad \bar{D} \wedge D \equiv 0 \quad \text{etc.}$$

- new conflicts: e.g. variable/wire can not be 0 and D at the same time

Fault Injection for S-A-0 Fault

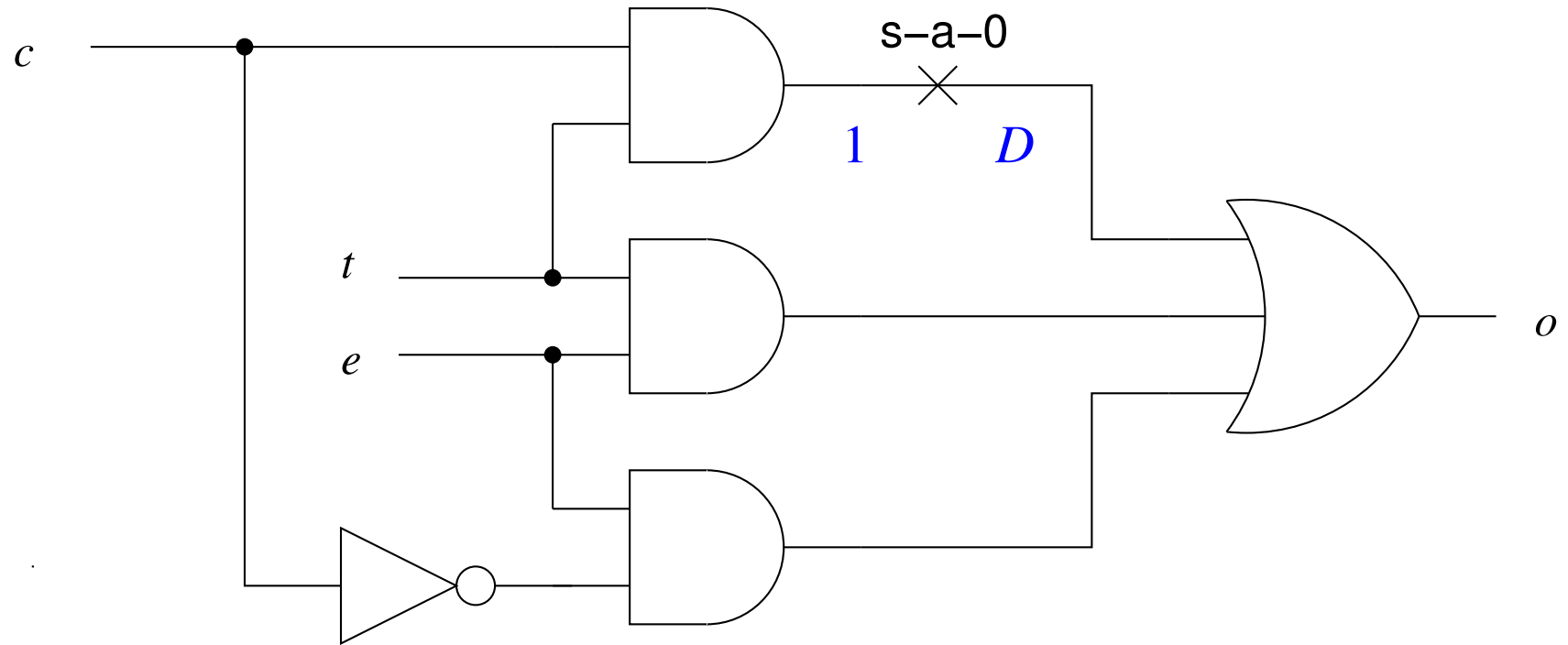
assume opposite value 1 before fault

(both for fault free and faulty circuit)

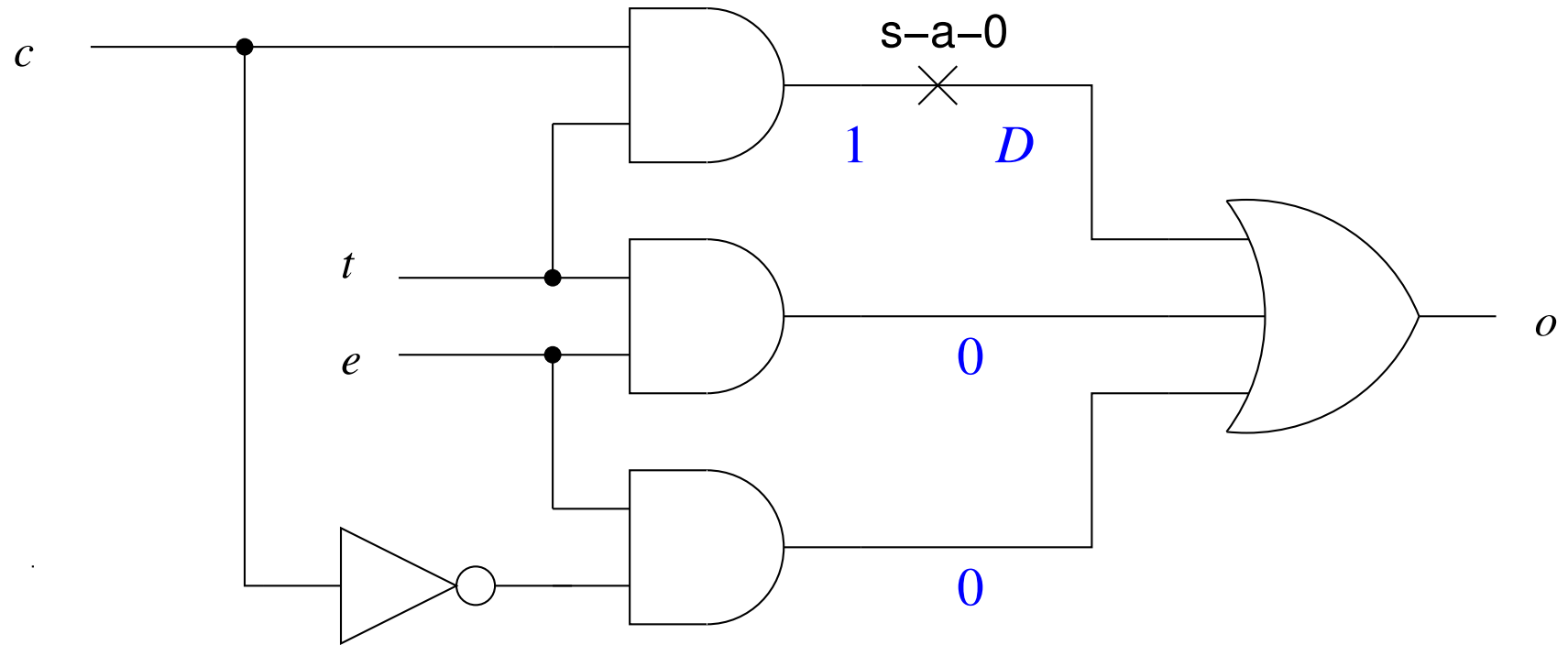


assume difference value D after fault

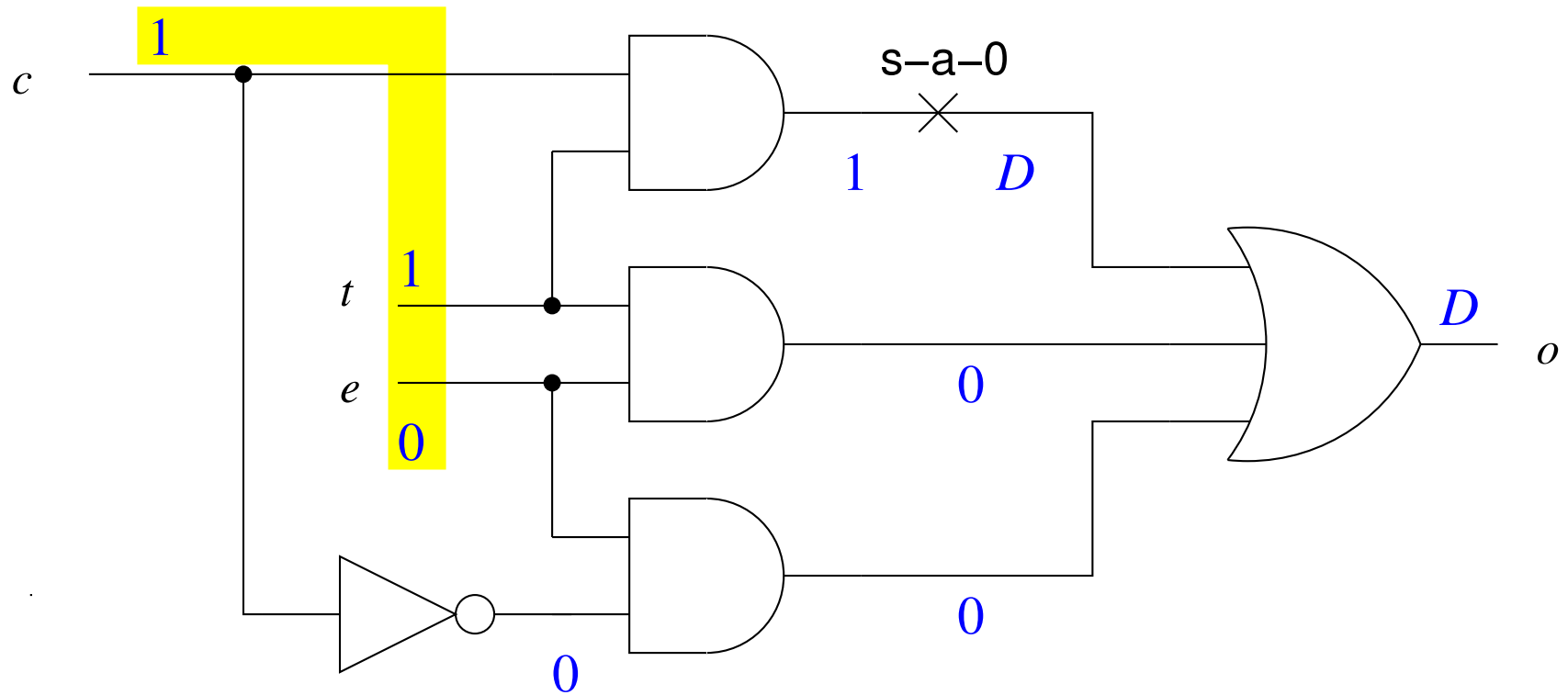
D-Algorithm Example: Fault Injection



D-Algorithm Example: Path Sensitation



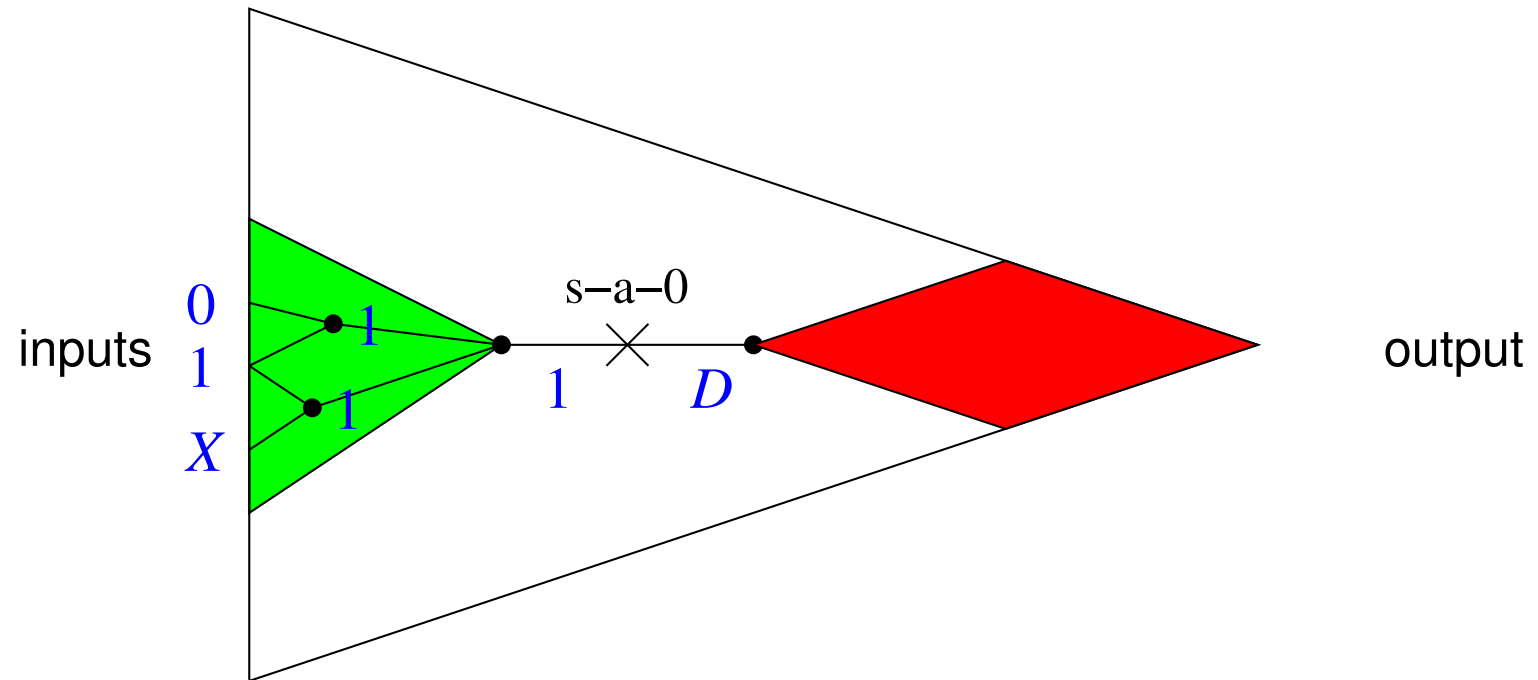
D-Algorithm Example: Propagation



test vector $(c, t, e) = (1, 1, 0)$

Justification

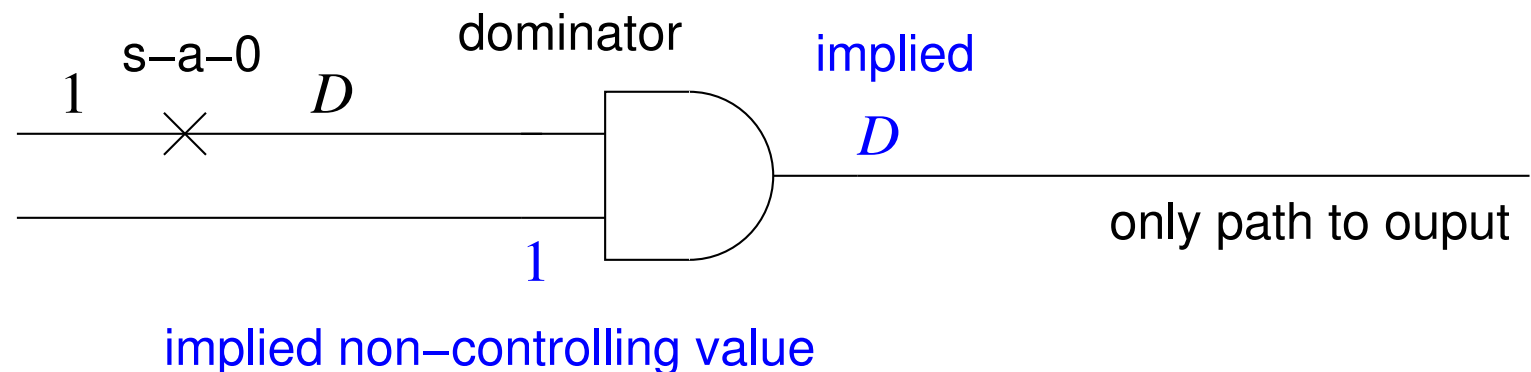
generate **partial** input vector to justify 1



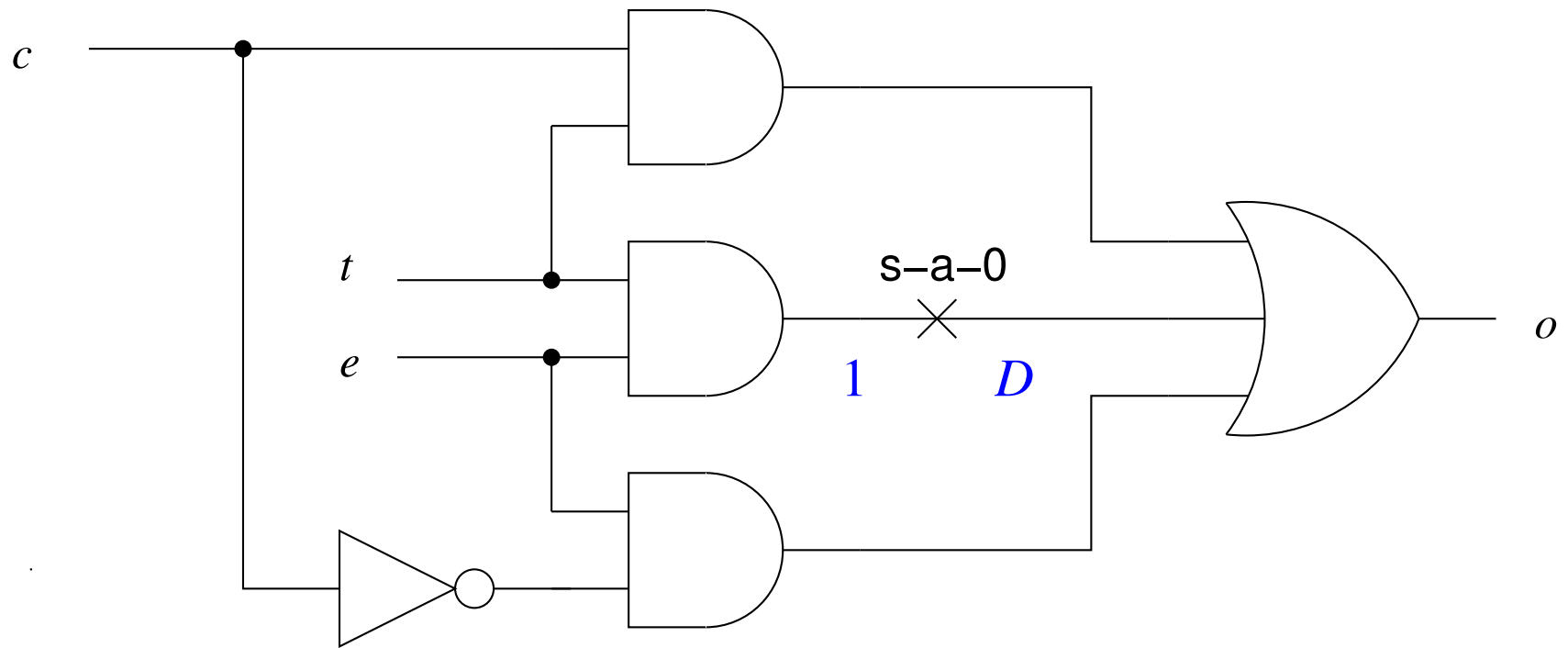
only **backward propagation**, remaining unassigned inputs can be arbitrary

Dominators and Path Sensitation

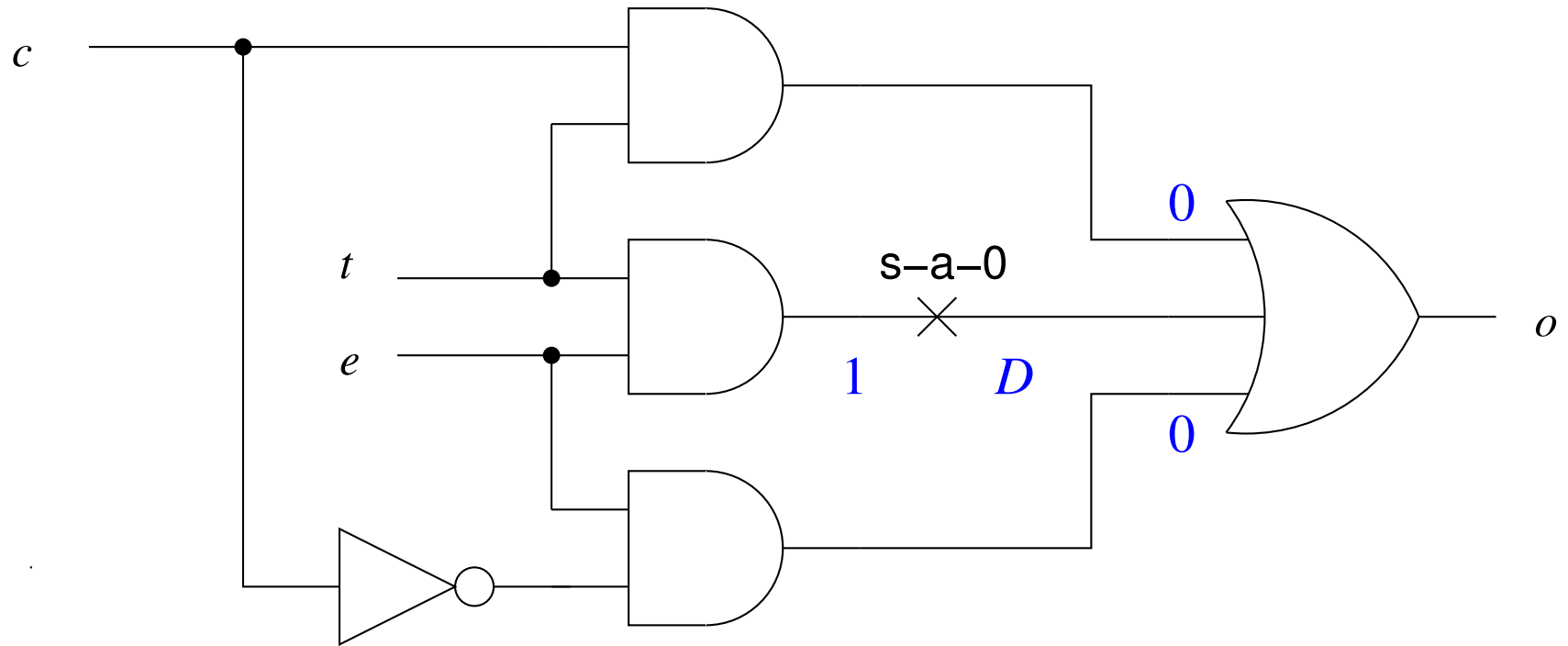
- idea: use circuit topology for additional necessary conditions
 - assign and propagate these conditions after fault injection
- gate **dominates** fault iff every path from fault to output goes through it
 - more exactly we determine wires (input to gates) that dominate a fault
- if input dominates a fault **assign** other inputs to non-controlling value



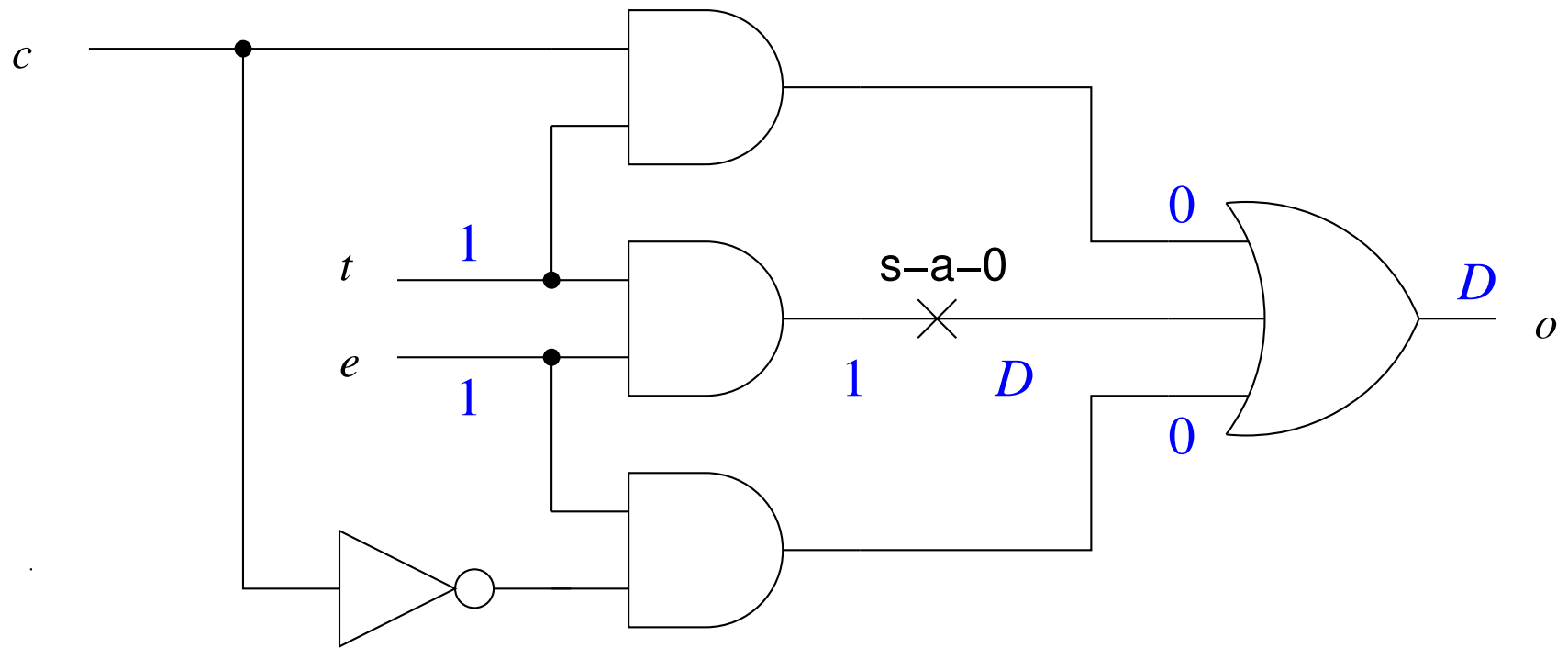
Redundancy Removal with D-Algorithm: Fault Injection



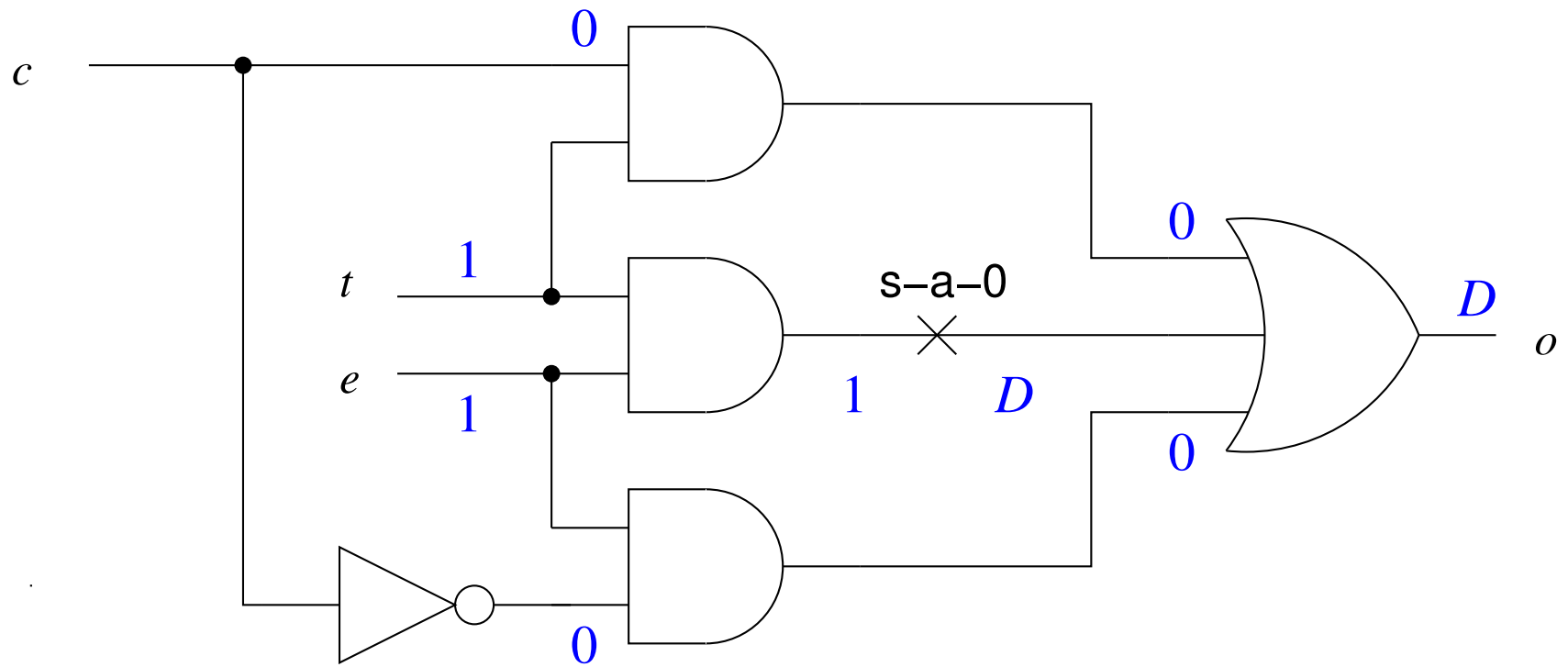
Redundancy Removal with D-Algorithm: Path Sensitation



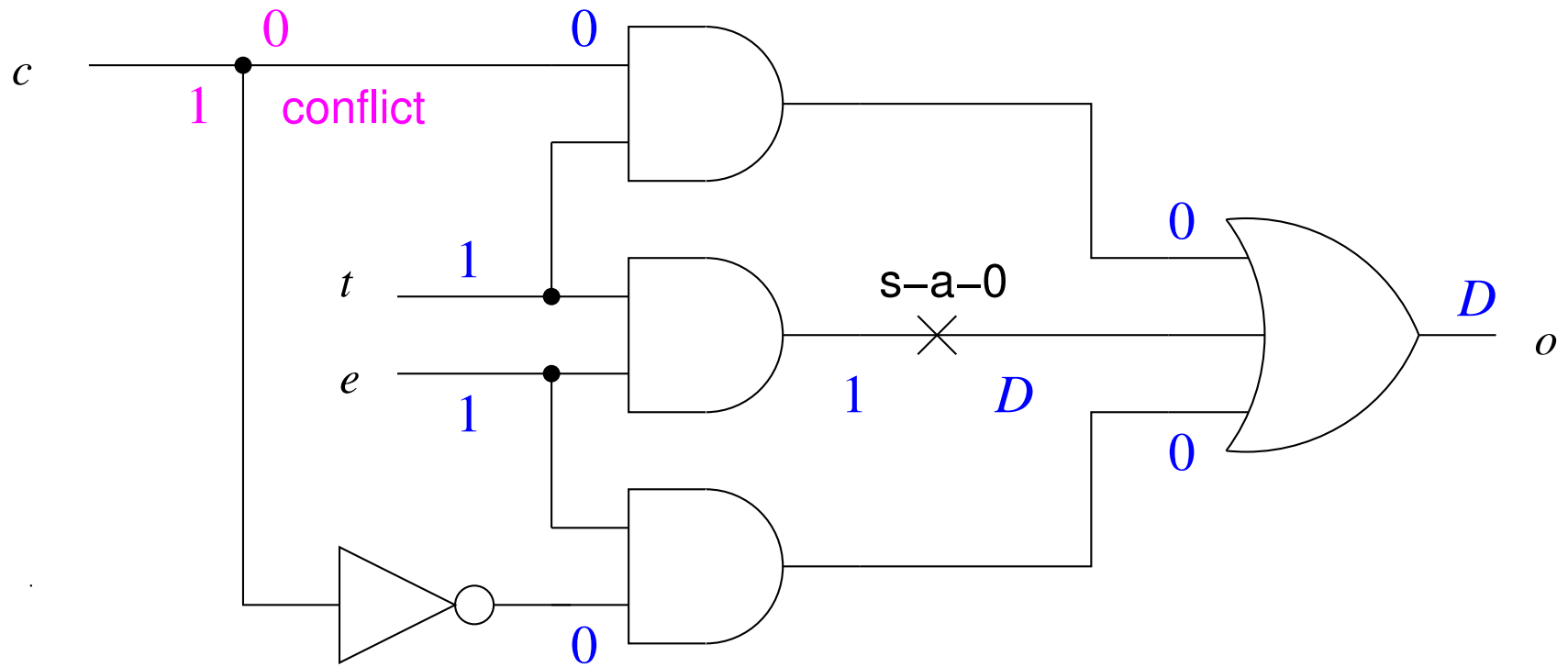
Redundancy Removal with D-Algorithm: 1st Propagation



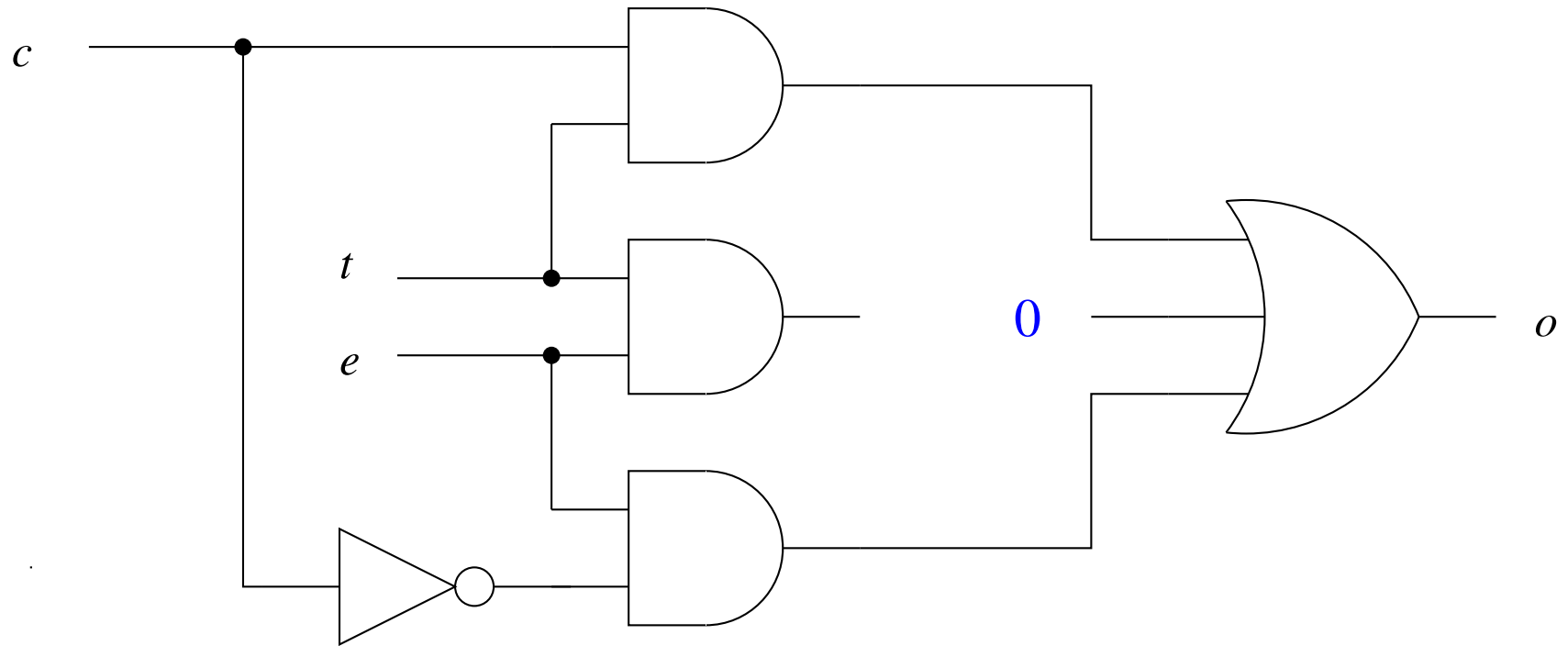
Redundancy Removal with D-Algorithm: 2nd Propagation



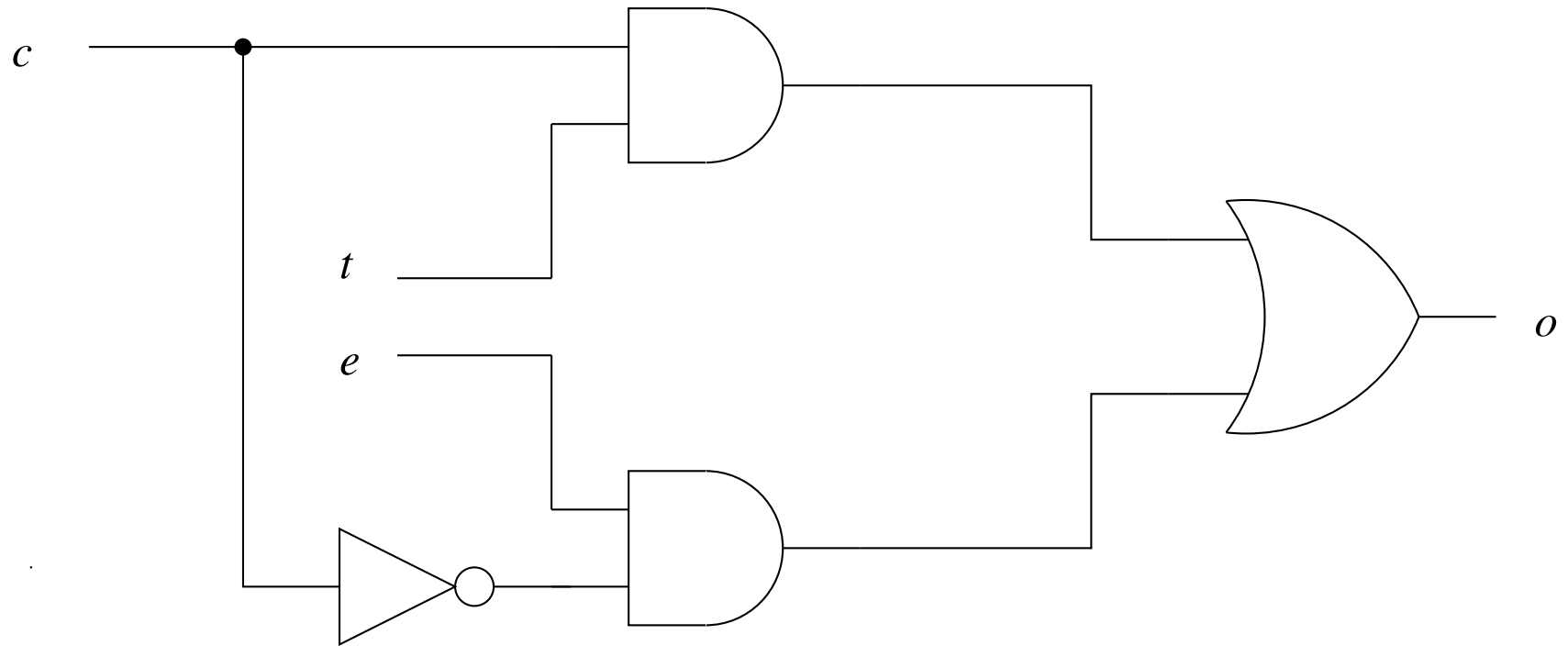
Redundancy Removal with D-Algorithm: Untestable



Redundancy Removal with D-Algorithm: Assume Fault



Redundancy Removal with D-Algorithm: Simplified Circuit



Redundancy Removal for SAT

- assume CNF is generated via Tseitin transformation from formula/circuit
 - formula = model constraints + negation of property
 - CNF consists of gate input/output consistency constraints
 - plus additional unit forcing output o of whole formula to be 1
- remove redundancy in formula under assumption $o = 1$
- propagation of D or \bar{D} to o does not make much sense
 - not interested in $o = 0$
 - check simply for unsatisfiability \Rightarrow no need for D, \bar{D} (!?)

Variable Instantiation

[AnderssonBjesseCookHanna DAC'02] and Oepir SAT solver

- satisfiability preserving transformation
- motivated by original **pure literal rule** :
 - if a literal l does not occur negatively in CNF f
 - then replace l by 1 in f (continue with $f[l \mapsto 1]$)
- generalization to **variable instantiation** :
 - if $f[l \mapsto 0] \rightarrow f[l \mapsto 1]$ is valid
 - then replace l by 1 in f (continue with $f[l \mapsto 1]$)

Why is Variable Instantiation a Generalization of the Pure Literal Rule?

Let $f \equiv f' \wedge f_0 \wedge f_1$ with

f' l does not occur

f_0 l occurs negatively

f_1 l occurs positively

further assume (assumption of pure literal rule)

$$f_0 \equiv 1$$

then

$$f[l \mapsto 0] \Leftrightarrow f' \wedge f_1[l \mapsto 0] \stackrel{!}{\Rightarrow} f' \Leftrightarrow f[l \mapsto 1]$$

Variable Instantiation Implementation

We have

$$f[l \mapsto 1] \Leftrightarrow f' \wedge \underbrace{f_1[l \mapsto 1]}_1 \wedge f_0[l \mapsto 1] \Leftrightarrow f' \wedge f_0[l \mapsto 1] \Leftrightarrow f' \wedge \underbrace{\bigwedge_{i=1}^n C_i}_{f_0[l \mapsto 1]}$$

and since $f[l \mapsto 0] \Rightarrow f'$ we only need show the validity of

$$f[l \mapsto 0] \rightarrow \bigwedge_{i=1}^n C_i$$

which is equivalent to the unsatisfiability of

$$f[l \mapsto 0] \wedge \overline{C_i} \quad \text{for } i = 1 \dots n$$

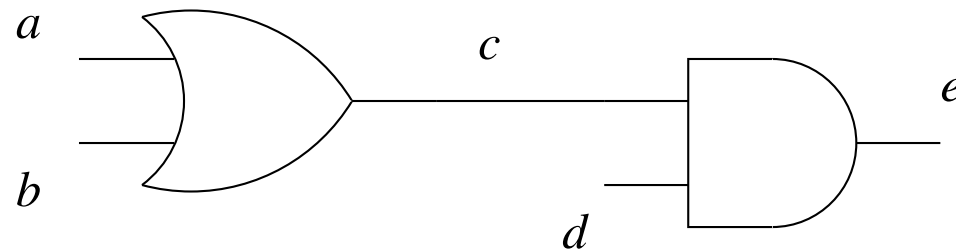
which again is equivalent to the unsatisfiability of

$$f \wedge \bar{l} \wedge \overline{C_i} \quad \text{for } i = 1 \dots n$$

This can be done directly on the CNF and needs n unsatisfiability checks.

Variable Instantiation for Tseitin Encodings

$$\begin{array}{ll}
 (\bar{a} \vee c) & (c \vee \bar{e}) \\
 (\bar{b} \vee c) & (d \vee \bar{e}) \\
 (a \vee b \vee \bar{c}) & (\bar{c} \vee \bar{d} \vee e)
 \end{array}$$



$$\left. \begin{array}{l}
 \not\models f \wedge \bar{c} \wedge \overline{(a \vee b)} \\
 \not\models f \wedge \bar{c} \wedge \overline{(d \vee e)}
 \end{array} \right\} \Rightarrow \text{add } c \text{ as unit}$$

requires two satisfiability checks while ATPG for c s-a-1 needs just one run

Stålmarck's Method and Recursive Learning

- originally Stålmarck's Method works on “sea of triplets” [Stålmarck'89]

$$x = x_1 @ \dots @ x_n \quad \text{with } @ \text{ boolean operator}$$

- equivalence reasoning + structural hashing + test rule
- test rule translated to CNF f : $f \Rightarrow (BCP(f \wedge x) \cap BCP(f \wedge \bar{x}))$
add to f units that are implied by both cases x and \bar{x}

- Recursive Learning [KunzPradhan 90ties]

- originally works on circuit structure
- idea is to analyze all ways to justify a value, intersection is implied
- translated to CNF f which contains clause $(l_1 \vee \dots \vee l_n)$
BCP on all l_i separately and add intersection of derived units

Further CNF Simplification Techniques

- failed literals, various forms of equivalence reasoning
- hyper binary resolution [BacchusWinter'03,GershmanStrichman'05]
 - add binary clauses obtained through hyper resolution
 - avoid adding full transitive closure of implication chains
 - equivalence reasoning through SCC detection in binary clause graph
 - as Stålmarch's procedure subsumes structural hashing
- variable and clause elimination
 - autarkies and blocked clauses [Kullman]

Circuit based Simplification vs. CNF simplification

- circuit reasoning/simplification can use **structure** of circuit
 - graph structure (dominators)
 - notion of direction (forward and backward propagation)
 - partial models (some inputs do not need to be assigned)
- CNF simplification does not rely on circuit structure
 - orthogonal: can for instance remove individual clauses
- **adapt ideas from circuit reasoning to SAT**
(e.g. avoid multiple SAT checks for redundancy removal in CNF)