

COMP3630 / COMP6363

week 9: **PSPACE to (N)EXPTIME**

This Lecture Covers Chapter 11 of HMU: Additional Classes of Problems

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Content of this Chapter

- A **PSPACE**-complete problem: QBF
- **PSPACE** vs. **NPSPACE** (Savitch's Theorem)
- **PSPACE** vs. **co-PSPACE**
- **P** vs. **PSPACE** vs. **EXPTIME**
- Overview and Outlook of other classes

Additional Reading: Chapter 11 of HMU.

A **PSPACE**-complete
Problem: QBFs

Quantified Boolean Formulae (QBFs)

Definition w9.1

If V is a set of variables, then the set of quantified boolean formulae over V is given by:

- Every variable $v \in V$ is a QBF, and so are \top and \perp
- If ϕ, ψ are QBF, then so are $\phi \wedge \psi$ and $\phi \vee \psi$
- If ϕ is a QBF, then so is $\neg\phi$.
- If ϕ is a QBF and $v \in V$ is a variable, then $(\exists v)\phi$ and $(\forall v)\psi$ are QBF.

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Definition w9.2

In a QBF ϕ , a variable v is bound if it is in the scope of a quantifier $\forall v$ or $\exists v$. The variable v is free otherwise.

If $x \in \{\top, \perp\}$ is a truth value, then $\phi[x/v]$ is the result of replacing all free occurrences of v with x (think of $/$ as $=$, i.e., $x = v$).

Example

$$(\forall x) (\exists y) (((\exists x) (x \vee y)) \wedge \neg(x \wedge y))$$

- › Usually, one writes these formulae without the parentheses pairs around the quantified variables, e.g, $\forall x \phi$ instead of $(\forall x)\phi$.
- › Note how inner quantifiers have precedence over outer ones.
- › Also, this formula does not have free variables, i.e., all are bound.

The formula above has the following policy as solution:

x	y	z
\perp	\top	\top
\top	\perp	\top

$$x = \perp : (\top \vee \top) \wedge \neg(\perp \wedge \top) = \top \wedge \neg\perp = \top$$

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- › We have two lines because we need to provide an assignment for each x
- › Had we more universally quantified variables, we had more “branching”

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$$(\forall x) (\exists y) ((\exists z) (x \vee y)) \wedge \neg(x \wedge y) = (\forall x) (\exists y) ((\exists z) (z \vee y)) \wedge \neg(x \wedge y)$$

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Evaluation of QBFs

Observation.

A QBF ϕ without free variables can be evaluated to a truth value:

- $\text{evalQBF}(\forall v \phi) = \phi[\top/v] \wedge \phi[\perp/v]$
- $\text{evalQBF}(\exists v \phi) = \phi[\top/v] \vee \phi[\perp/v]$

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QBFs versus boolean formulae.

A boolean formula ϕ with variables v_1, \dots, v_n is:

- satisfiable if $\exists v_1 \exists v_2 \dots \exists v_n \phi$ evaluates to true.
- a tautology if $\forall v_1 \forall v_2 \dots \forall v_n \phi$ evaluates to true.

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Definition w9.3

The QBF problem is the problem of determining whether a given quantified boolean formula without free variables evaluates to true:

$$\text{QBF} = \{ \langle \phi \rangle \mid \phi \text{ a true QBF without free variables} \}$$

QBFs vs Boolean Formulae

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- Which runtime does this approach have? Shows **EXPTIME** membership due to doubling the formula with each substitution.

Q. Can we do better?

A. Interestingly, we don't need to reduce the runtime below **EXPTIME**, so it's fine that even a "better result" still requires **EXPTIME**! But we need to reduce the space requirements to **PSPACE** to get to a lower class. (So, note that the procedure above also incurs **EXSPACE**.)

QBF is in PSPACE

Main Idea.

- > to evaluate $\forall v \phi$, don't write out $\phi[T/v] \wedge \phi[\perp/v]$.
- > instead, evaluate $\phi[T/v]$ and $\phi[\perp/v]$ in sequence (avoids exponential space blowup).

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Analysis.

Given QBF ϕ of size n :

- › at most n recursive calls active
- › each call stores a partially evaluated QBF of size n
- › total space requirement $\mathcal{O}(n^2)$

This shows **PSPACE** membership of QBF.

QBF is **PSPACE**-hard

Proof Idea/Overview.

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- › Let L be in PSPACE.
- › Then L is accepted by a polyspace-bounded TM with (cell) bound $p(n)$.
- › If $w \in L$, then M accepts in $\leq c^{p(n)}$ moves (for some constant c). Why?

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- › Construct QBF ϕ : “there is a sequence of $c^{p(n)}$ IDs that accepts w ”.
- › Use “recursive doubling” to perform this reduction in polytime.

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- › For SAT, we used boolean formulae to represent poly many poly-bounded IDs.
- › Now, we use QBFs to represent all runs of poly-bounded IDs.

Hardness Proof, Overview

Variables.

- › We use two sets of variables, $x_{j,s}$ and $y_{j,s}$. Need $\mathcal{O}(p(n))$ variables to represent an ID:
- › variables $x_{j,s}/y_{j,s} = \top$ iff the j -th symbol of the resp. ID, $0 \leq j \leq p(n)$, is s .

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Structure of the QBF.

$$\phi = (\exists X)(\exists Y)(S \wedge N \wedge A \wedge U)$$

- › We use X as the tuple of all x -variables, and Y as the tuple of all y -variables. They will be used to encode the current and successor configuration.

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- › **S**: says that X initially represents $ID_0 = q_0 w$, just as in Cook's theorem.

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- › **U**: says that every ID has at most one symbol per position, just as in Cook's theorem.
- › **N**: transition from $X \approx ID_0$ to some $Y \approx ID_a$ in $\leq c^{p(n)}$ steps (see next slide).

Recursive Doubling

- › $N = N(ID_0, ID_a)$: have sequence of length $\leq c^{p(n)}$ from (formula satisfying) ID_0 to (formula satisfying) ID_a . (I.e., from the start ID to some accepting ID)

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 - › Could also say $(\exists K)(N_{i-1}(X, K) \wedge N_{i-1}(K, Y))$
 - › this would write out N_{i-1} twice, doubling formula size at each step
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- Let $N(X, Y) = N_k(X, Y)$ where $2^k \geq c^{p(n)}$ (note $k \in \mathcal{O}(p(n))$)
- each N_i can be written in $\mathcal{O}(p(n))$ many steps, plus the time to write N_{i-1}
- so $\mathcal{O}(p(n)^2)$ overall

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By construction, $\phi = \top$ iff M accepts w .

PSPACE vs. NPSPACE (Savitch's Theorem)

Savitch's Theorem: $\mathbf{PSPACE} = \mathbf{NPSPACE}$

Note

The following is (maybe?) remarkable because we do not know whether $\mathbf{P} = \mathbf{NP}$.

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Proof.

› Let $L \in \mathbf{NPSPACE}$ and M be non-det. TM, polyspace-bounded by $p(n)$ deciding L .

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Wait, isn't the exponential problematic? No, since we encode it logarithmically.



Savitch's Theorem: Recursive Doubling

Goal. Implement $P(I, J, m) = I \vdash^* J$ in deterministic polyspace

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P(I, J, m): for all IDs K with length <= p(n) + 1 do {
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Q. How much space does this implementation need? (Time does not matter!)

Savitch's Theorem: Recursive Doubling

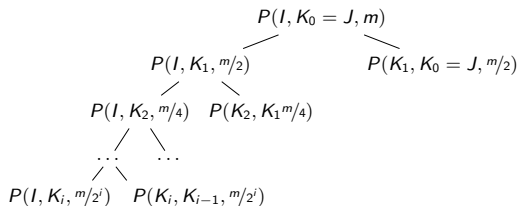
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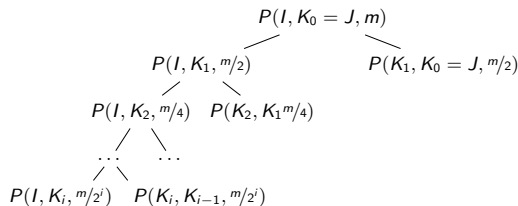
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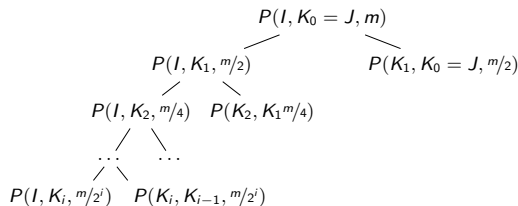
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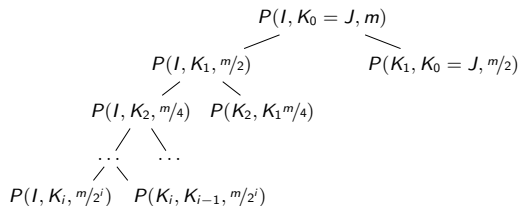
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A. No, we could have just generated all possible (accepting) IDs and try all of them!

PSPACE vs. co-PSPACE

Recap

Recall: A problem is in **co-X** if and only if its complement is in **X**.

Applied to **X = PSPACE**:

Let $\bar{L} = \Sigma^* \setminus L$

DSPACE $(t(n)) = \{L \mid \exists \text{ DTM } M \text{ with } L(M) = L \text{ that decides } L \text{ with } \mathcal{O}(t(n)) \text{ cells} \}$

co-DSPACE $(t(n)) = \{L \mid \bar{L} \in \text{DSPACE}(t(n))\}$

PSPACE $= \bigcup_{k \in \mathbb{N}} \text{DSPACE}(n^k)$

co-PSPACE $= \bigcup_{k \in \mathbb{N}} \text{co-DSPACE}(n^k)$

Also, hardness and completeness is again defined as always, also for **co-PSPACE**.

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NPSPACE Algorithm for $\text{ALL}_{\text{NFA}}^c$ – the complement, which accepts $\langle A \rangle$ if $L(A) \neq \Sigma^*$

Technically, the complement also contains all strings that are not even NFAs. But testing for this is trivial, so no need mentioning this!

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➤ Since $\mathbf{NPSPACE} = \mathbf{PSPACE}$, we also get $ALL_{NFA} \in \mathbf{co-PSPACE}$

PSPACE vs. co-PSPACE

Theorem w9.1

co-PSPACE = PSPACE (*and hence* **co-NPSPACE = NPSPACE = PSPACE**)

PSPACE vs. co-PSPACE

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First, show **co-PSPACE** \supseteq **PSPACE**, i.e., $L \in \text{PSPACE}$ implies $L \in \text{co-PSPACE}$.



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Then, show **PSPACE** \supseteq **co-PSPACE** in the analogous way. □

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A lot to unpack here ... Some essential key points to understand:

- › Why flipping the result is not allowed in **NP** / **co-NP** proofs,
- › but it is allowed in all deterministic classes.
- › Thus, **DSpace** (hence **NSpace**) and **DTIME** are closed under complementation.

On “Flipping Results”, Part 1: Why **NP/co-NP** fails.

Disclaimer:

- › The following proof is the same as before, but for **NP/co-NP**.
- › Unless $L \in \mathbf{P}$, or $\mathbf{NP} = \mathbf{co-NP}$, the following will fail!

Let $L \in \mathbf{NP}$ and you want to prove $L \in \mathbf{co-NP}$:

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 - Then, flip result for w . This decides L^c , taking poly-time.

Now, what's wrong about that proof?

On “Flipping Results”, Part 1: Why **NP/co-NP** fails.

Disclaimer:

- › The following proof is the same as before, but for **NP/co-NP**.
- › Unless $L \in \mathbf{P}$, or $\mathbf{NP} = \mathbf{co-NP}$, the following will fail!

Let $L \in \mathbf{NP}$ and you want to prove $L \in \mathbf{co-NP}$:

- › Let $L \in \mathbf{NP}$. Note that $L \in \mathbf{co-NP}$ iff $L^c \in \mathbf{NP}$.
- › Prove L^c in **NP** via:
 - First, decide $w \in L$ using **NP** (possible by assumption).
 - Then, flip result for w . This decides L^c , taking poly-time.

Now, what's wrong about that proof?

- › To show $L^c \in \mathbf{NP}$, we need to provide an NTM M with $L(M) = L^c$.
- › However, our NTM M used in the above proof has $L(M) = L$!
- › So, why was that allowed for **PSPACE**?! See next slide!

On “Flipping Results”, Part 2: Why **PSPACE**/co-**PSPACE** works.

In our proof:

- › Let $L \in \mathbf{PSPACE}$. Note that $L \in \mathbf{co-PSPACE}$ iff $L^c \in \mathbf{PSPACE}$.
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 - First, decide $w \in L$ using **PSPACE** (possible by assumption).
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Why now were we allowed to flip the result?!

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- So, this proof implicitly claims that the procedure above is such an M . Is it?

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- This requires some extra reasoning. M exists, but uses an “inner” TM M' .
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 - M simulates M' on w , which terminates (deterministically!) after poly space. M' then flips this result, so this does not change the class.
- › The exact same argument works for all deterministic time classes.

Corollaries

Corollary w9.2

- › *All space classes are closed under complementation.*
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Thus, to prove membership in space or deterministic time classes, you can choose to decide the complement of the language instead. Pick whatever is easier!

P vs. PSPACE vs. EXPTIME

PSPACE vs. EXPTIME

Theorem w9.1

PSPACE \subseteq **EXPTIME**

Proof.

> Let $L \in$ **PSPACE**. We will show that any **PSPACE** decider runs in exponential time.

PSPACE vs. EXPTIME

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Proof.

- › Let $L \in \mathbf{PSPACE}$. We will show that any **PSPACE** decider runs in exponential time.
- › Then, L is decided by some TM M with $L(M) = L$, such that for all $w \in \Sigma^*$ it decides $w \in L$ with $|w| = n$ within $\mathcal{O}(n^k)$ space for some constant k .
- › How many different TM configurations can we see before running into a loop?
(Note that we can't run into a loop! Since M is a decider.)

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 - In total we have at most $c^{p(n)} = \mathcal{O}(|Q| \cdot (n^k) \cdot |\Gamma|^{(n^k)})$ TM configurations.

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 - In total we have at most $c^{p(n)} = \mathcal{O}(|Q| \cdot (n^k) \cdot |\Gamma|^{(n^k)})$ TM configurations.
- So, we can just run M and know that it will not run longer than $c^{p(n)}$, hence in **EXPTIME**



P vs. EXPTIME

Intuitively, $\mathbf{P} \subsetneq \mathbf{EXPTIME}$ should hold, since under poly-transformations, we stay within the respective class, and so have strictly more time available in **EXPTIME**. But, are there really problems that need **EXPTIME**?

To answer this, we require the definition of “small-o” (o), in analogy to “big-O” (\mathcal{O}).

Intuitively:

- › $f(n) \in \mathcal{O}(g(n))$: f grows at most as fast as g .
- › $f(n) \in o(g(n))$: f grows strictly less than g .

Small-o Notation

Definition w9.2

Let $f, g : \mathbb{N} \longrightarrow \mathbb{R}_{\geq 0}$. We say that $f(n) = o(g(n))$ (or $f(n) \in o(g(n))$) if

$$\lim_{n \rightarrow \infty} \frac{f(n)}{g(n)} = 0 .$$

that is, for any $c > 0$ there exist $n_0 > 0$ such that $f(n) < c \cdot g(n)$, for all $n \geq n_0$.

In comparison:

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Observe that

- ① $f = \mathcal{O}(f)$ but $f \neq o(f)$.
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Examples:

- > $n \neq o(2n)$ (although $2n$ grows faster than n , but only a constant factor)
- > $n = o(\frac{1}{2}n \log n)$ and $n \log n = o(n^2)$

The Time Hierarchy Theorem

Theorem w9.3

If $f : \mathbb{N} \rightarrow \mathbb{R}_{\geq 0}$, then there exists a decision problem which cannot be solved in worst-case deterministic time $o(f(n))$ but can be solved in worst-case deterministic time $\mathcal{O}(f(n)\log(f(n)))$. Thus,

$$\mathbf{DTIME}(o(f(n))) \subsetneq \mathbf{DTIME}(f(n)\log(f(n))).$$

Proof skipped (we only show this for the sake of completeness).

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- Let $f(n) = n$. Then, $\exists L \in \mathbf{DTIME}(n \log n)$, but $L \notin \mathbf{DTIME}(o(n))$.

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Let $f(n) = n^k$. Then,

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- $L_k \notin \mathbf{DTIME}(o(f(n))) = \mathbf{DTIME}(o(n^k))$.

Back to P vs. EXPTIME

Corollary w9.4

$P \subsetneq EXPTIME$

Proof.

Let $f(n) = 2^n$. By the Time Hierarchy Theorem there is a language L such that

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Since every polynomial n^k satisfies $n^k = o(2^n)$, no poly-time TM decides L . Thus, $L \notin P$. Also, $n 2^n = \mathcal{O}(2^{cn})$ for some constant $c > 1$, so $L \in DTIME(2^{cn}) \subseteq EXPTIME$.

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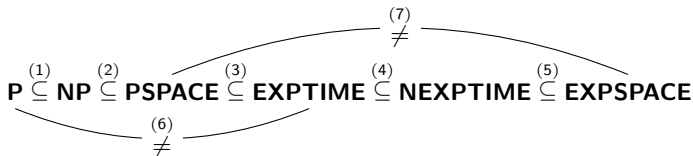
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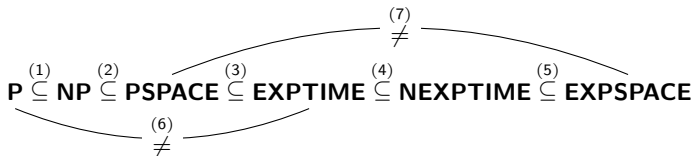
Therefore, **$P \subsetneq EXPTIME$** . □

Relationship Among Complexity Classes: Recap/Summary (Part 1)



Where/how proven?

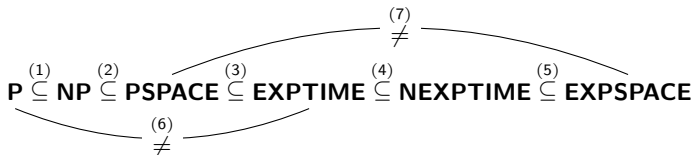
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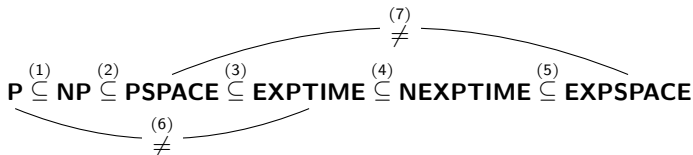
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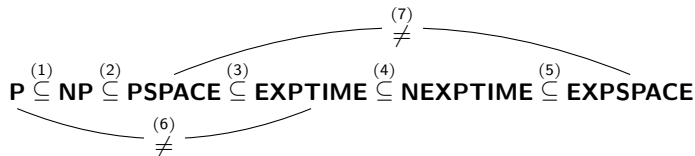
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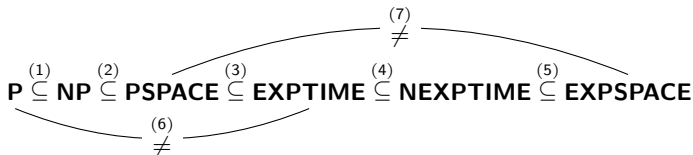
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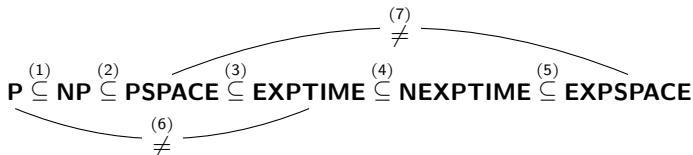
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- > (6): Follows from the time hierarchy theorem.
- > (7): Follows from the space hierarchy theorem (not covered).

Relationship Among Complexity Classes: Recap/Summary (Part 2)

Relationships to N- and co-classes:

$$\begin{array}{ccccccccccc}
 \text{co-P} & \subseteq & \text{co-NP} & \subseteq & \text{co-PSPACE} & \subseteq & \text{co-EXPTIME} & \subseteq & \text{co-NEXPTIME} & \subseteq & \text{co-EXPSPACE} \\
 = & & ? & & = & & = & & ? & & = \\
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 & & & & = & & & & = & & \\
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 \end{array}$$

Voluntary homework:

Check all additional subset relations for their origin. (I.e., why they hold.)

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What we did not cover; some highlights:

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- Beyond that are even others, such as the **Ackermann** class, sitting above all $k\text{-}\mathbf{EXPTIME}$ and $k\text{-}\mathbf{EXPSPACE}$ classes.
- There are TM models with different kinds of states (existential and universal), which are convenient for some proofs/problems. They are covered in week 10!
- **And certainly many more ...** Check out complexityzoo.net – 550 classes so far!