

Computational Complexity

Lecture 4

in which Diagonalization takes on itself,
and we enter Space Complexity
(But first Ladner's Theorem)

Ladner's Theorem

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 - No!
 - Can show an NP language which is neither in P , nor NP complete (unless $P = NP$)

Ladner's Theorem: Proof

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- To define H s.t. $H(n)$ bounded by const. iff SAT_H in P

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$ z $ $M_i T_i$									
	✓	✗	✗	✓	✗	✗	✗	✗	✓
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	✓	✓	✓	✓	✓	✓	✓	✗	✗
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- Put \checkmark at (i,t) if $M_i|T_i$ agrees with SAT_H on all z , $|z|=t$; else put \times

$M_i T_i \backslash z $									
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$M_i T_i$							$\log n$		
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$M_i T_i$							$\log n$		
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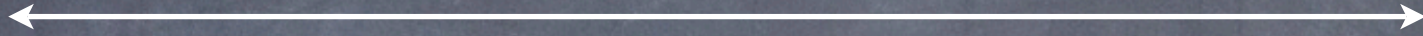
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 - Both equivalent to having a row of all \checkmark

$ z $									
$M_i T_i$							$\log n$		
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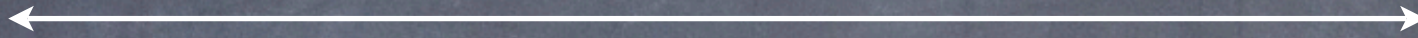
Meta-Questions

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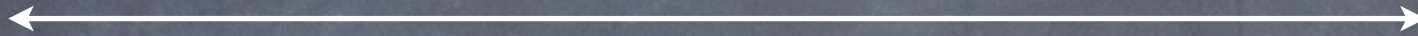
"Real" Questions



Meta-Questions

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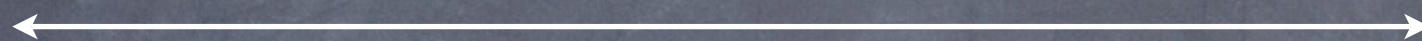
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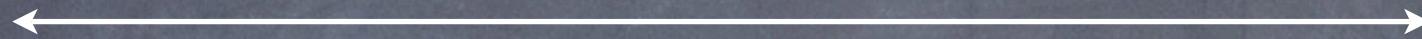


SAT in $DTIME(n^2)$?

Meta-Questions

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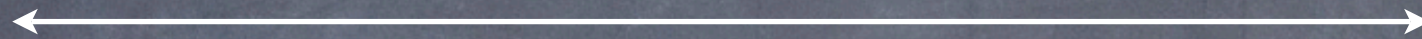
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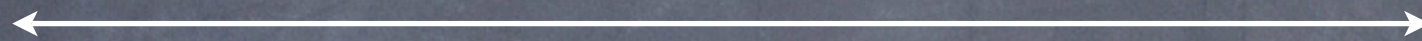
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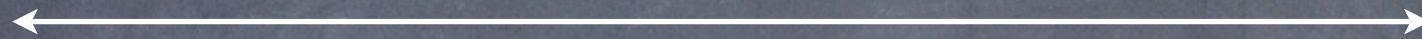
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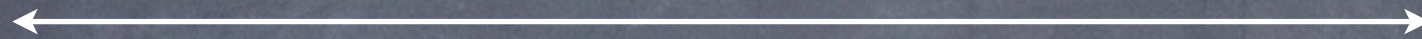
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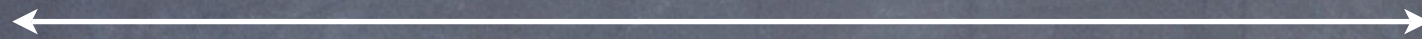
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Under-the-hood stuff

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Equivalence carries over!

Proofs that Relativize

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 - Said to “relativize”

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 - Does their relation (equality or not) relativize?
 - No! Different in different worlds!
 - There exist languages A, B such that $P^A = NP^A$, but $P^B \neq NP^B$!

$$A \text{ s.t. } P^A = NP^A$$

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- A simple EXP-complete language:
 - $\text{EXPTM} = \{ (M, x, 1^n) \mid \text{TM represented by } M \text{ accepts } x \text{ within time } 2^n \}$

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- L in NP^B . To do: L not in P^B



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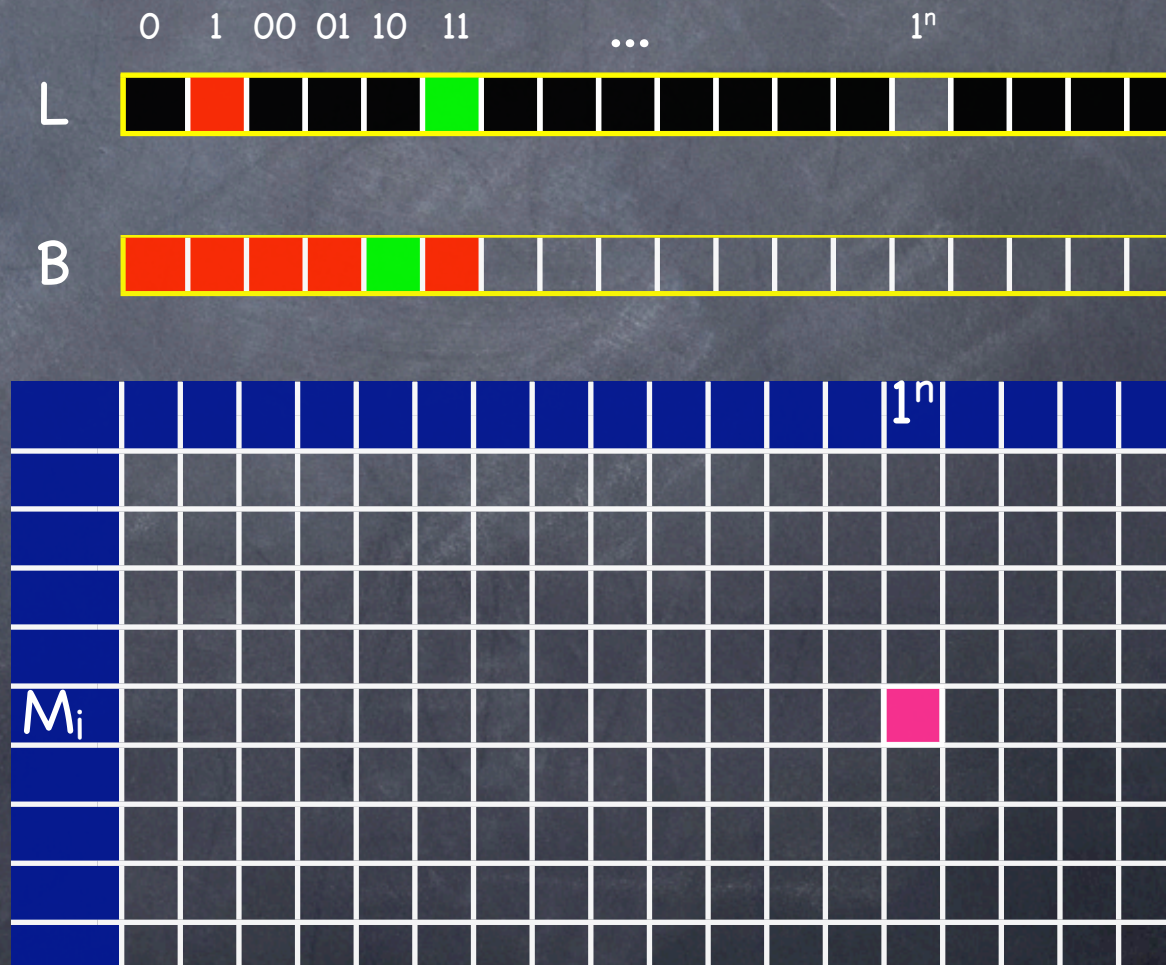
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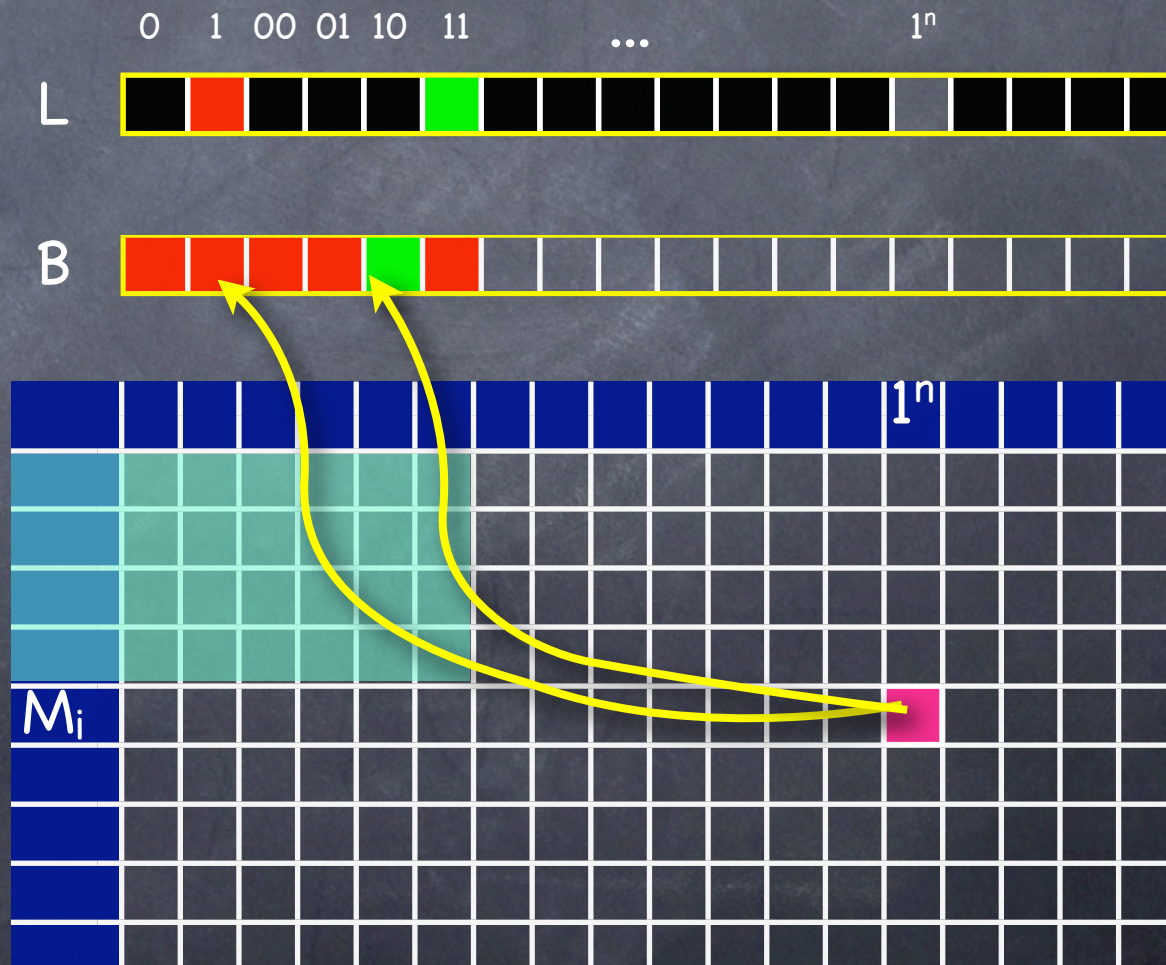
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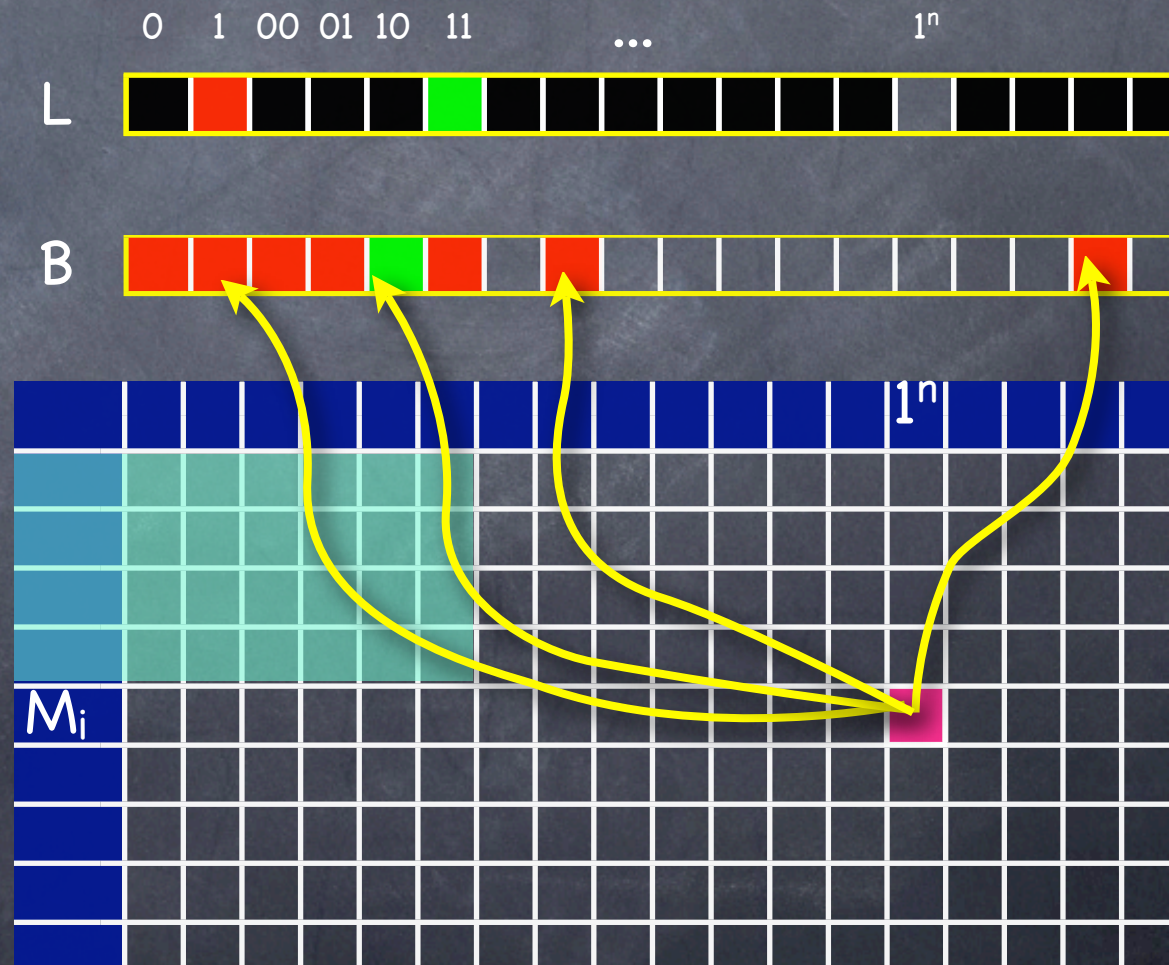
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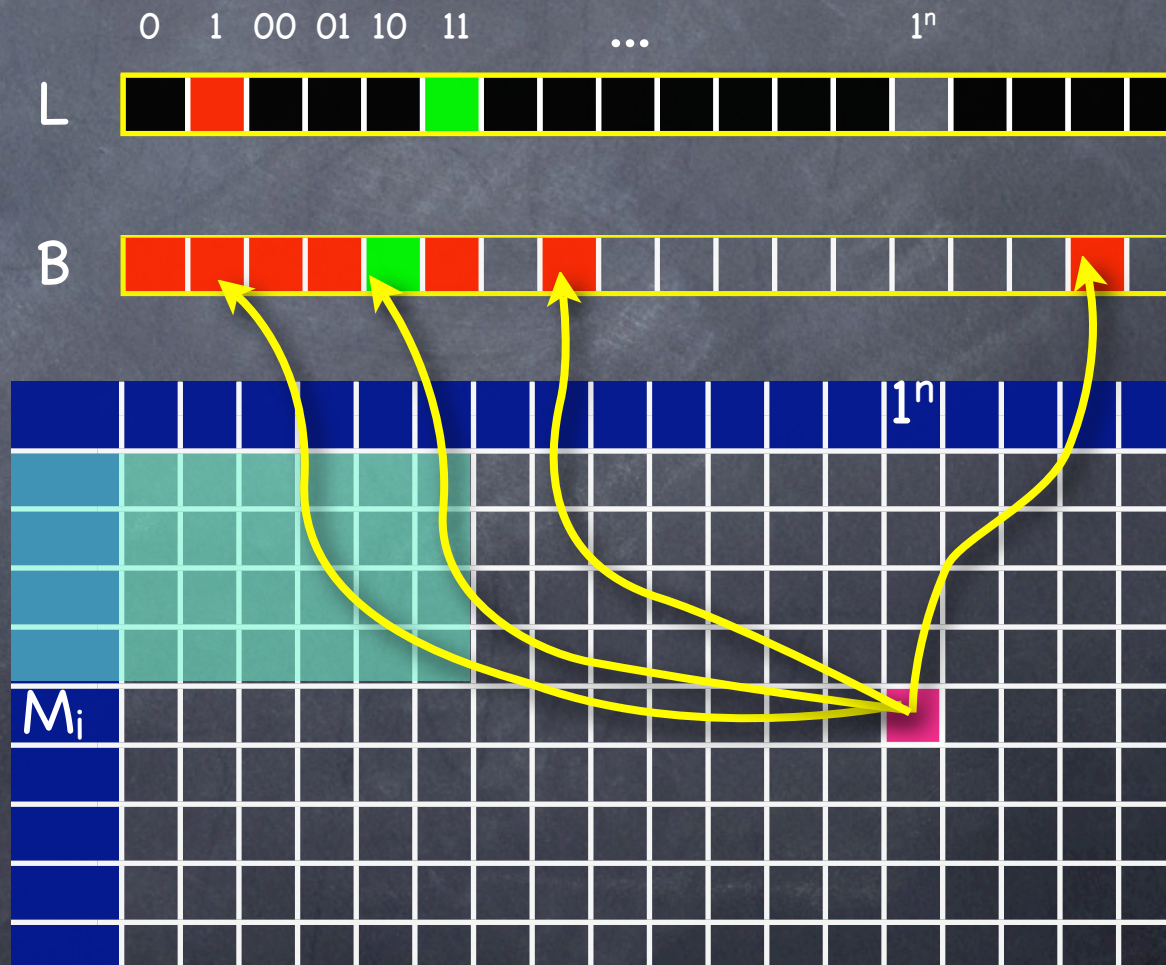
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 - e.g. of non-relativizing proof: that of Cook-Levin theorem

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 - Turns out, often a little memory can go a long way (if we can spare the time)

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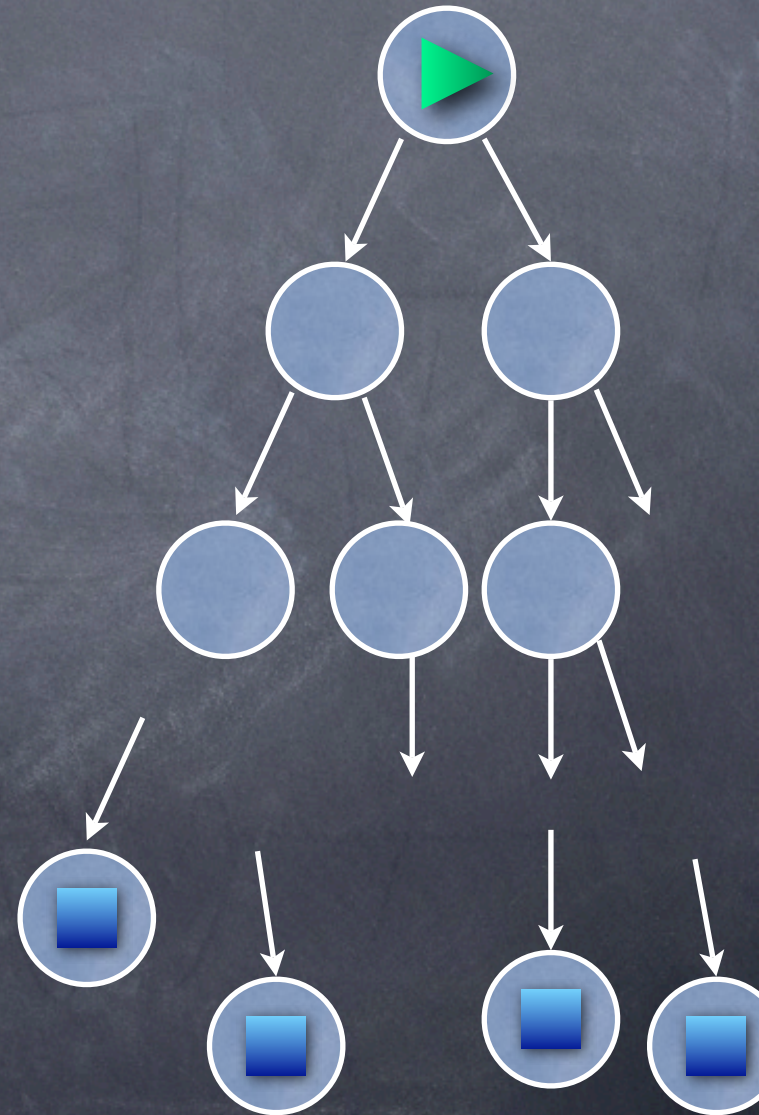
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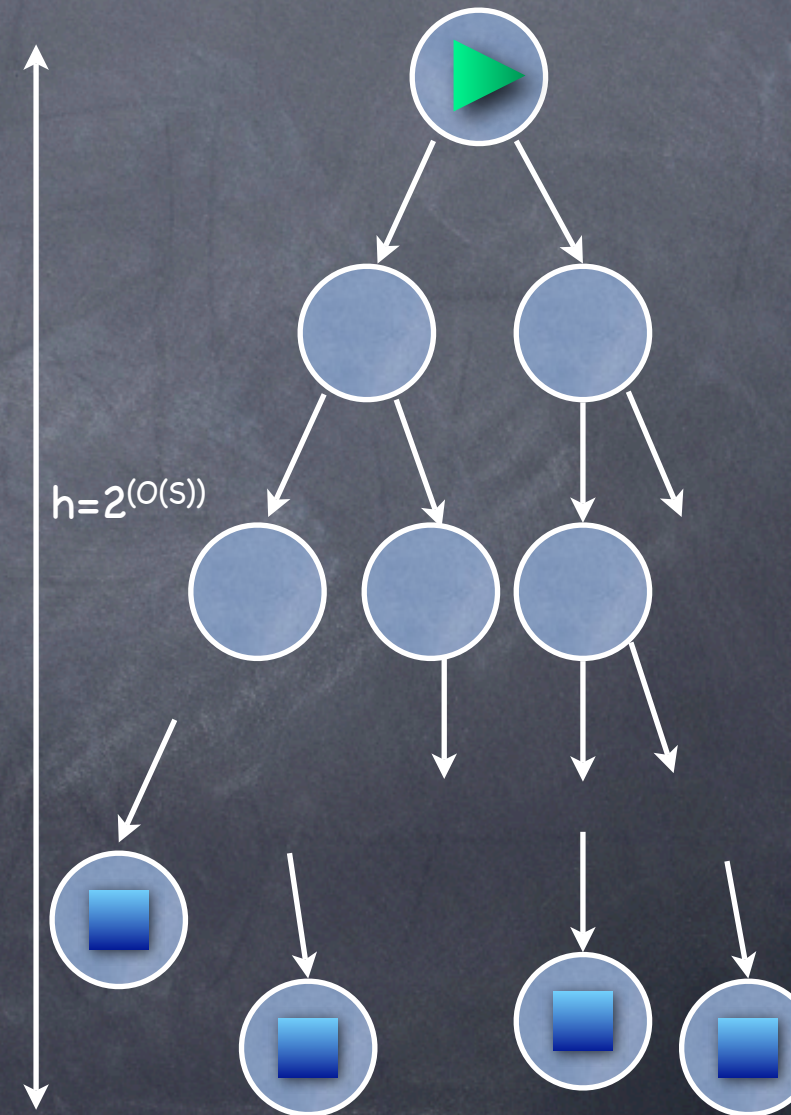
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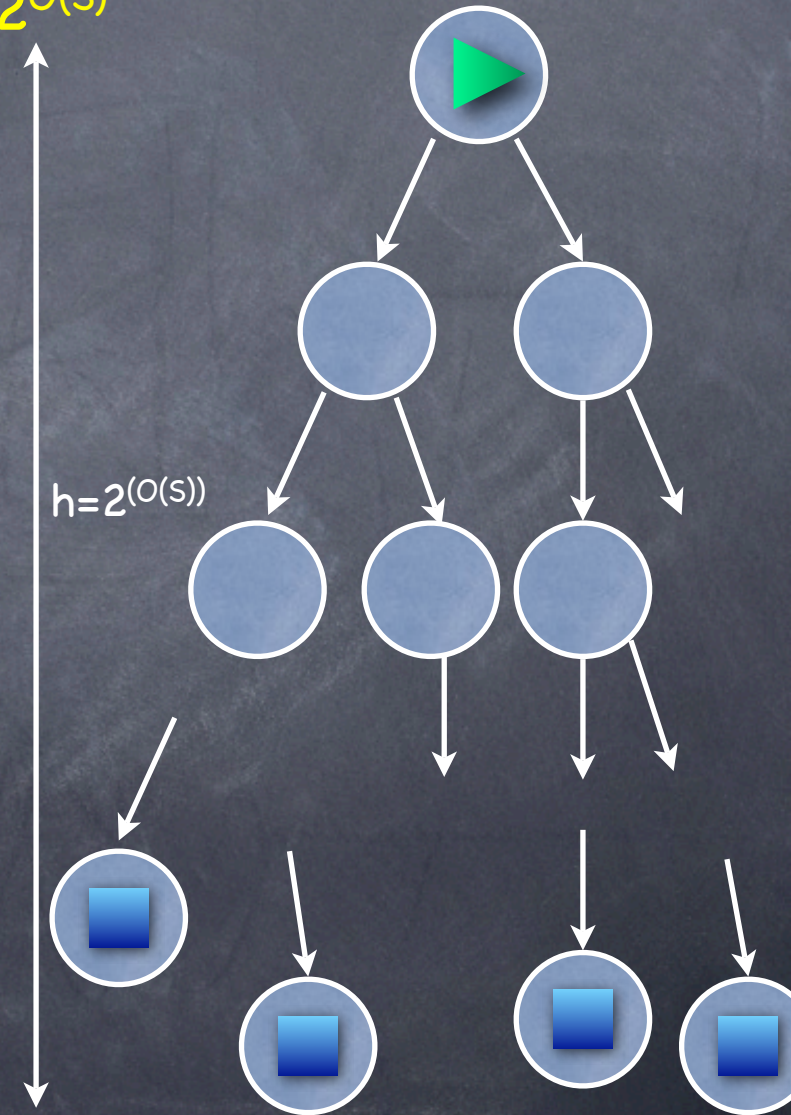


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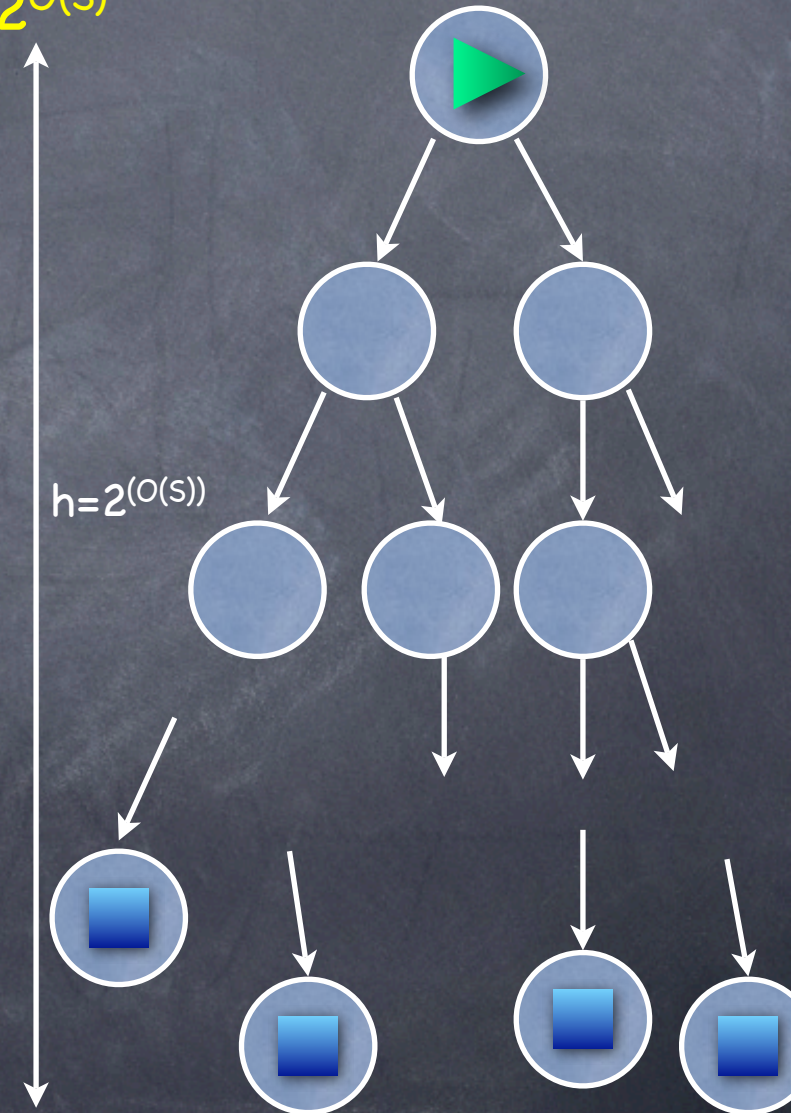
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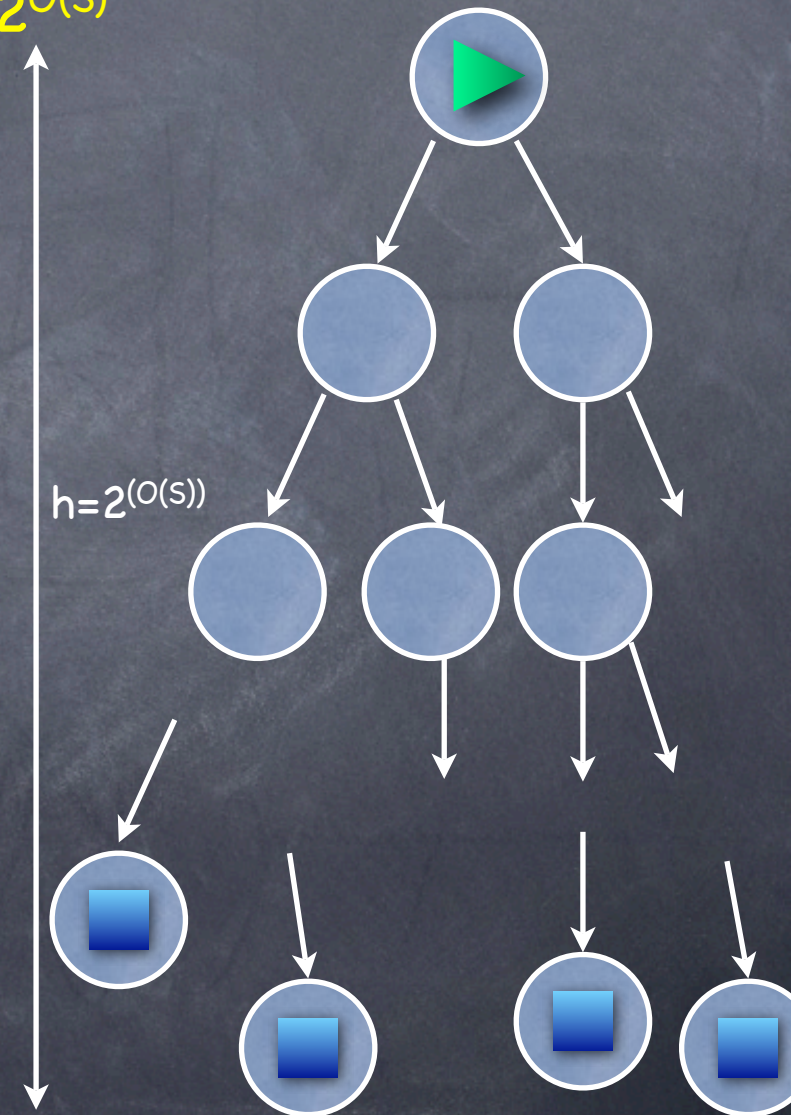


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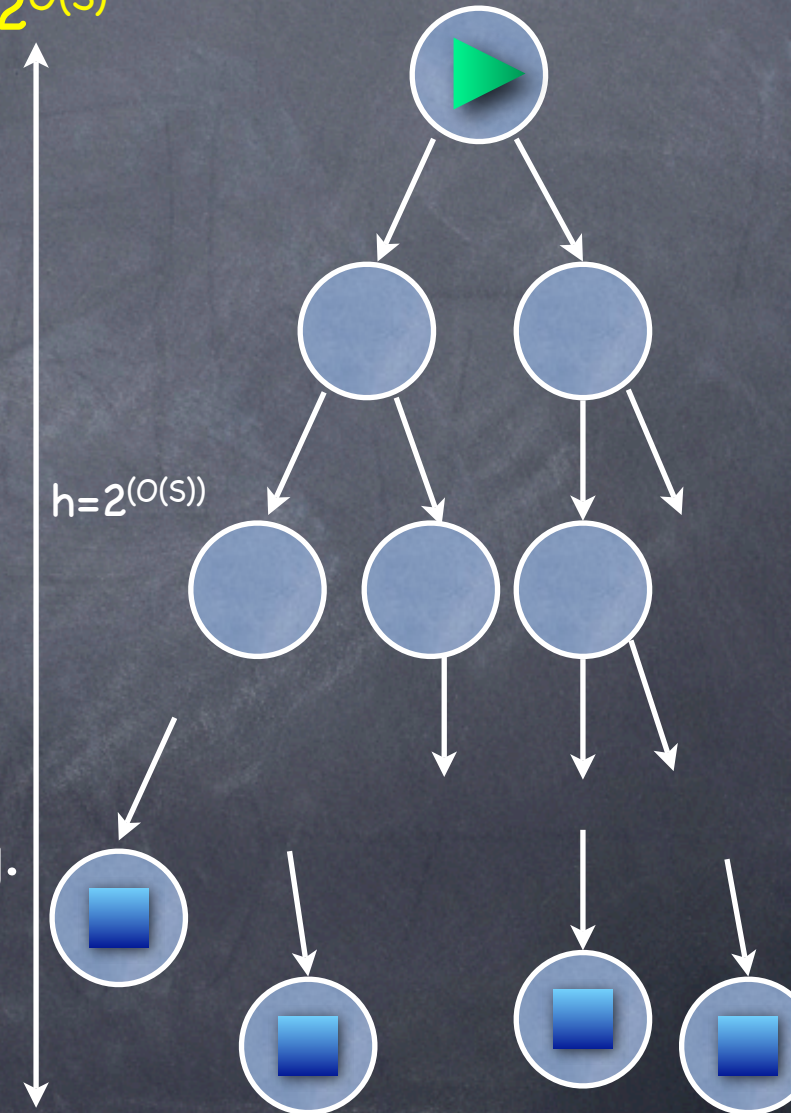
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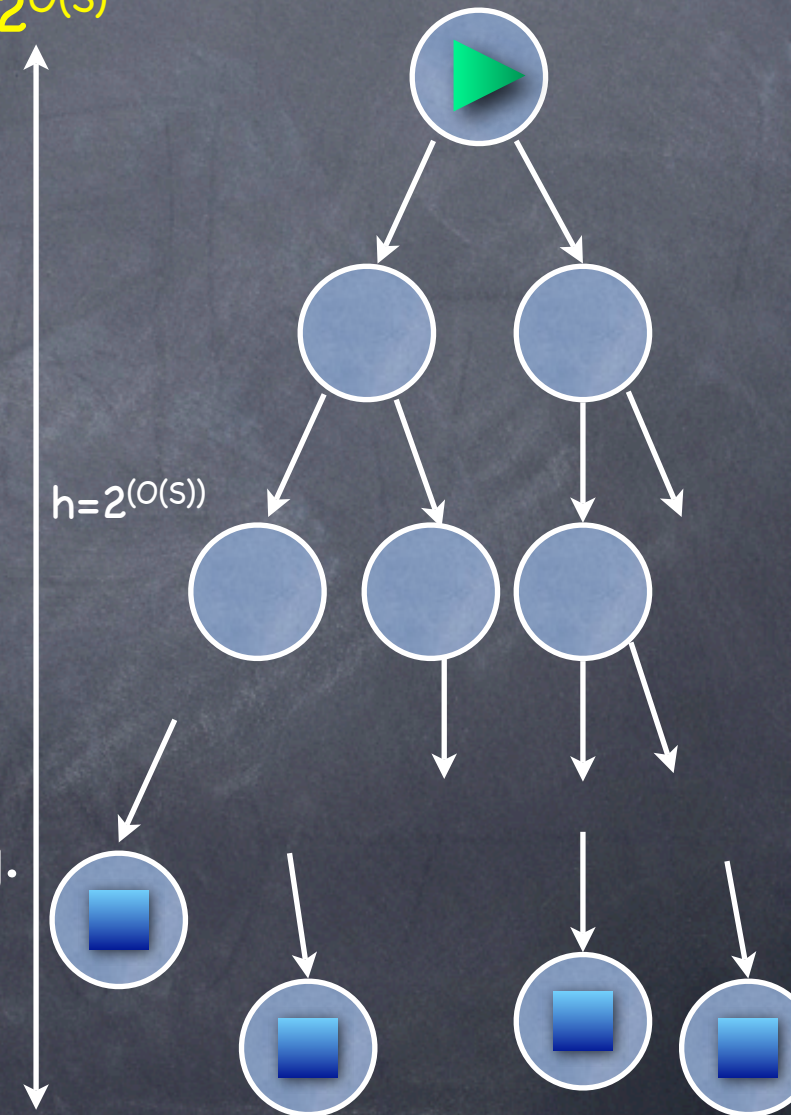
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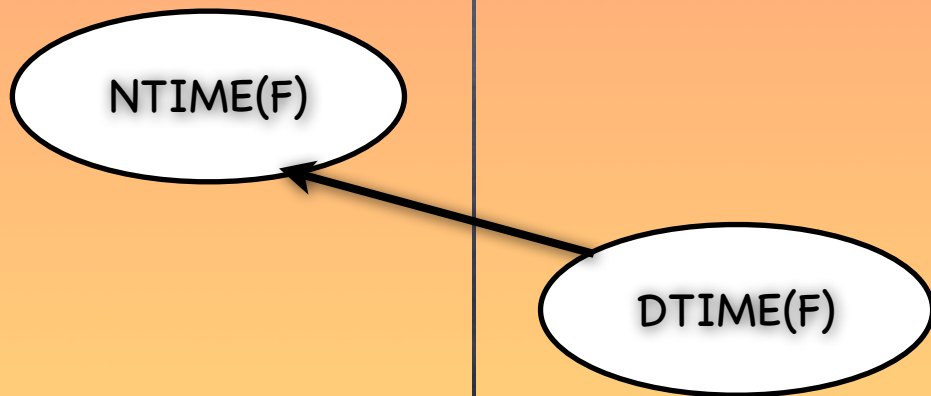
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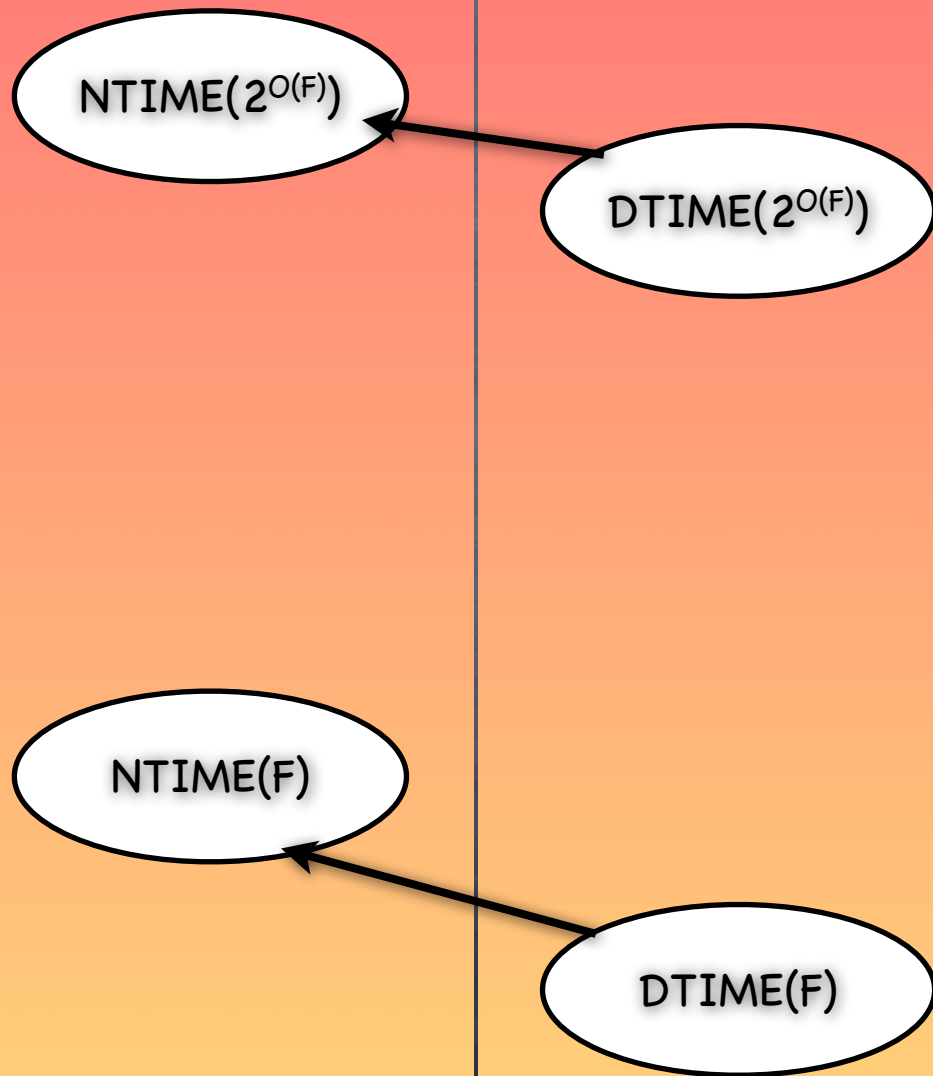
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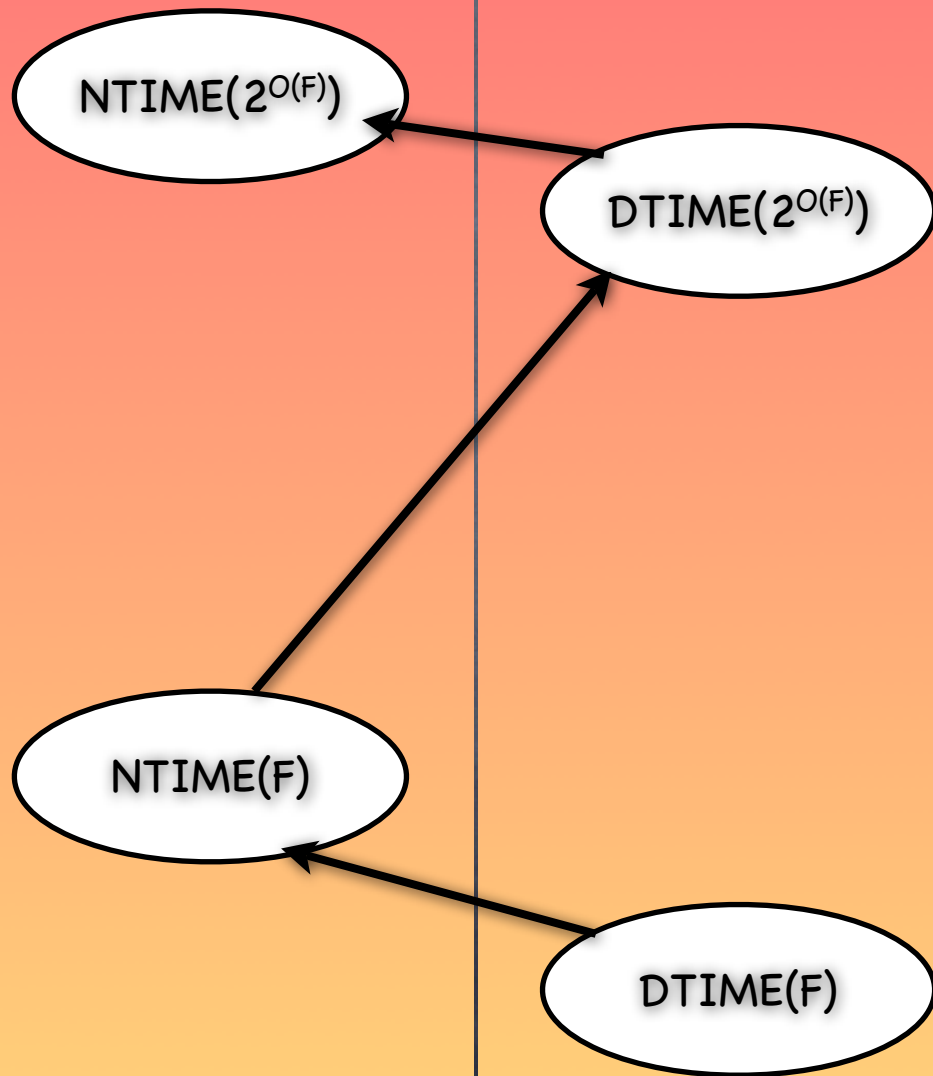
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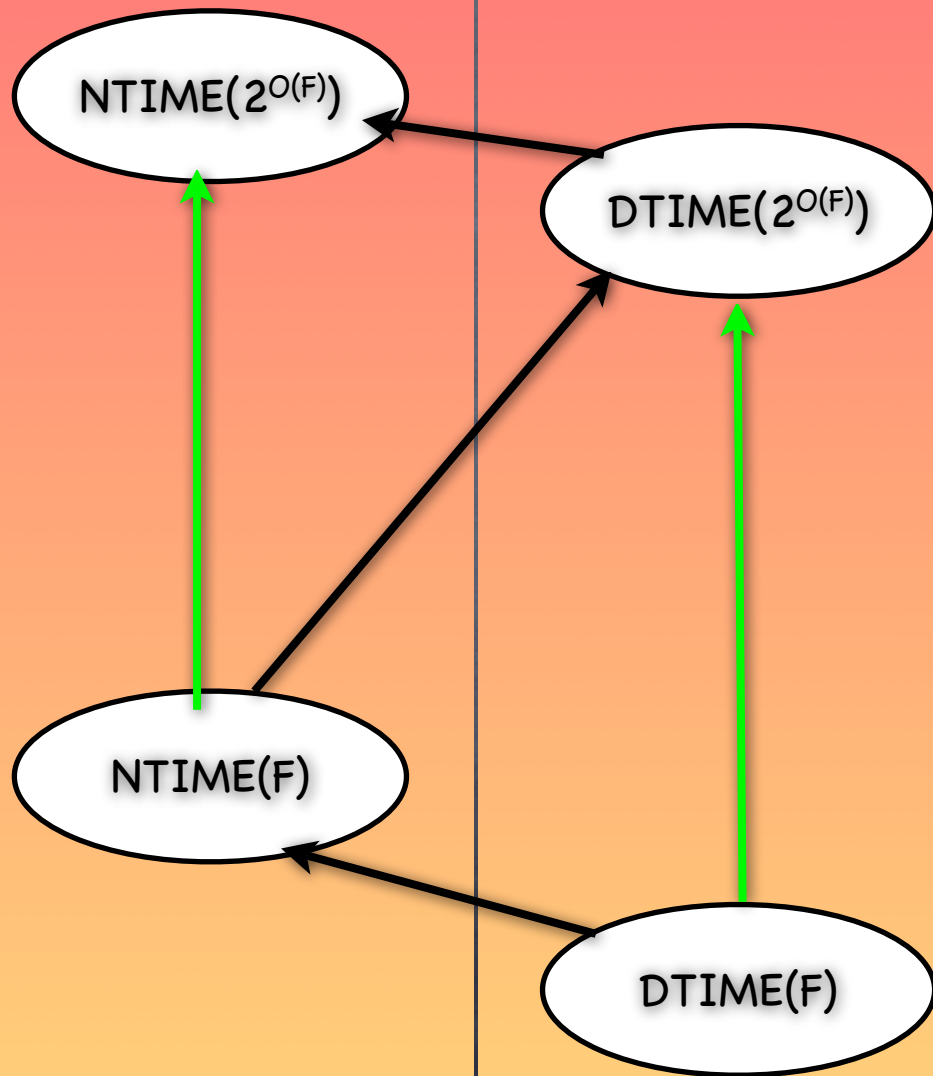
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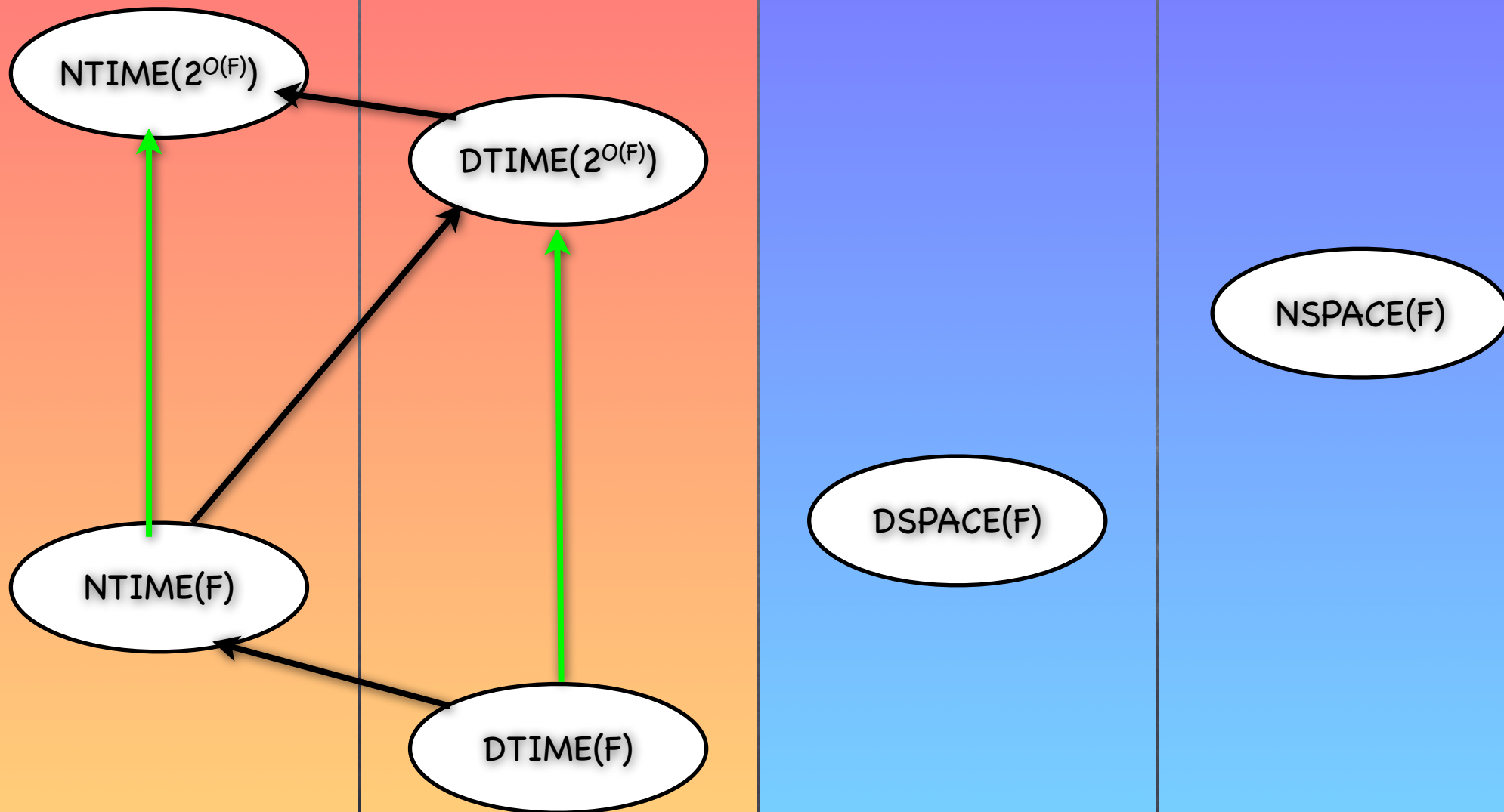
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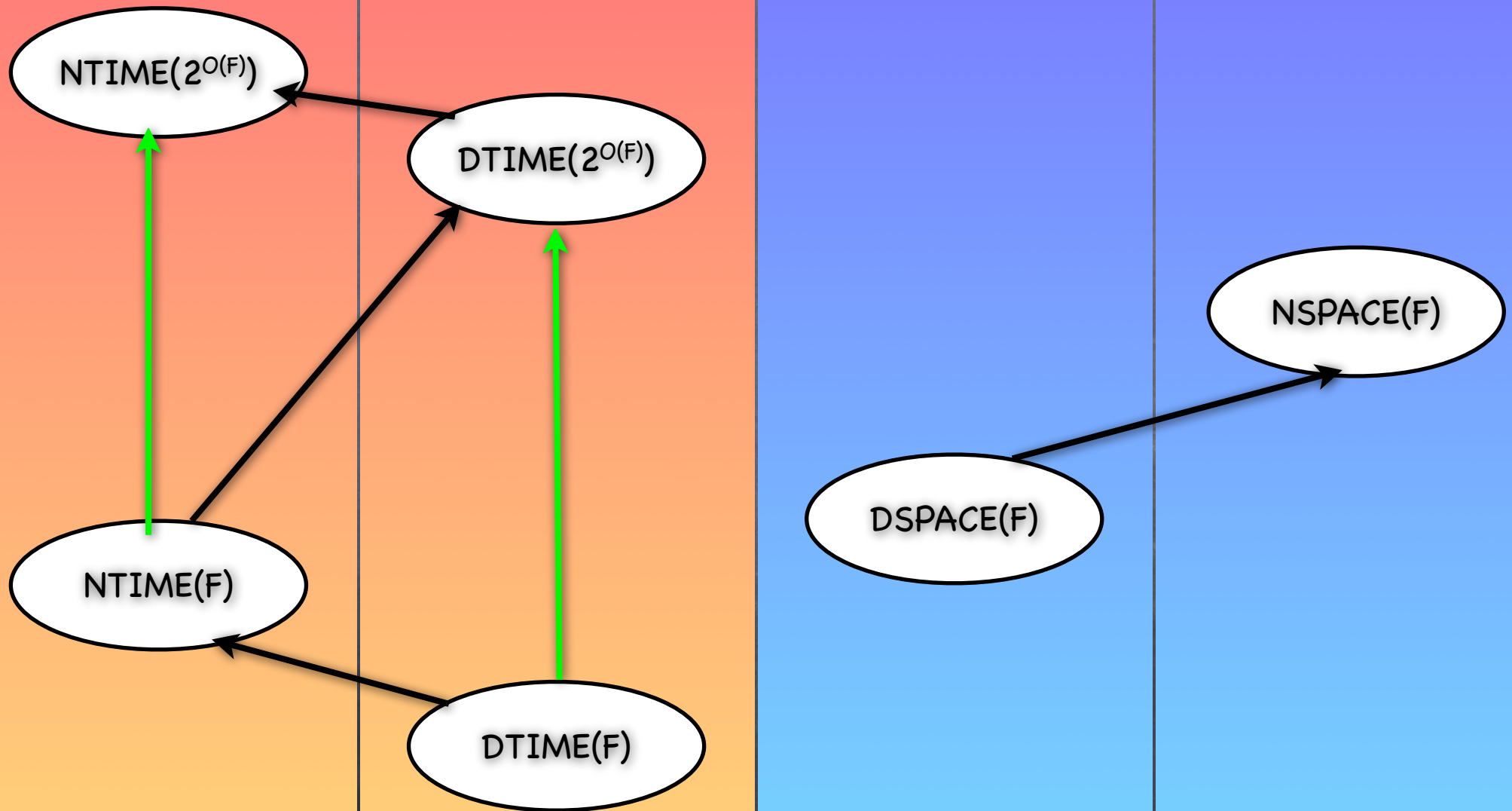
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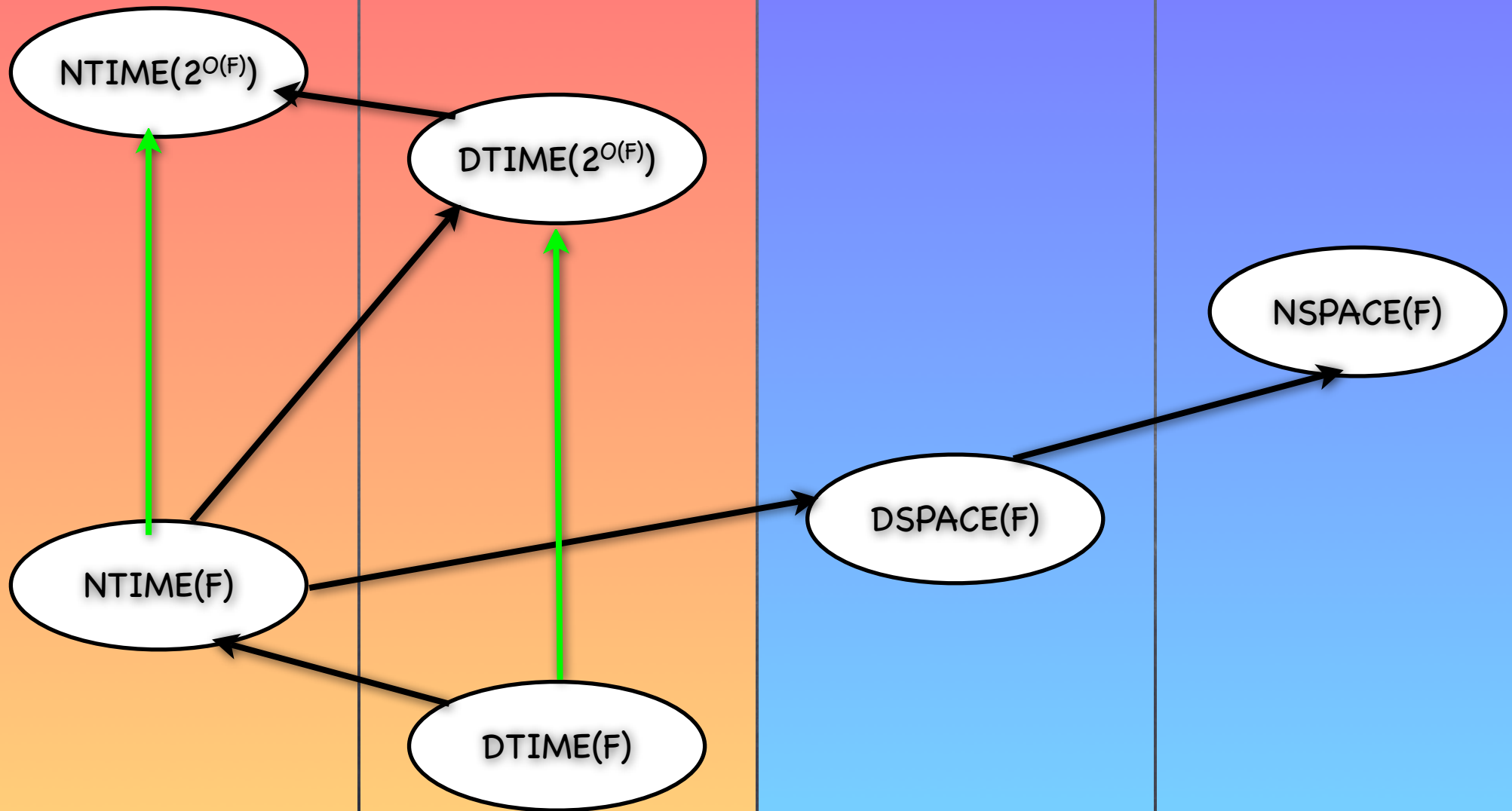
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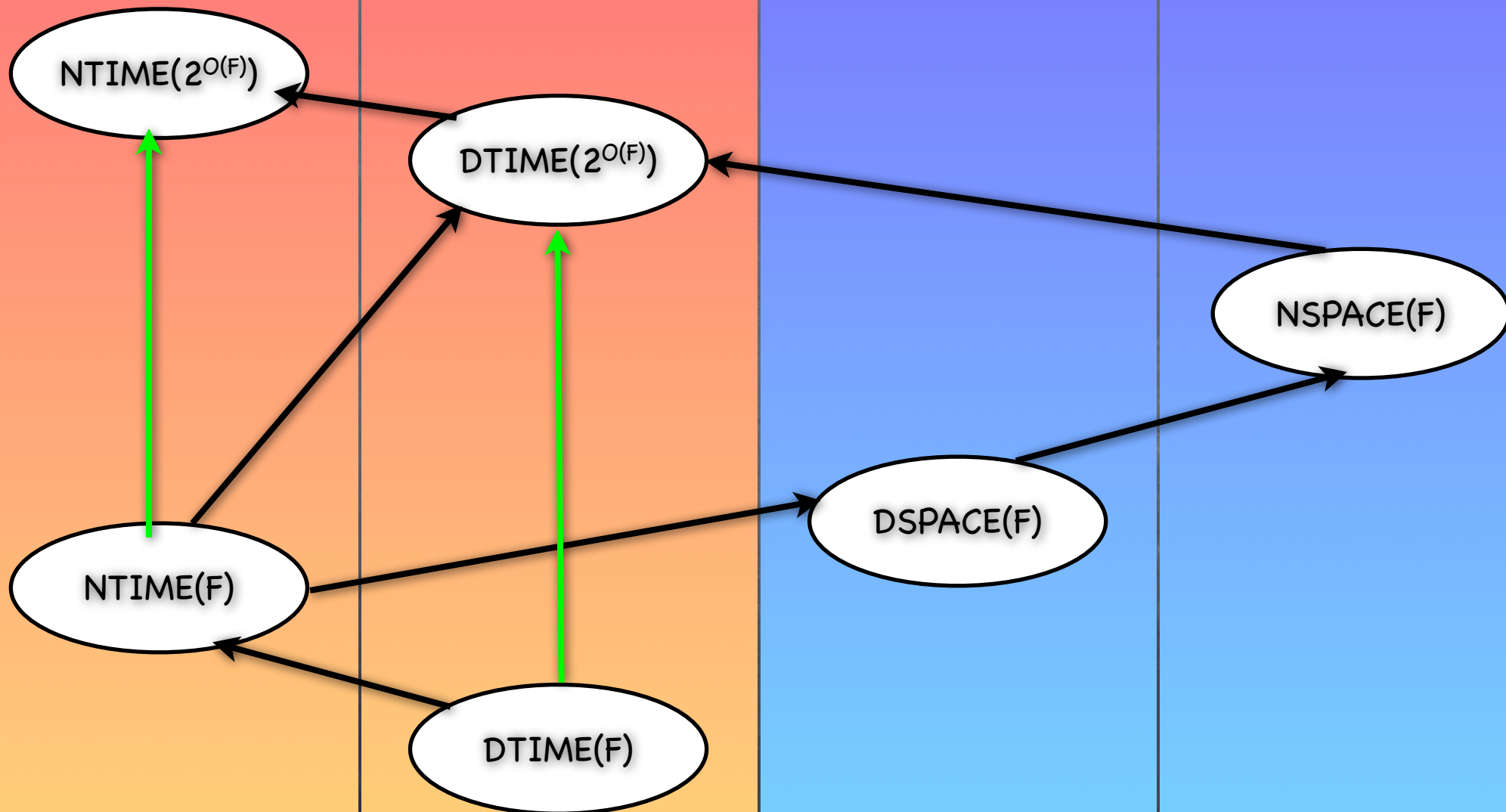
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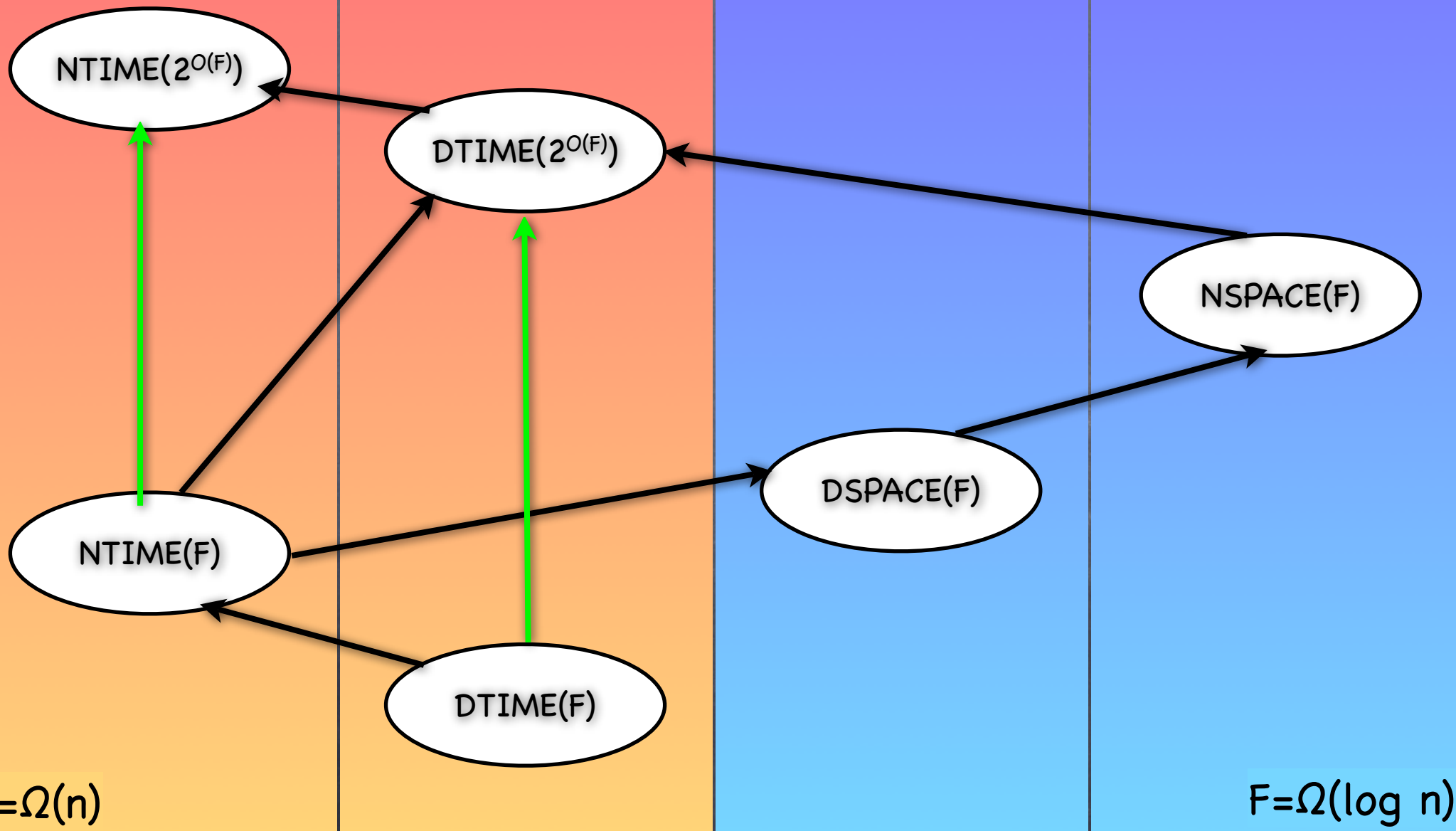
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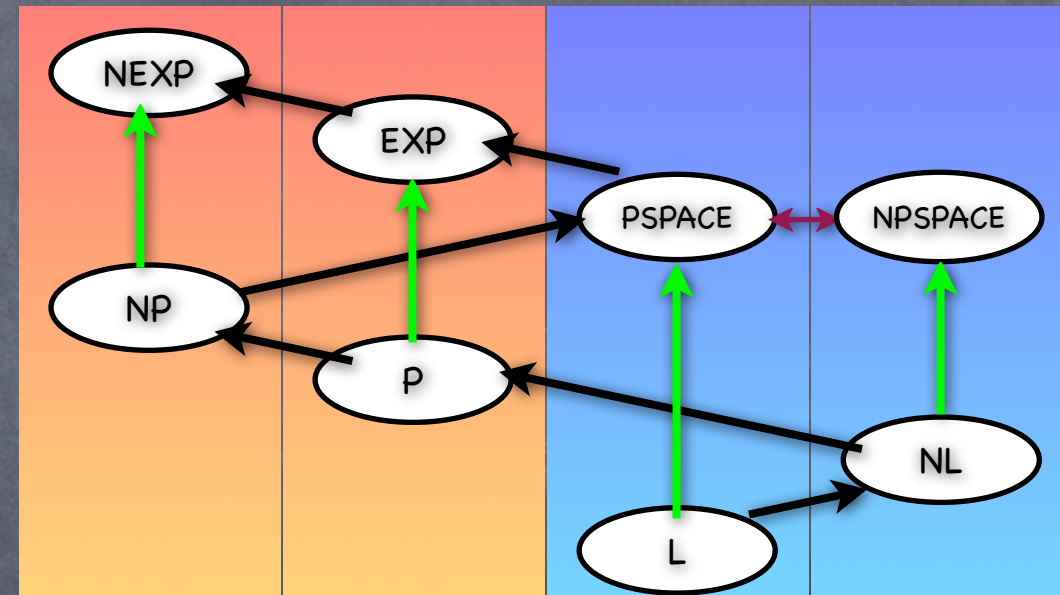
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