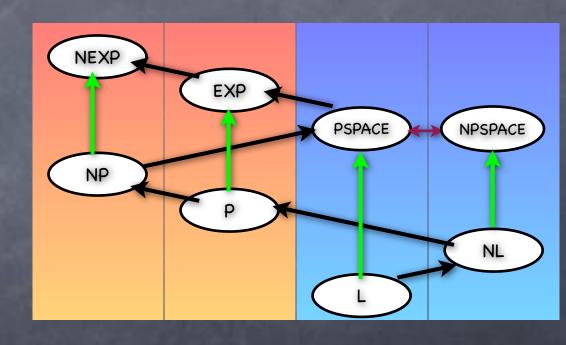
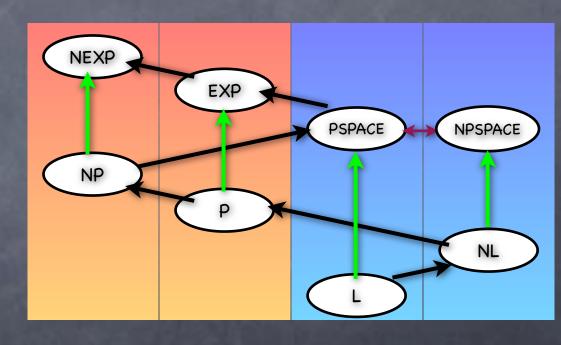
# Computational Complexity

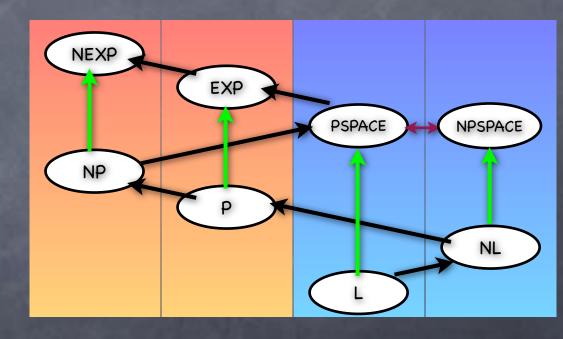
Lecture 6
NL-Completeness and NL=co-NL



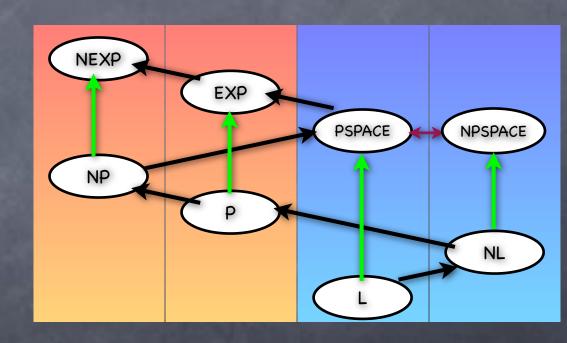
Time/Space Hierarchies



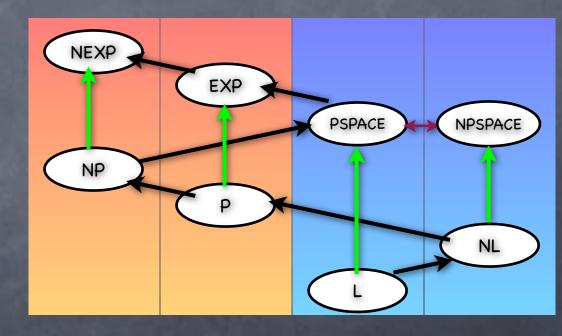
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- Relations across complexity measures



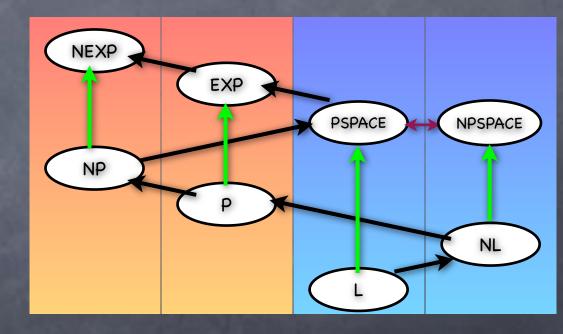
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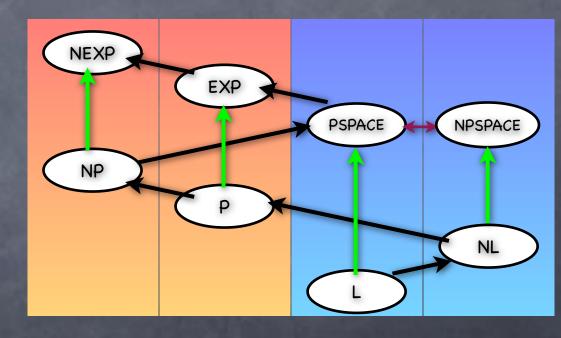
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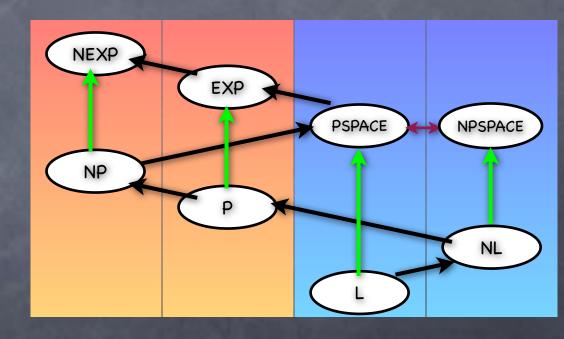
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  - An NL-complete language: PATH
  - NSPACE = co-NSPACE (one less kind to worry about!)



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- For any two (non-trivial) languages L<sub>1</sub>, L<sub>2</sub> in P, L<sub>2</sub> ≤ p L<sub>1</sub>
  - So if X ⊆ P, all languages in X are X-complete (w.r.t ≤<sub>p</sub>)
- Need a tighter notion of reduction to capture "(almost) as hard as it gets" within X

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for use as a

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- Interesting NLC language: PATH

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    - If Y ⊆ X, then co-Y ⊆ co-X. Consider X = NL, Y = co-NL.

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    - Size of the new instance is at most N = 20(|S|)
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  - Then  $L' \in co-NSPACE(S)$  is also in NSPACE(S), by composing space-bounded computations. So, co-NSPACE(S)  $\subseteq$  NSPACE(S)
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- And indeed, PATH ∈ co-NL!
  - There is a (polynomial sized) certificate that can be verified in log-space, that there is no path from s to t in a graph G



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      - $\odot$  List has |C| many  $v \in C$ , without repeating

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- Certificate that v ∉ C<sub>i</sub> given (i.e., believing) |C<sub>i-1</sub>|: list of all vertices in C<sub>i-1</sub> in order, with certificates. As before verify C<sub>i-1</sub> believing |C<sub>i-1</sub>| (scan and ensure list is correct/complete), but also check that no node in the list has v as a neighbor

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 $\mathbf{t}
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|C<sub>N</sub>|

