

Synthesizing Regular Expressions for Introductory Automata Assignments

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Quiz

Strings have exactly one pair of consecutive 0s. ($\Sigma=\{0,1\}$)

Give it a try!

Quiz

Strings have exactly one pair of consecutive 0s. ($\Sigma=\{0,1\}$)

Positive Example

00
1001
010010
1011001110

Negative Example

01
11
000
00100

Quiz

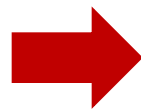
Strings have exactly one pair of consecutive 0s. ($\Sigma=\{0,1\}$)

Positive Example

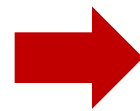
00
1001
010010
1011001110

Negative Example

01
11
000
00100



Alpha
Regex



$(0?1)^*00(10?)^*$



Motivation

To help the students who learn REs

Motivation

Strings have exactly one pair of consecutive 0s. ($\Sigma=\{0,1\}$)

- Most students : “I don’t know how to start.”

Positive Example

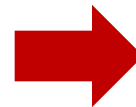
00
1001
010010
1011001110

Negative Example

01
11
000
00100



Alpha
Regex



$(0?1)^*00(10?)^*$

1.0s

Motivation

Strings have exactly one pair of consecutive 0s. ($\Sigma=\{0,1\}$)

- Some students : “Is there compact any solution?”

Students

$1^*(01)^*001^*(10)^*1^*$



$(0?1)^*00(10?)*$

AlphaRegex

Another example 1

The number of 0s is divisible by 3. ($\Sigma=\{0,1\}$)

Positive Example

1
11
111
000
000000
01010
0110110

Negative Example

0
00
100
010
001
0000
00000
0000000

Another example 1

The number of 0s is divisible by 3. ($\Sigma=\{0,1\}$)

Positive Example

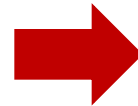
1
11
111
000
000000
01010
0110110

Negative Example

0
00
100
010
001
0000
00000
0000000



Alpha
Regex



7.1s

$(1+01^*01^*0)^*$

Another example 2

0 and 1 alternate. ($\Sigma=\{0,1\}$)

Positive Example

0
1
01
10
101
010
1010
0101
10101

Negative Example

00
11
011
001
110
1001
101101
010010

Another example 2

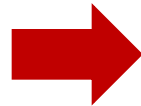
0 and 1 alternate. ($\Sigma=\{0,1\}$)

Positive Example

0
1
01
10
101
010
1010
0101
10101

Negative Example

00
11
011
001
110
1001
101101
010010



**Alpha
Regex**



$1?(01)^*0?$

1.7s

Contribution

- **Efficient Synthesis Algorithms for REs.**
 - **6.7 seconds on average.**
- **Provide AlphaRegex, publicly available.**
 - <http://prl.korea.ac.kr/AlphaRegex>

Can be
interactively used !

Demo Page

AlphaRegex

Results

GO!

Positive Examples ?		Negative Examples ?	
Enter example	+	Enter example	+
00	-	01	-
1001	-	11	-
010010	-	000	-
1011001110	-	00100	-

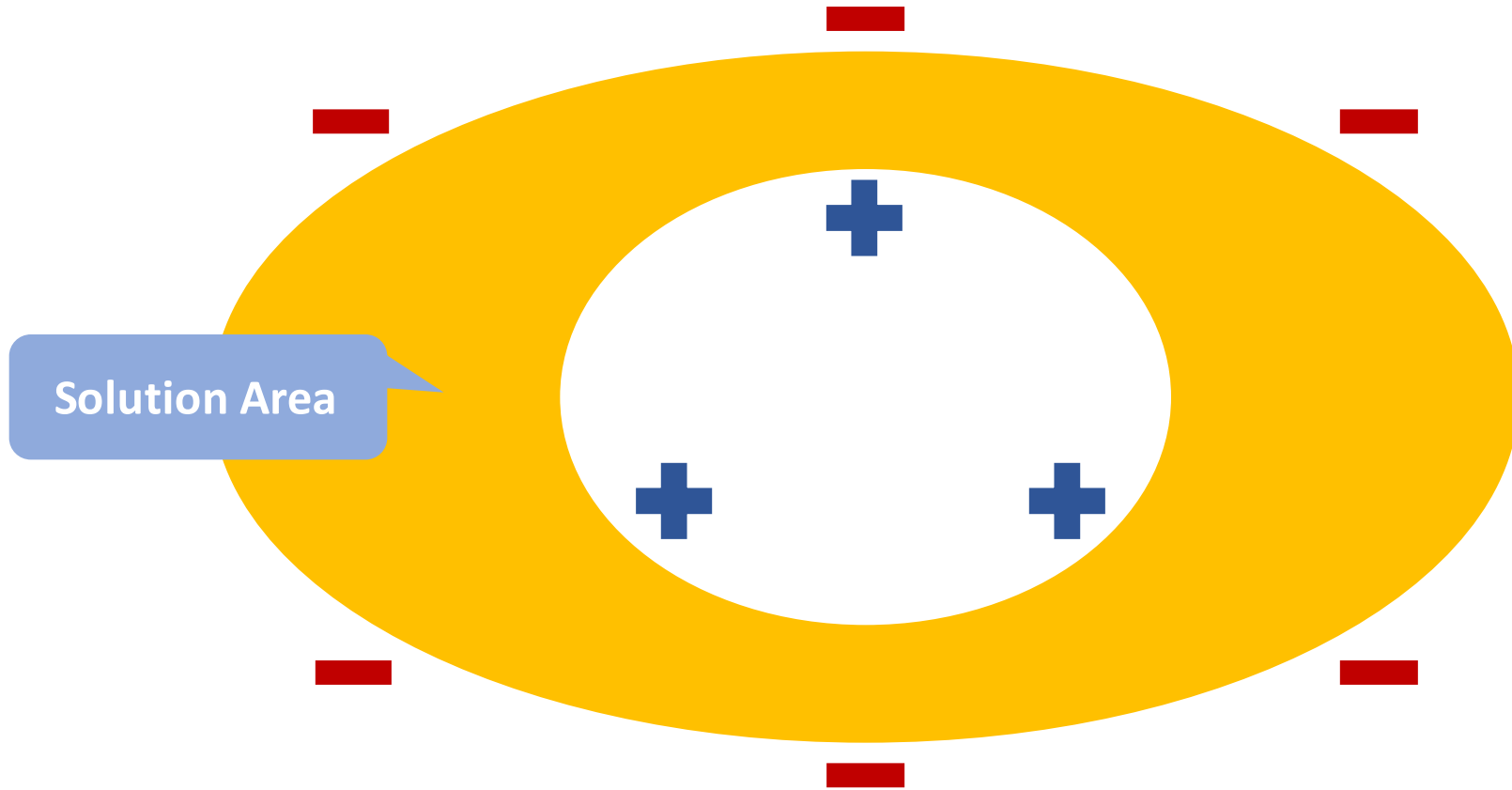
Clear

RE in Automata Class

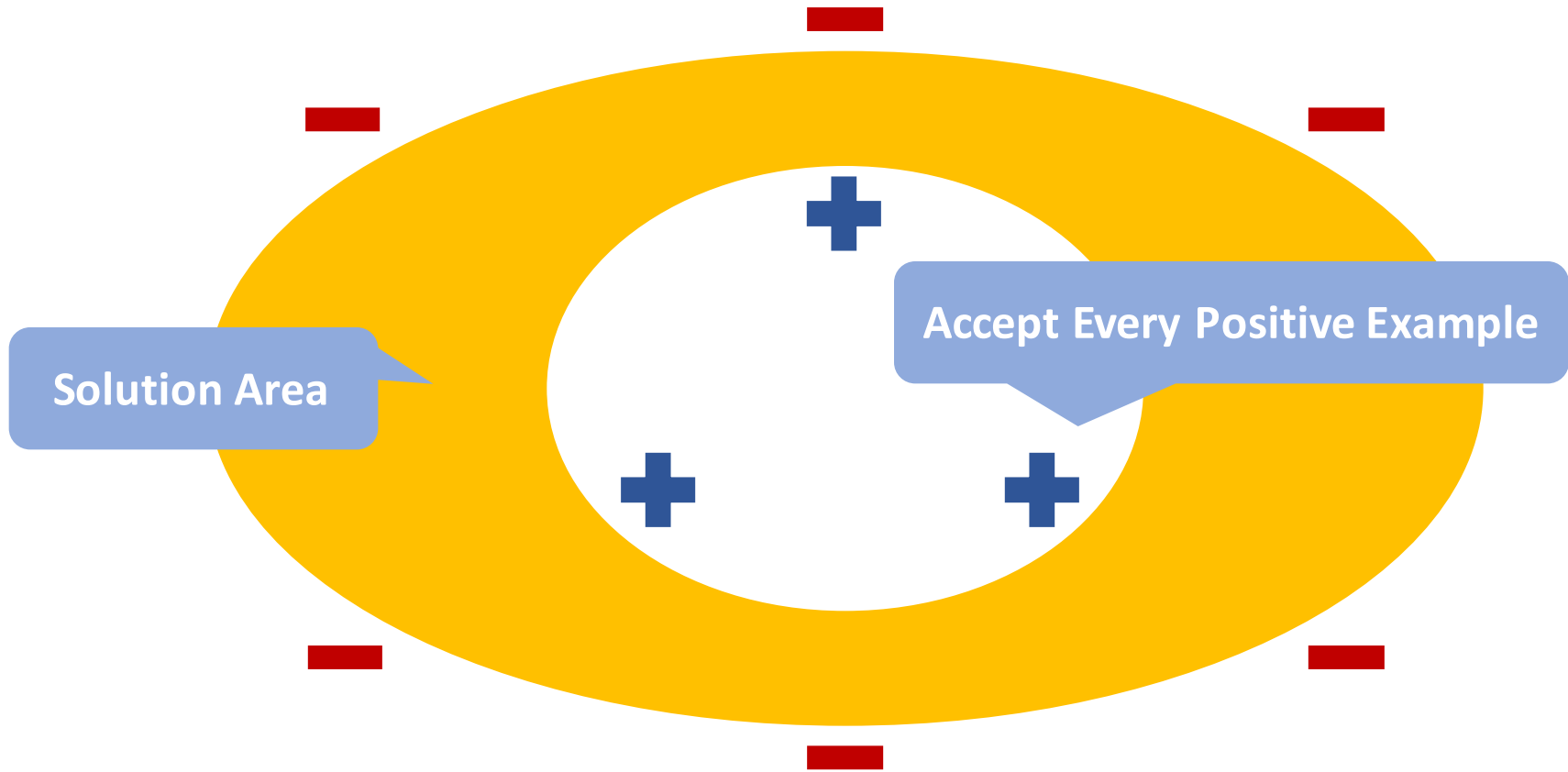
$$e \rightarrow a \in \Sigma \mid \epsilon \mid \emptyset \mid e_1 + e_2 \mid e_1 \cdot e_2 \mid e^*$$

- **Assume $\Sigma = \{0,1\}$.**

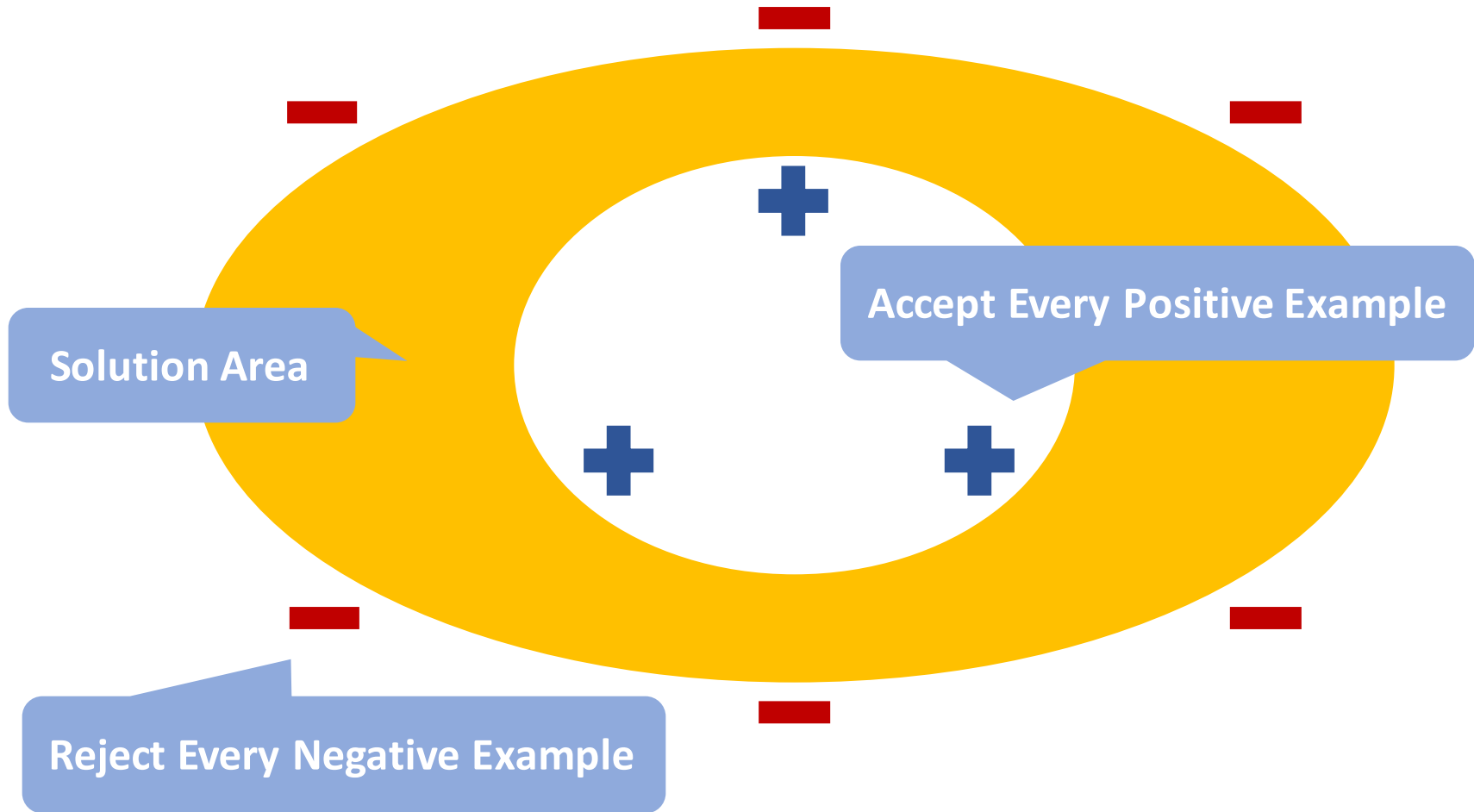
RE Synthesis Goal



RE Synthesis Goal



RE Synthesis Goal

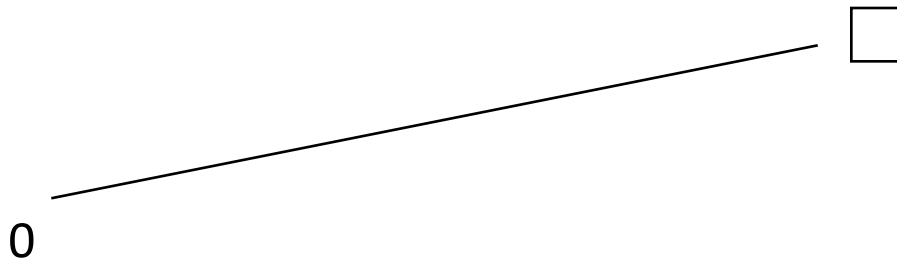


Basic Search Algorithm



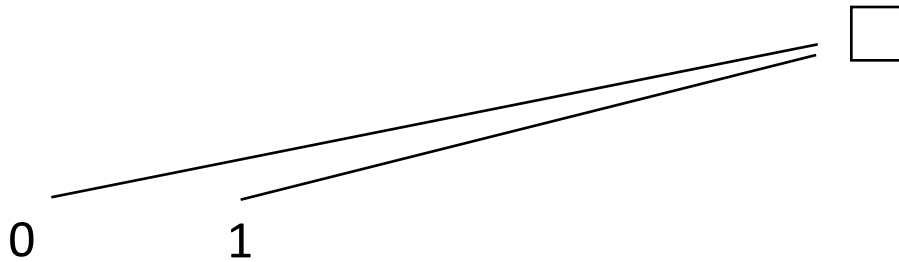
- **Brute force search**
 - **Start from the initial hole(□).**
 - **Enumerate every possible regular expressions.**
 - **Check consistency with examples for each expression.**

Basic Search Algorithm



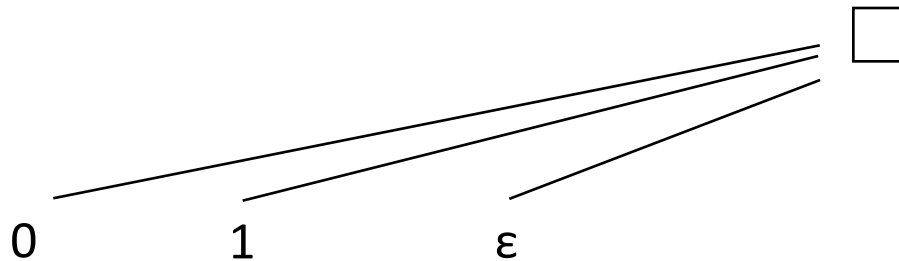
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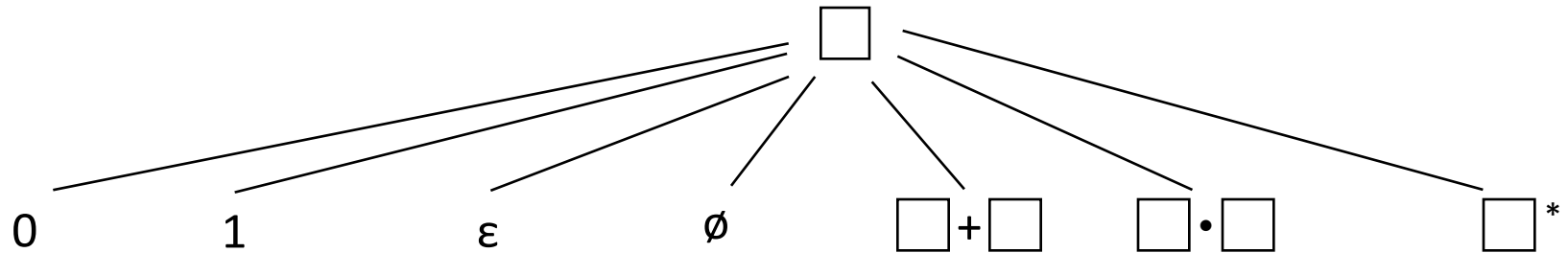
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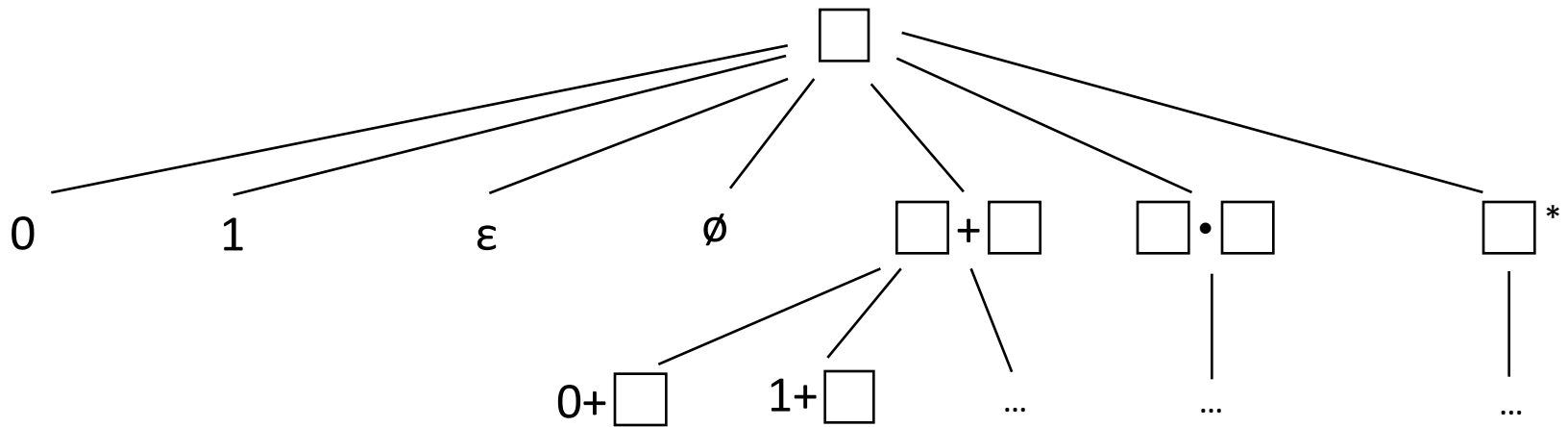
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 - **Start from the initial hole(\square).**
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Basic Search Algorithm



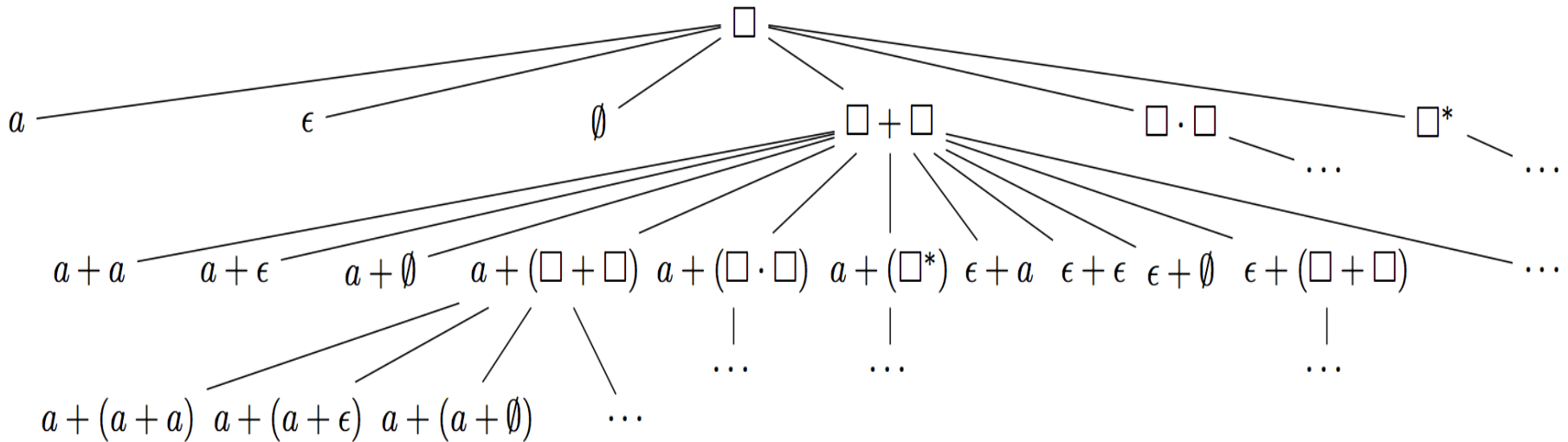
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Basic Search Algorithm



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 - **Enumerate every possible regular expressions.**
 - **Check consistency with examples for each expression.**

Challenge



$$O(7^{2^d} - 1)$$

Maximum number of states at depth d .

Our Pruning Techniques

- 1. Identifying Semantically Equivalent States**
- 2. Over Approximations**
- 3. Under Approximations**
- 4. Identifying Redundant States**

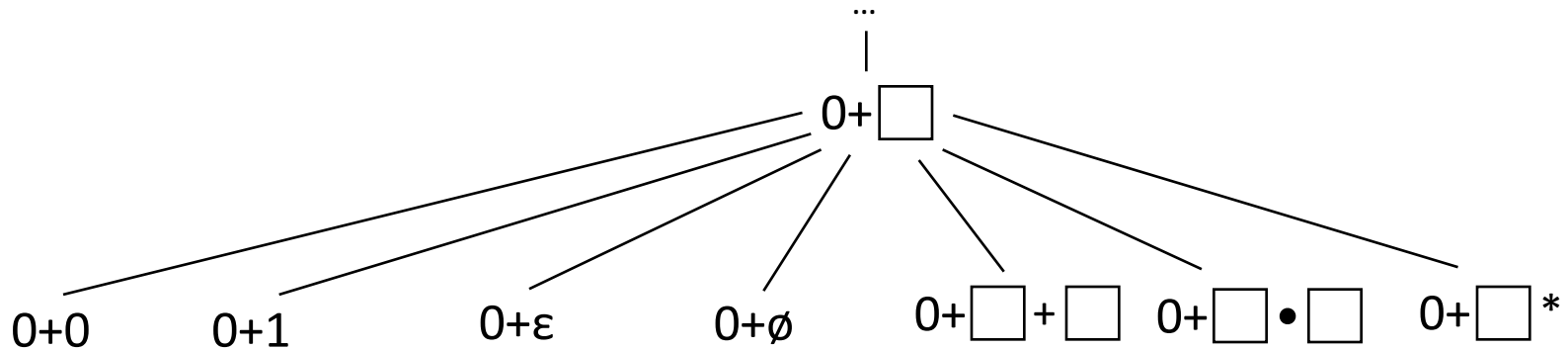
1. Equivalent states

Do not explore more if the equivalent state was explored.

⋮
|
0+ □

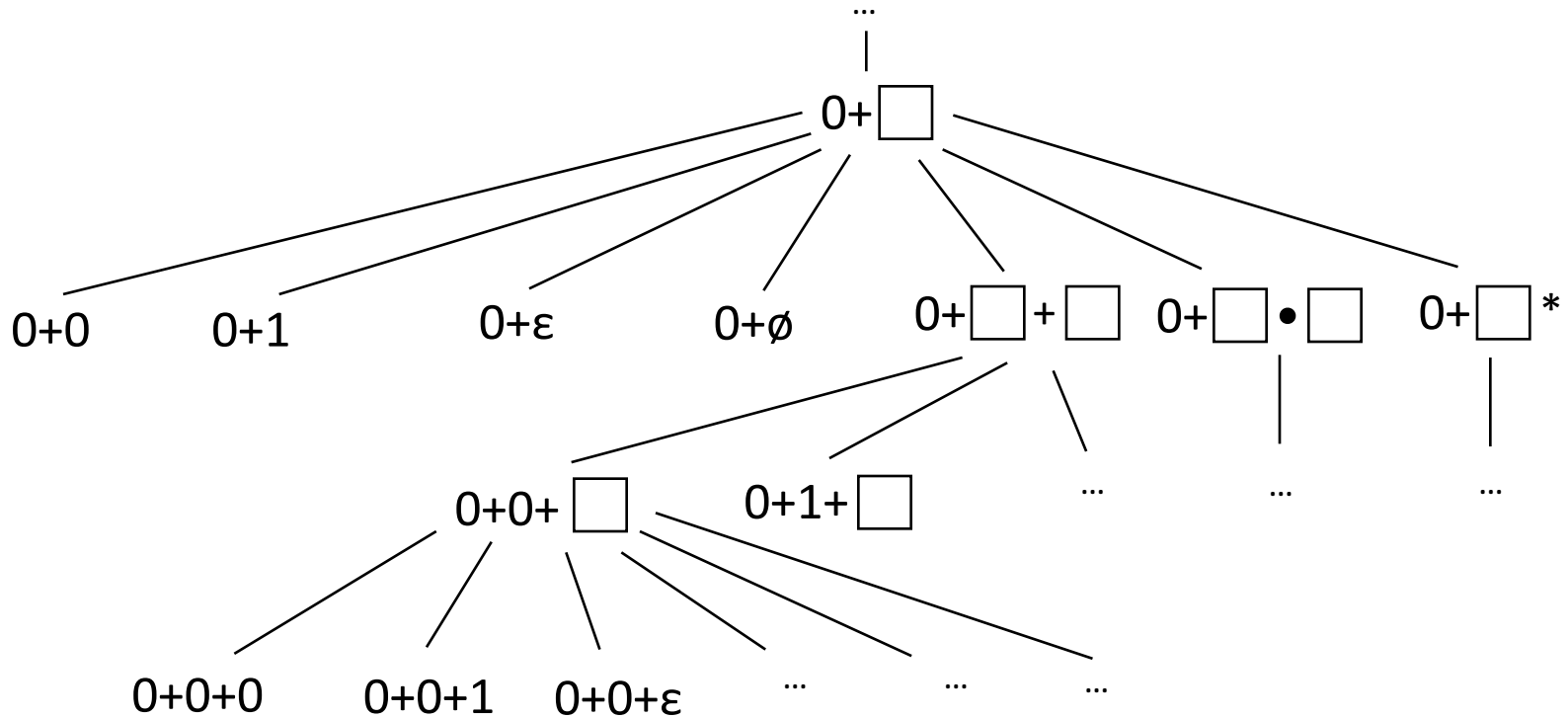
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Do not explore more if the equivalent state was explored.



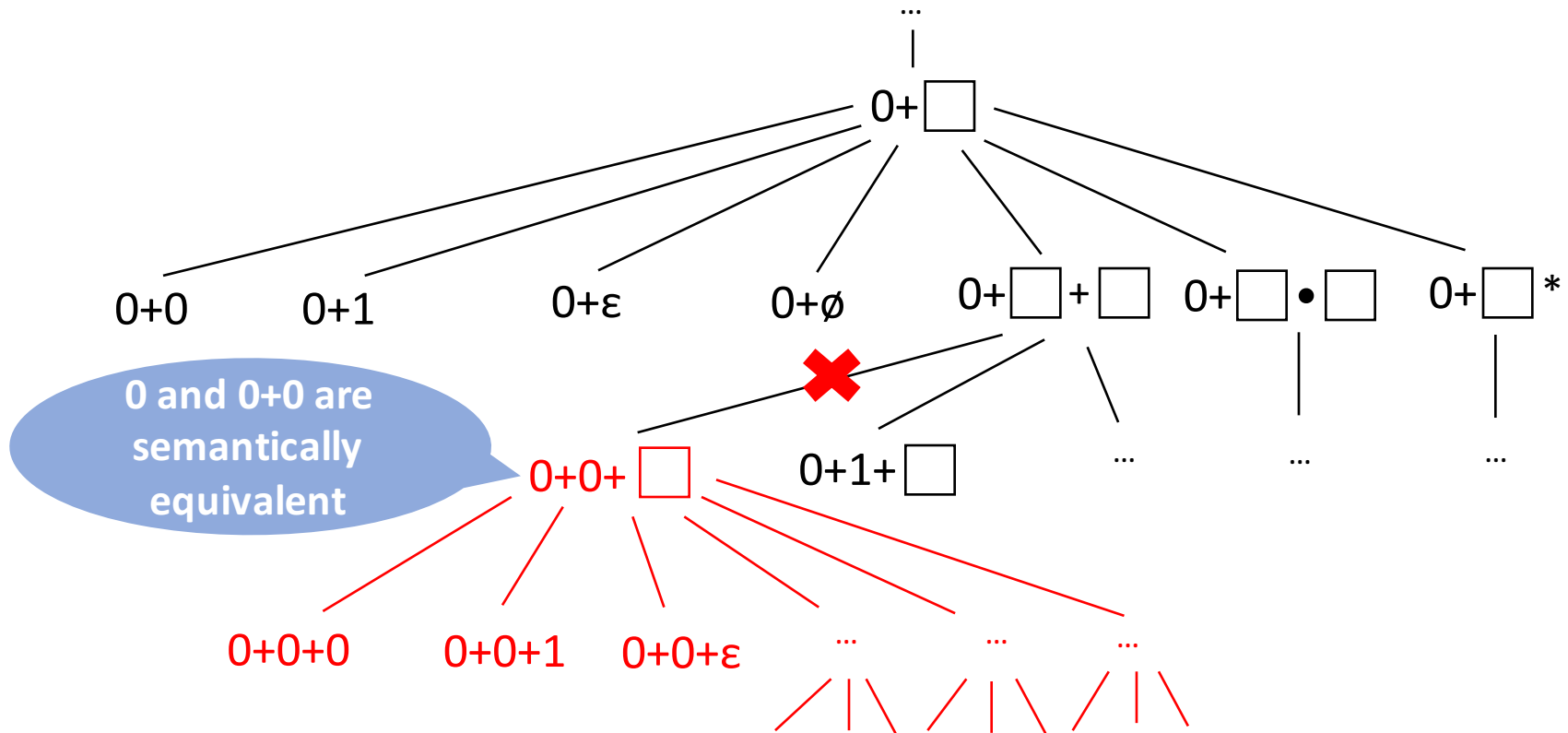
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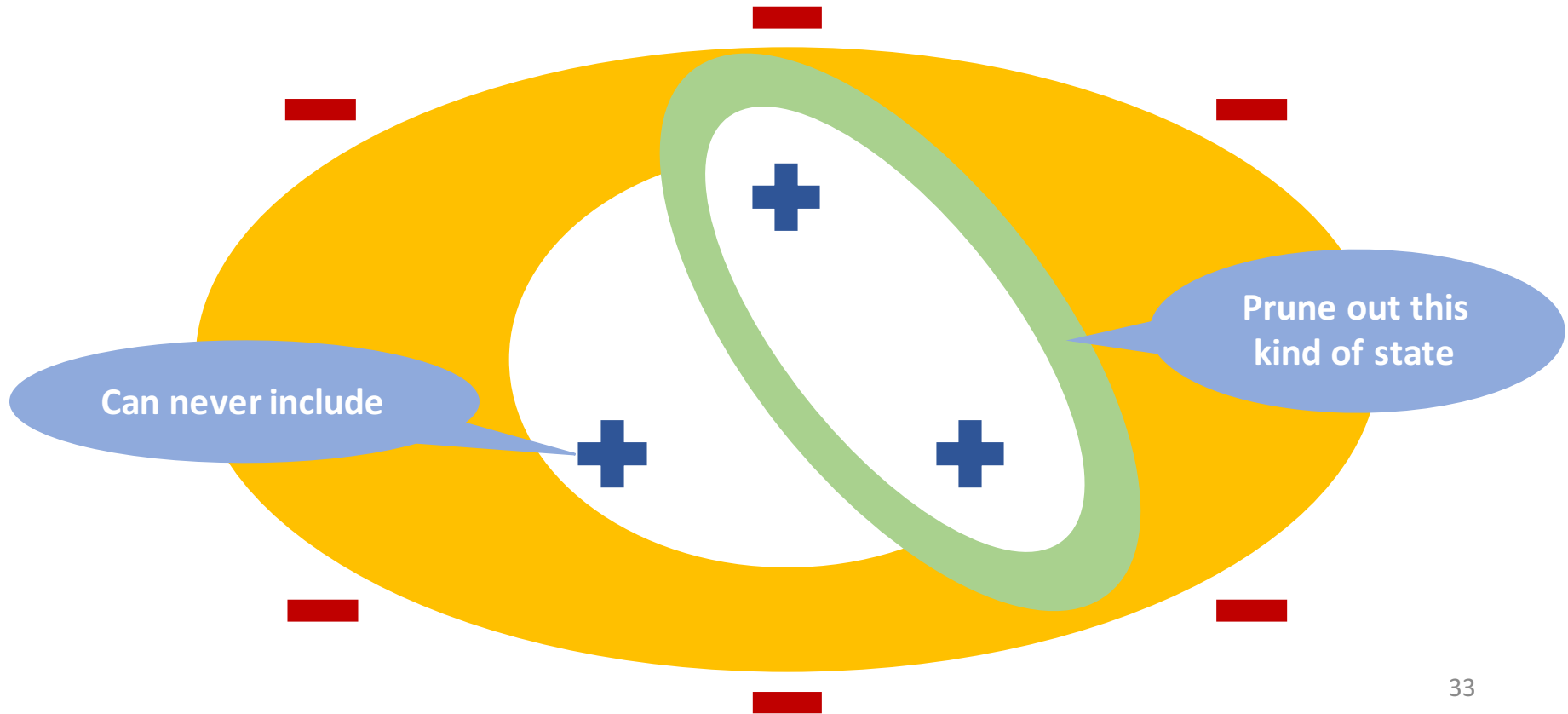
1. Equivalent states

Do not explore more if the equivalent state was explored.

- How can we identify semantically equivalent states?
 - Semantics-preserving transformation rules.
eg. $e+e \rightarrow e$, $(e^*)^* \rightarrow e^*$

2. Over Approximations

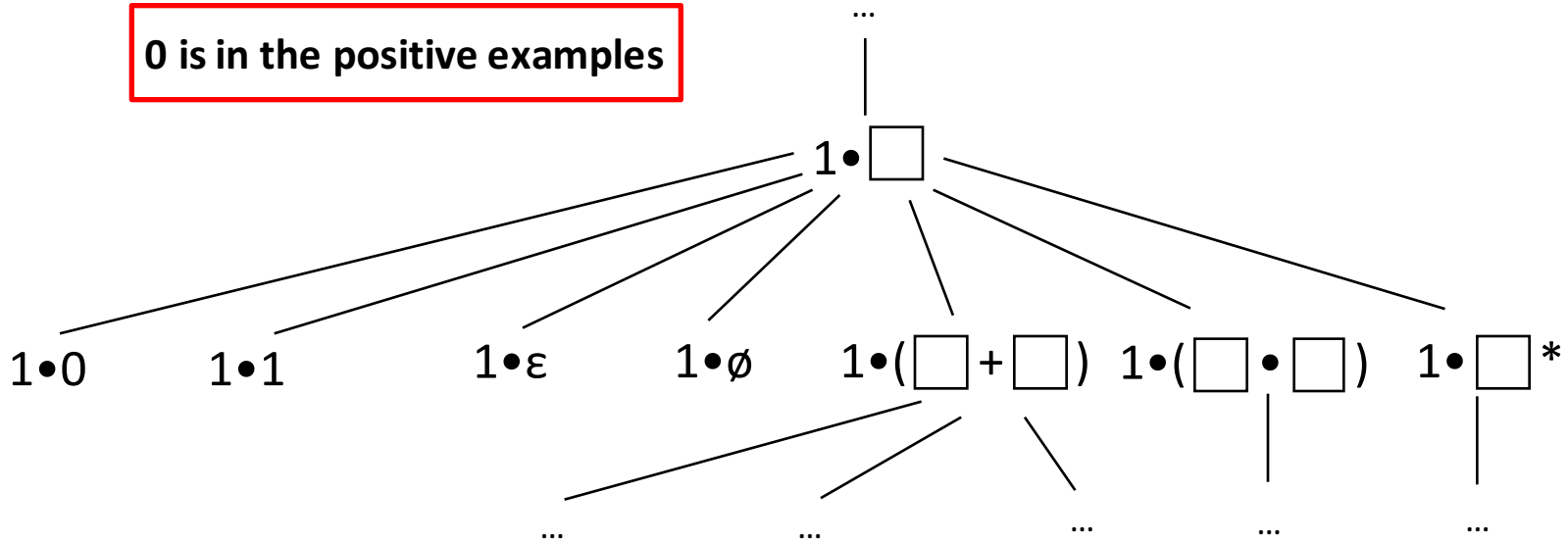
Prune out the state guaranteed to
reject some positive examples.



2. Over Approximations

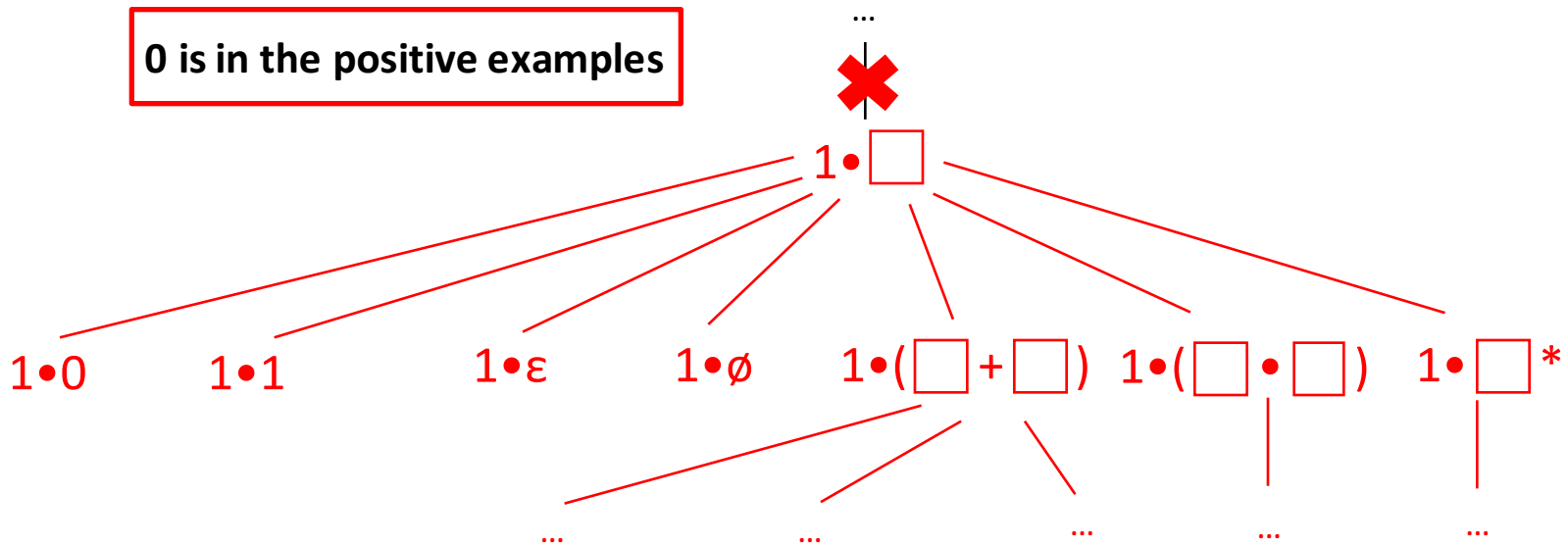
Prune out the state guaranteed to
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0 is in the positive examples



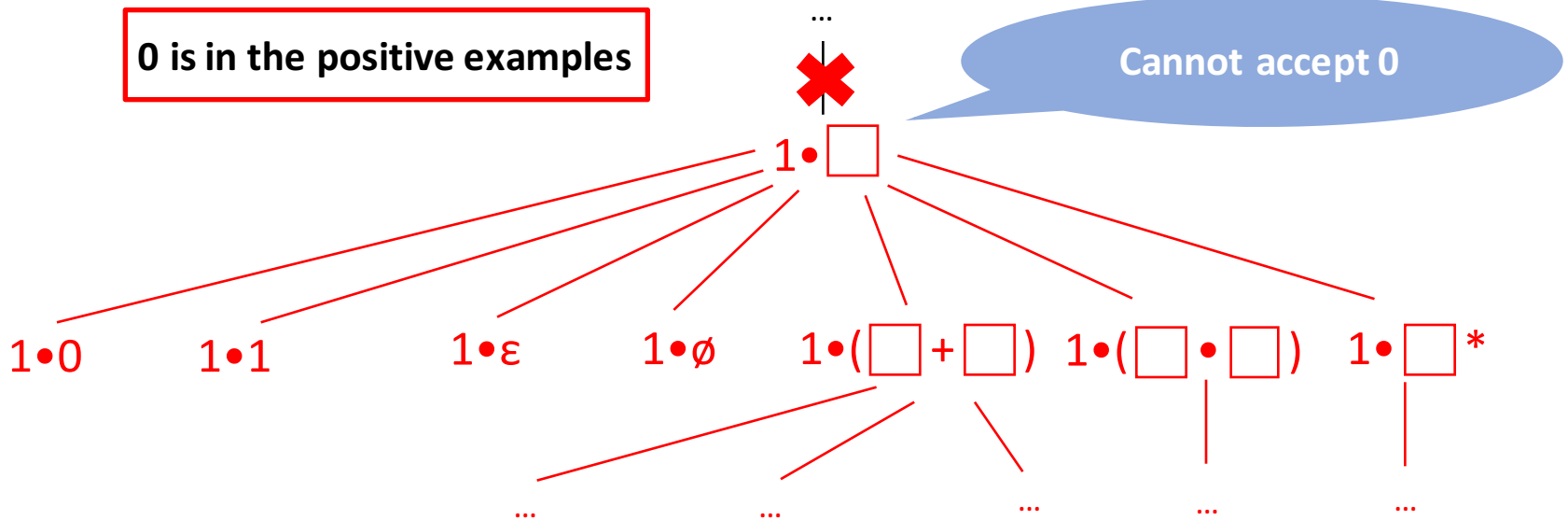
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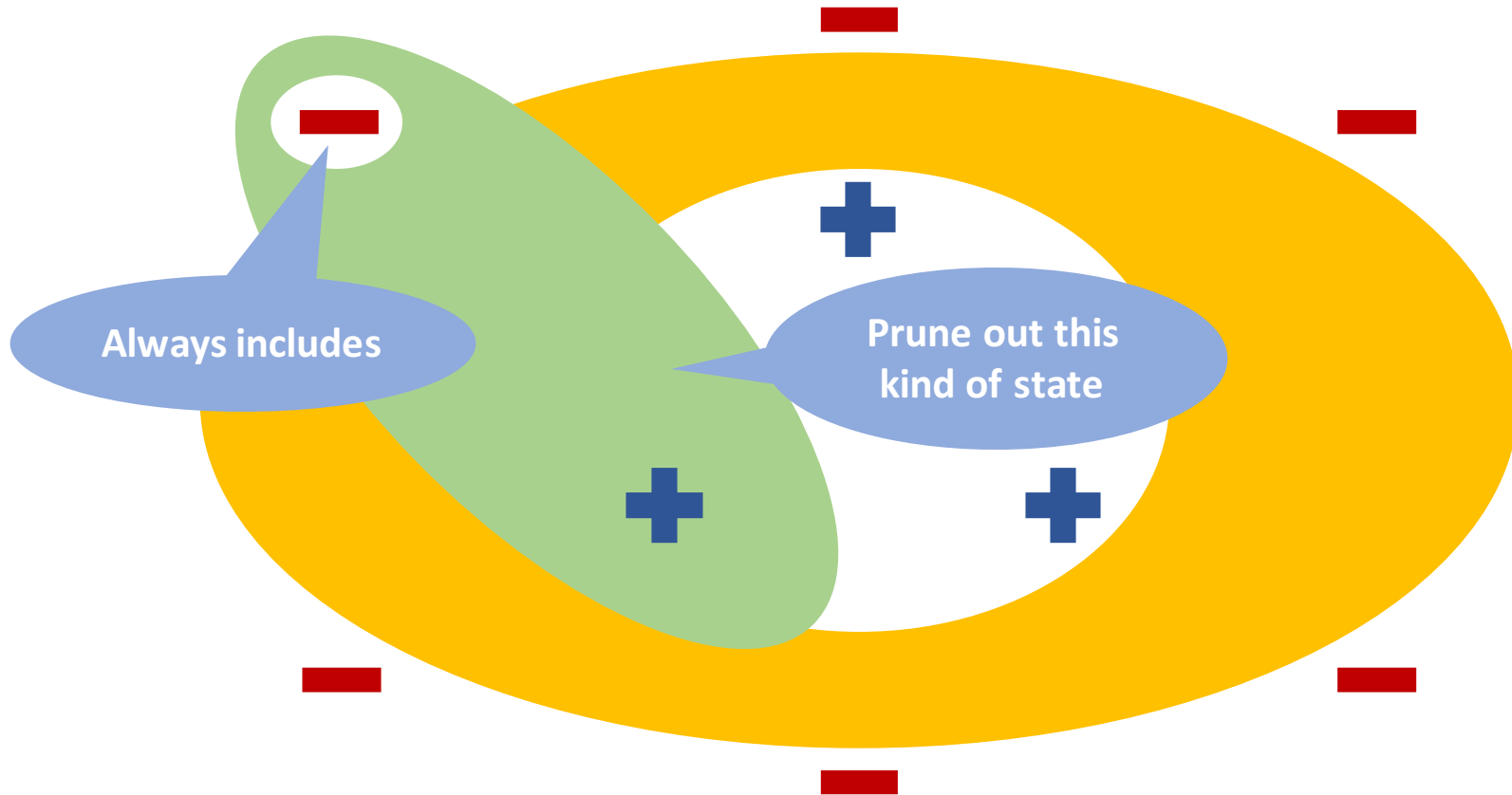
2. Over Approximations

Prune out the state guaranteed to
reject some positive examples.

- How can we over approximate the states?
 1. Replace all holes(\square) with Σ^* (= $(0+1)^*$).
 2. Check if it can accept every positive example.

3. Under Approximations

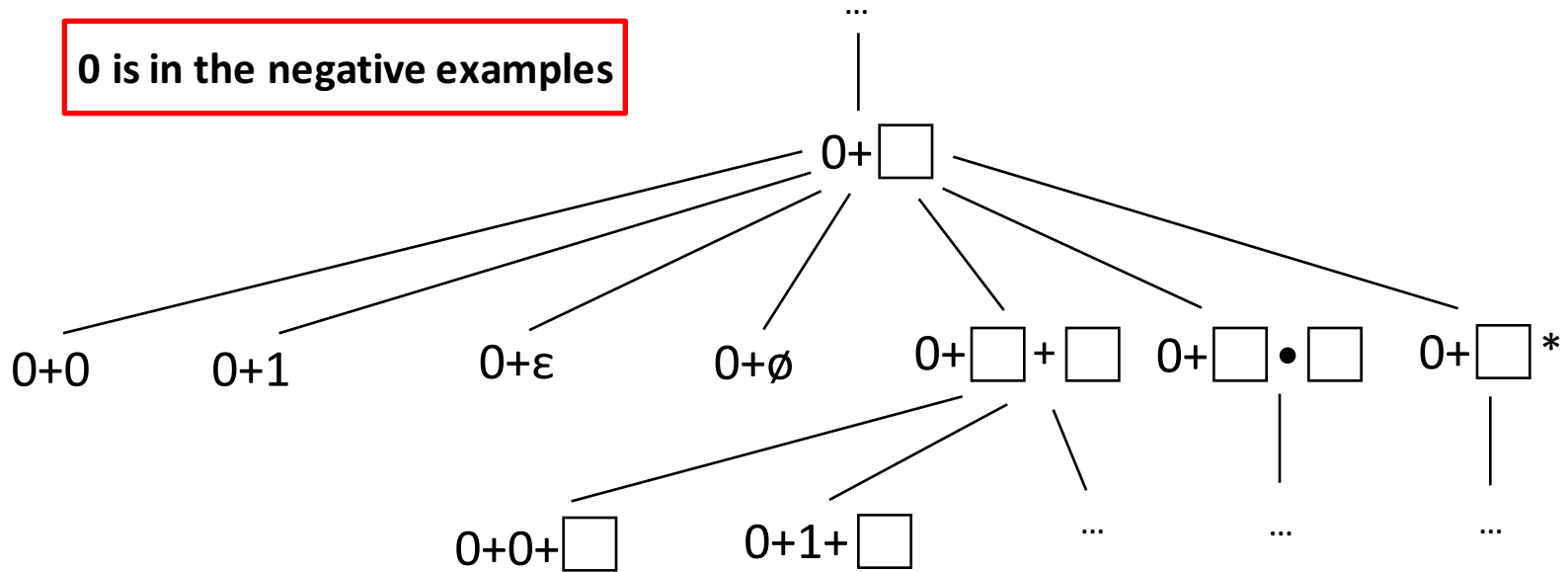
Prune out the state guaranteed to
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Prune out the state guaranteed to
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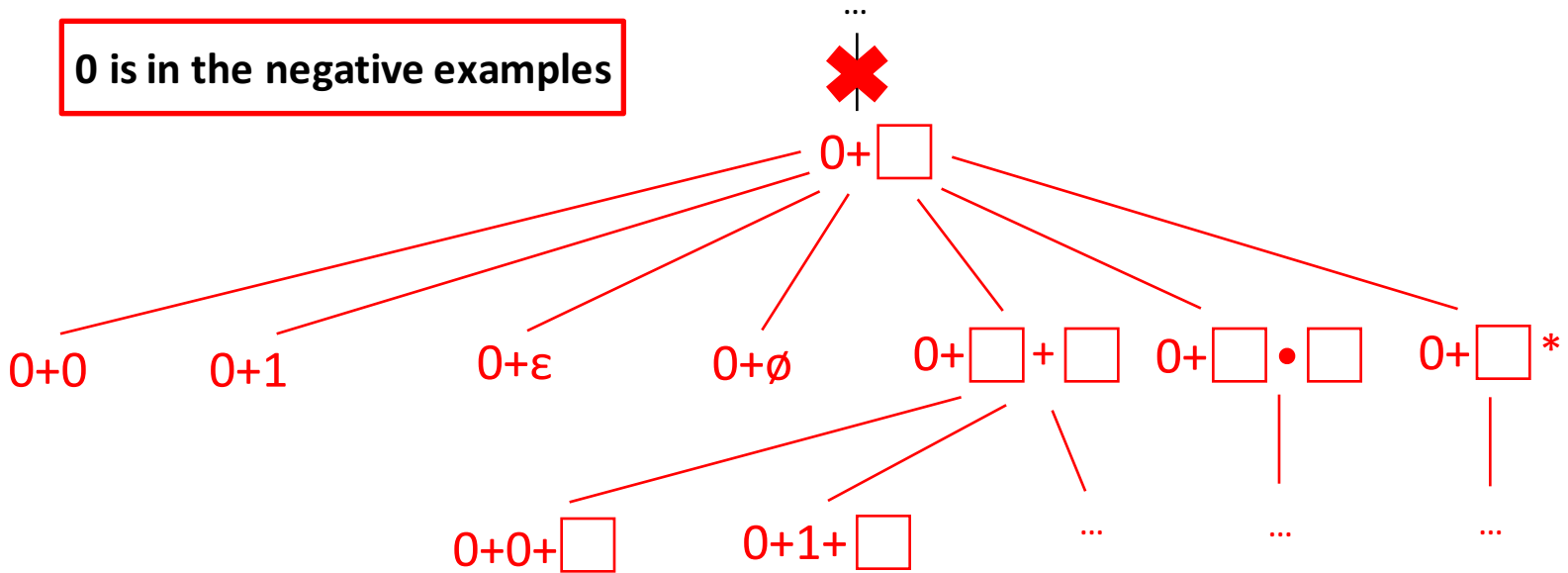
0 is in the negative examples



3. Under Approximations

Prune out the state guaranteed to
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0 is in the negative examples

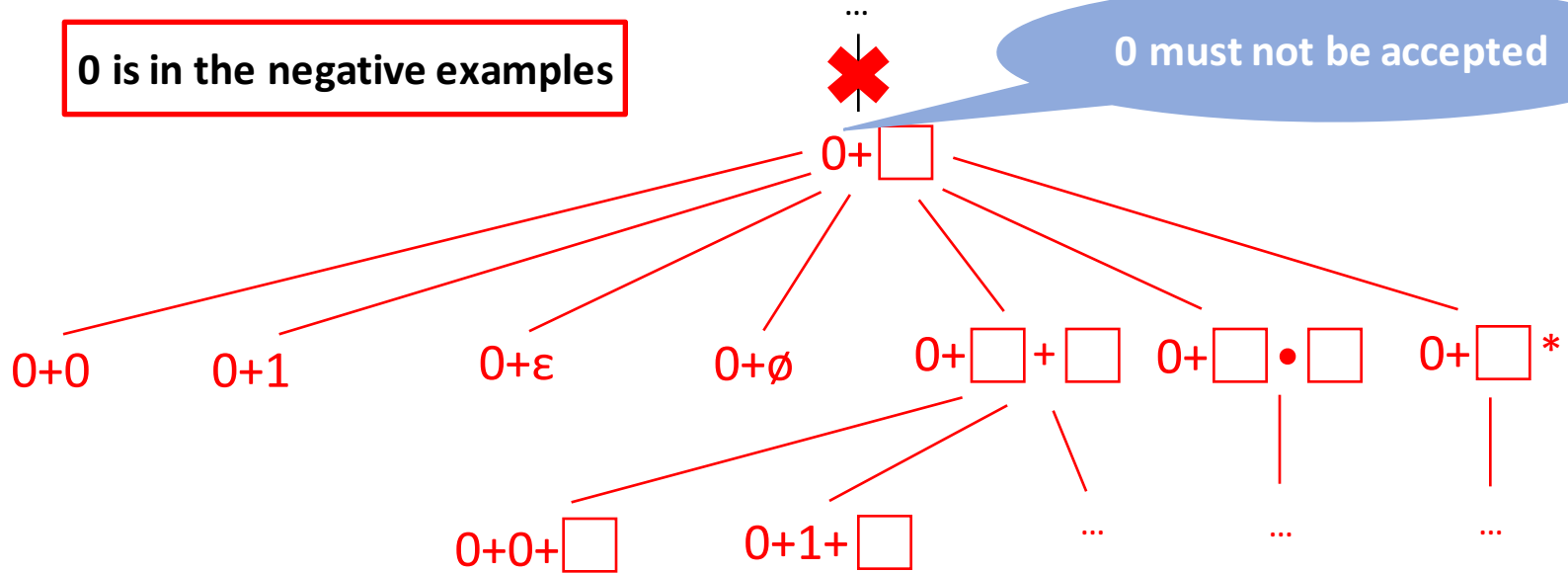


3. Under Approximations

Prune out the state guaranteed to
accept some negative examples.

0 is in the negative examples

0 must not be accepted



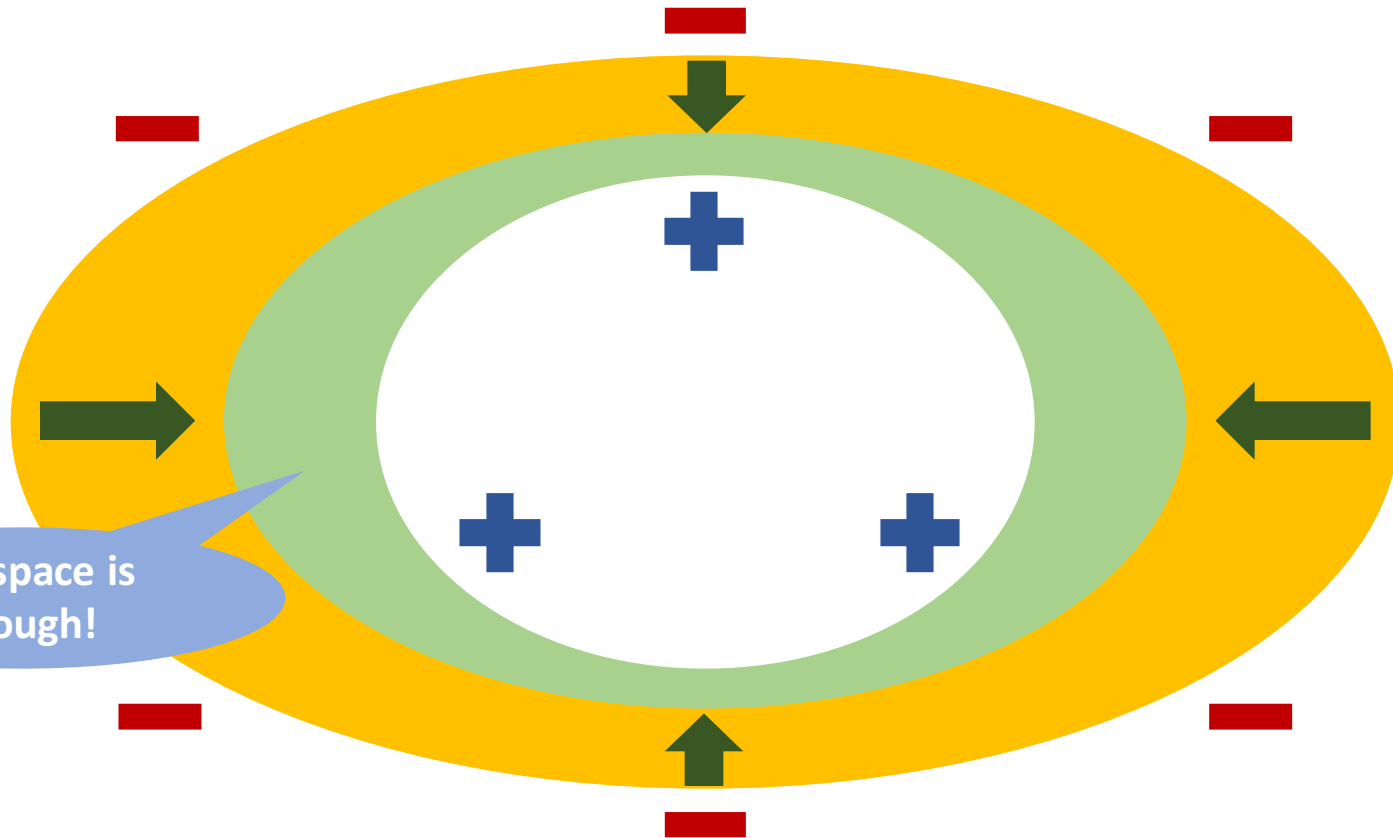
3. Under Approximations

Prune out the state guaranteed to
accept some negative examples.

- How can we under approximate the states?
 1. Replace all holes(\square) with \emptyset .
 2. Check if it accepts any negative examples.

4. Redundant States

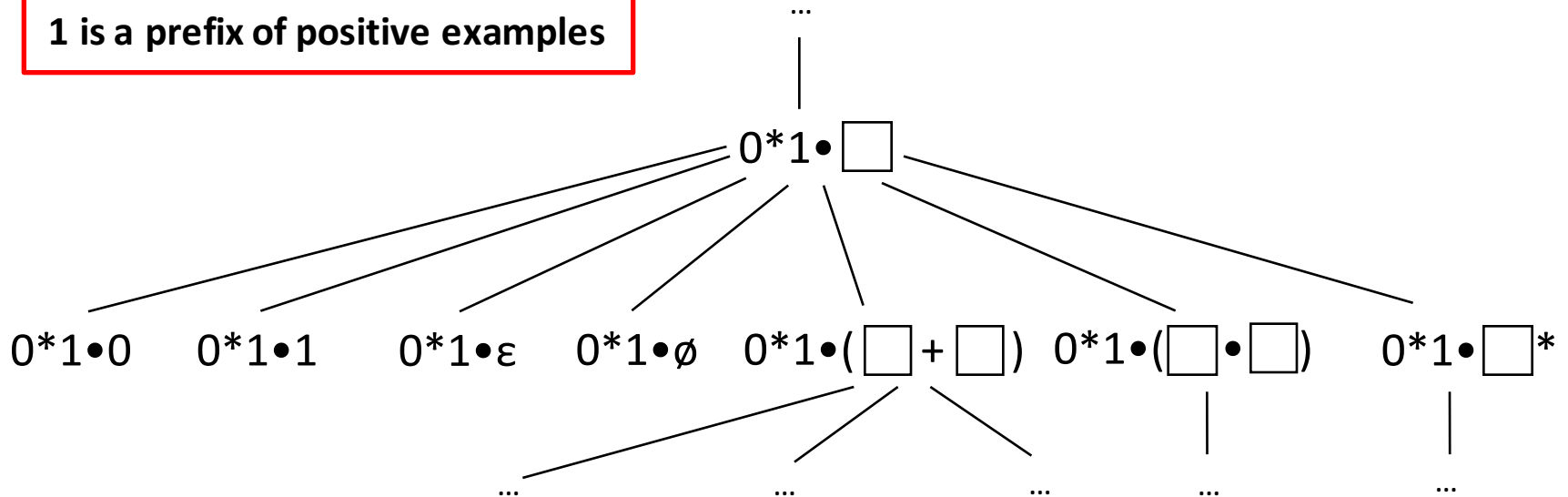
Prune out the state
if the state **has redundant symbols.**



4. Redundant States

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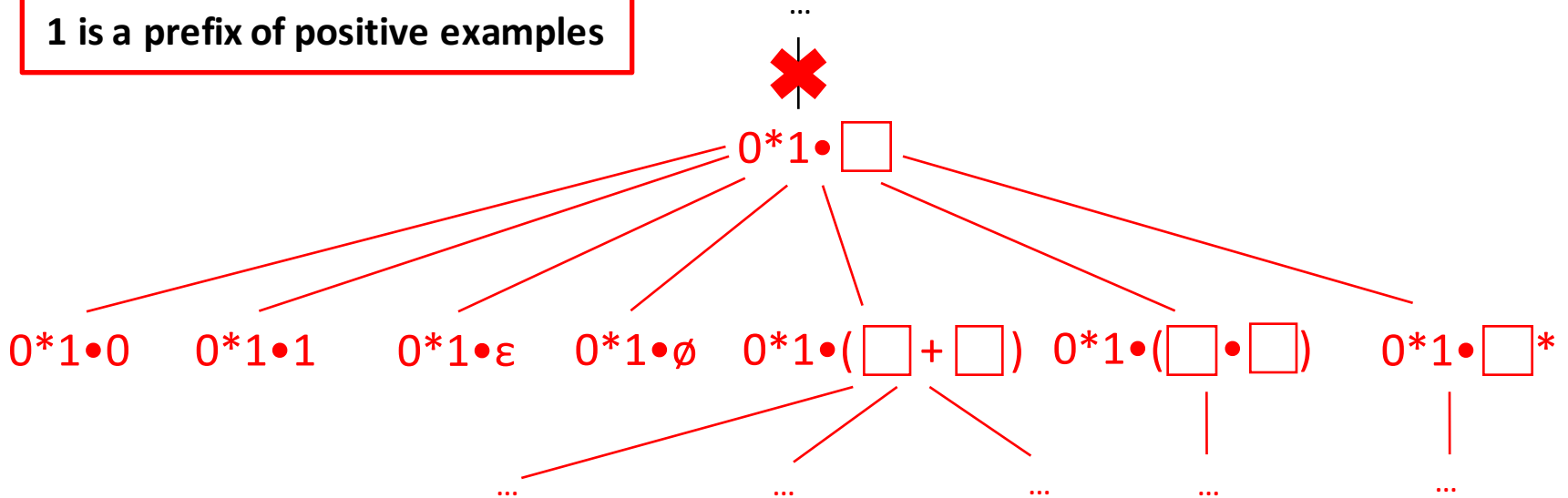
1 is a prefix of positive examples



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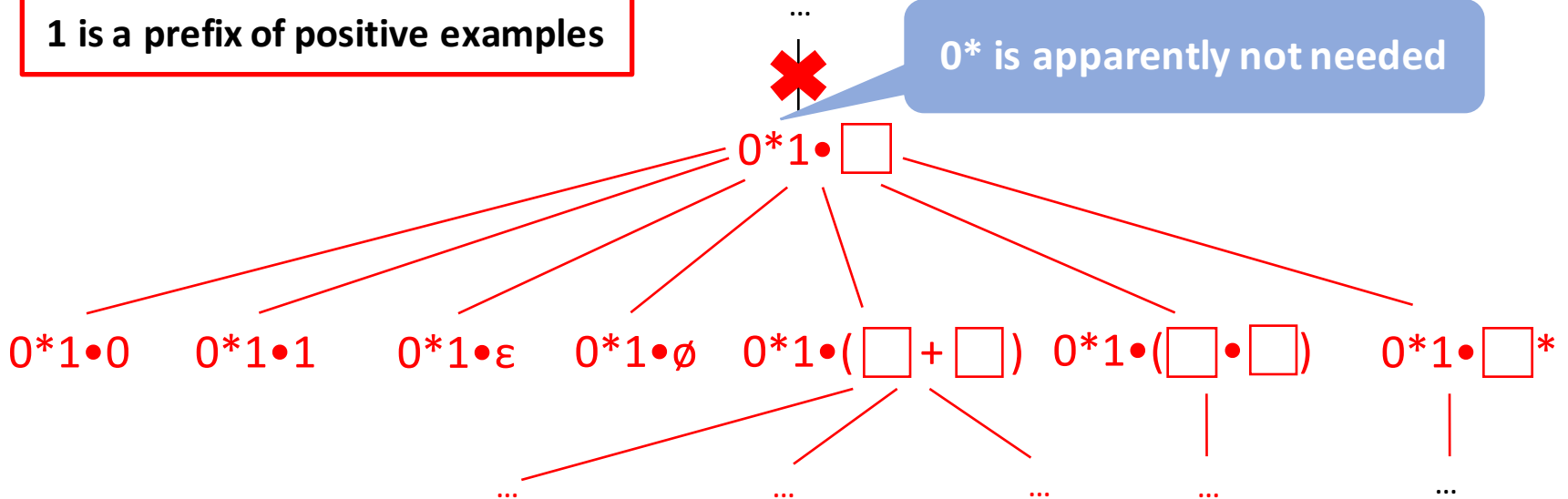


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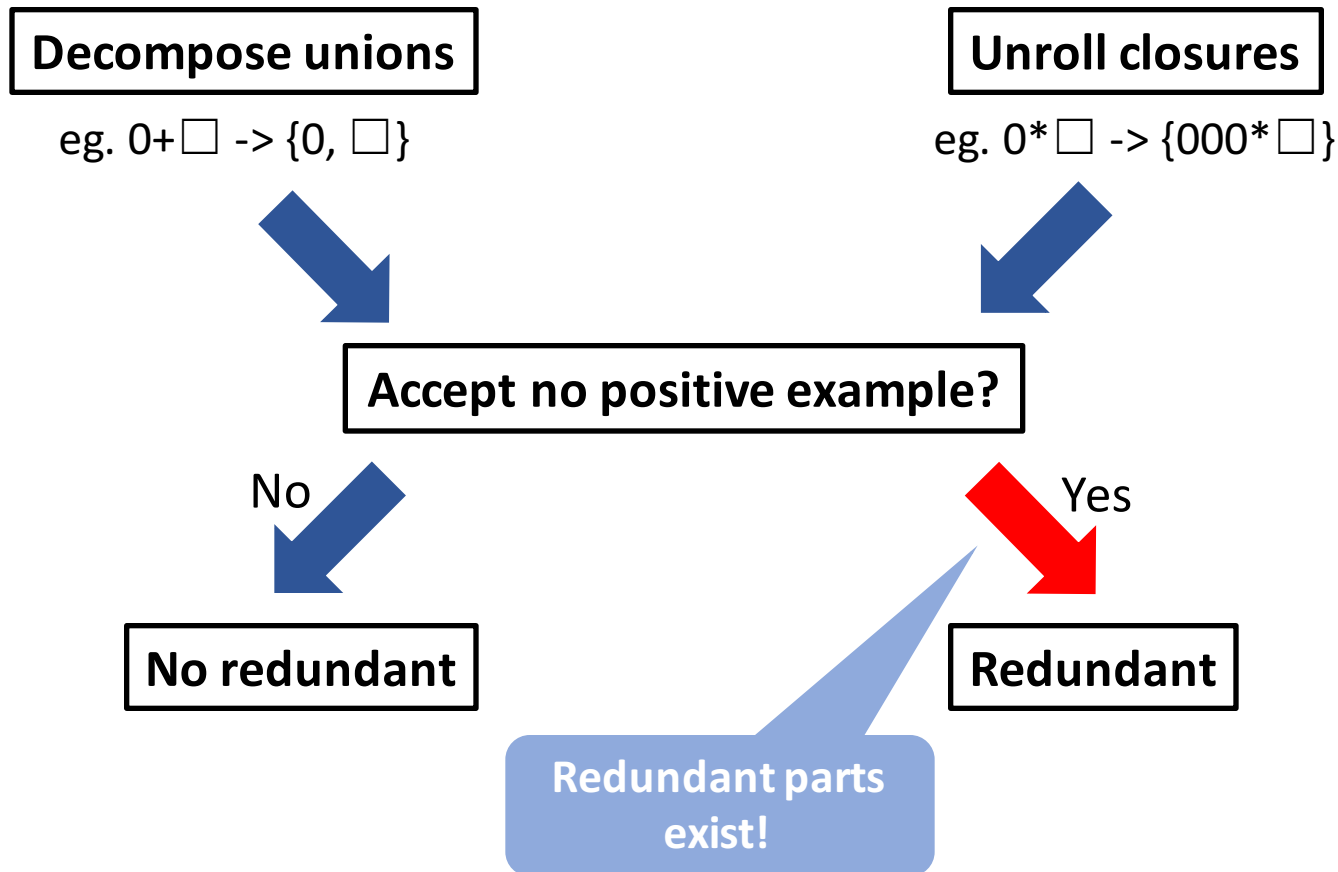
1 is a prefix of positive examples

0* is apparently not needed



4. Redundant States

- How can we identify redundant states?
 - Identify **redundant unions** and **closures**.



Completeness

If **there exists a solution** for the given examples,
it will be **eventually found**.

Evaluation

- **25 problems from textbooks.**
- **3 levels of difficulty.**
 - **Easy, Normal, Hard**
- **Positive, Negative examples are < 10 for each problem, respectively.**

Evaluation

	Full	All-Off	No Apr	No Eq	No Rd
Average (Time : sec)	<u>6.7</u>	> 6599.3	284.8	27.8	18.8

Conducted on an Ubuntu machine with Intel Xeon CPU E5-2630 (2.40GHz).

- Average runtime : **6.7 sec**
 - Worst case < 1 min

Evaluation

	Full	All-Off	No Apr	No Eq	No Rd
Average (Time : sec)	<u>6.7</u>	> 6599.3	284.8	27.8	18.8

Conducted on an Ubuntu machine with Intel Xeon CPU E5-2630 (2.40GHz).

- Exhaustive Search Only (All-Off)
 - 5 of 25 : > 10,000 sec

Evaluation

	Full	All-Off	No Apr	No Eq	No Rd
Average (Time : sec)	<u>6.7</u>	> 6599.3	284.8	27.8	18.8

Conducted on an Ubuntu machine with Intel Xeon CPU E5-2630 (2.40GHz).

- **Effectiveness**

1. Over- and Under Approximations (~~X~~ 42.5 ↑)

2. Identifying Equivalent states (~~X~~ 4.1 ↑)

3. Identifying Redundant states (~~X~~ 2.8 ↑)

Conclusion

- RE synthesizer for automata class
- Exhaustive search with simple pruning
- Complete : Guaranteed to find a solution

Thank you !