

# Outline

- 1 Some Hard Problems
- 2 P, NP and Co-NP
- 3 Polynomial Time Reductions and NP-Completeness
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- 5 Dealing with NP-Hard Problems
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# Important notations/algorithms

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- Quiz 6: Job scheduling with deadline, clustering problem, Weighted scheduling problem

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- Quiz 8: Modular Exponentiation Problem, Matrix Multiplication, Closest Pair, Convex Hull

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- Quiz 10: Longest Increasing Subsequence, Maximum Total Weight Independent Set, Shortest Path With Even Number of Vertices, Counting number of inverted 5-tuples

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- HW 4, Quiz 11, P2

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- HW 4, Quiz 12-13