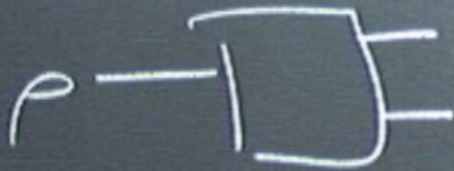


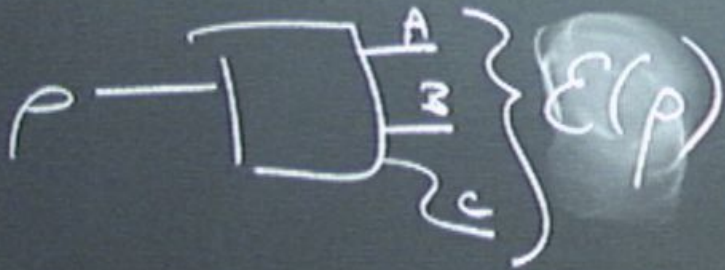
Title: Quantum Information - Review (PHYS 635) - Lecture 6

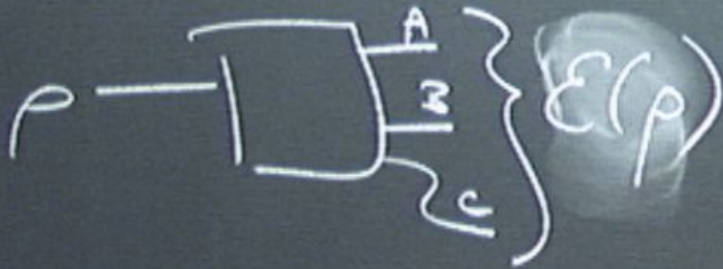
Date: Feb 01, 2010 09:00 AM

URL: <http://pirsa.org/10020038>

Abstract: <div id="Cleaner">Week 1: Basic topics (Qubits, quantum gates, quantum circuits, density matrices, quantum operations, entropy, entanglement)</div id="Cleaner"><div id="Cleaner">Week 2: Algorithms and complexity (Languages, complexity classes, oracles, RSA, Deutsch-Jozsa algorithm, Shor's algorithm, Grover's algorithm)</div id="Cleaner"><div id="Cleaner">Week 3: Information theory and implementations (Overview of implementations, quantum error correction, quantum cryptography, quantum information theory)</div id="Cleaner">





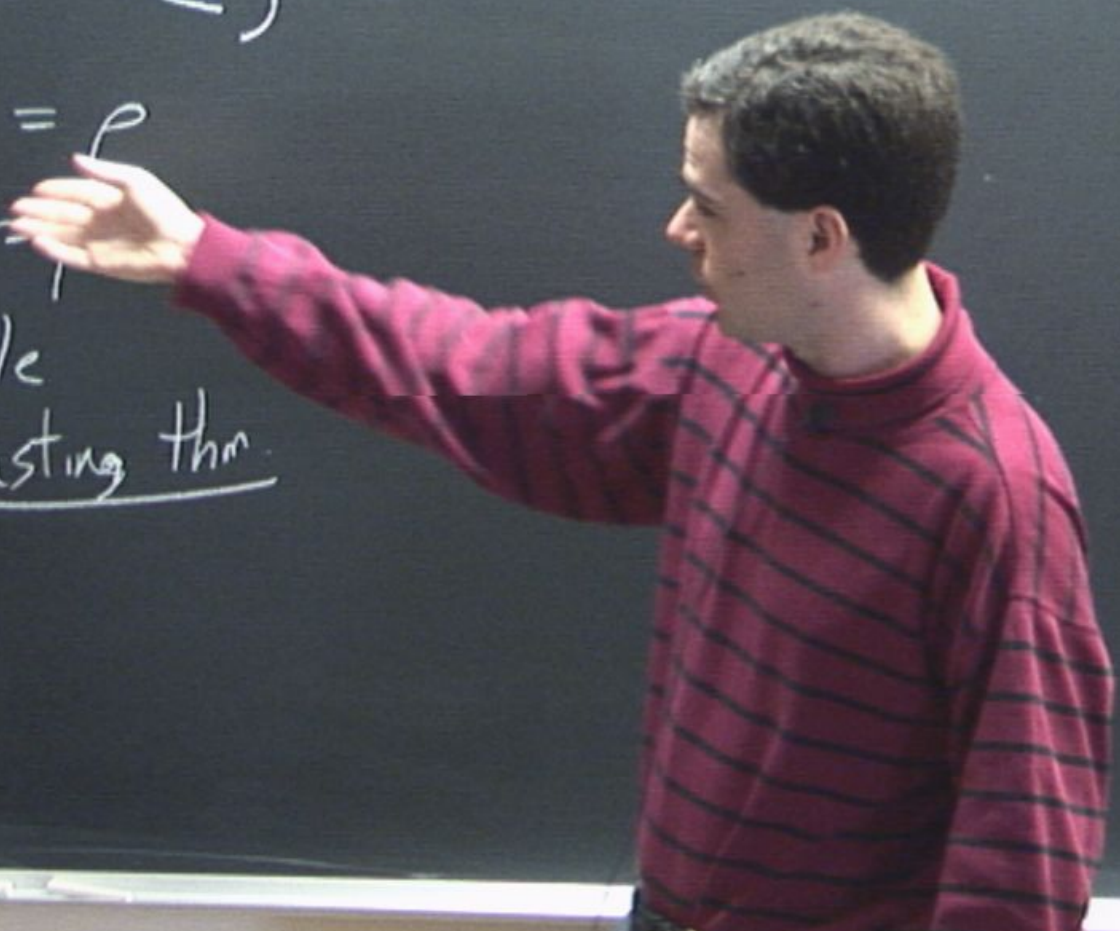


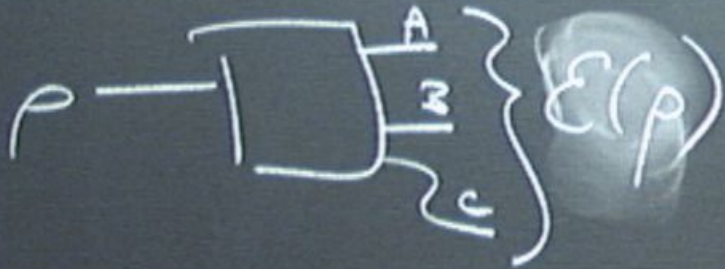
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Not possible

No broadcasting thm.



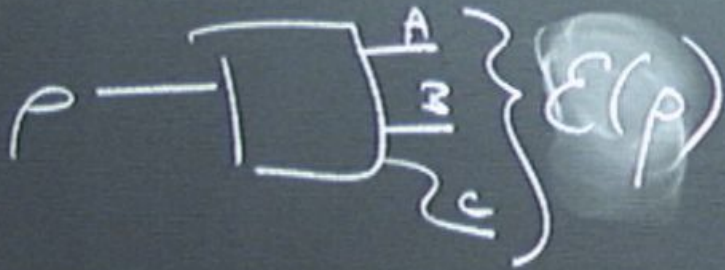


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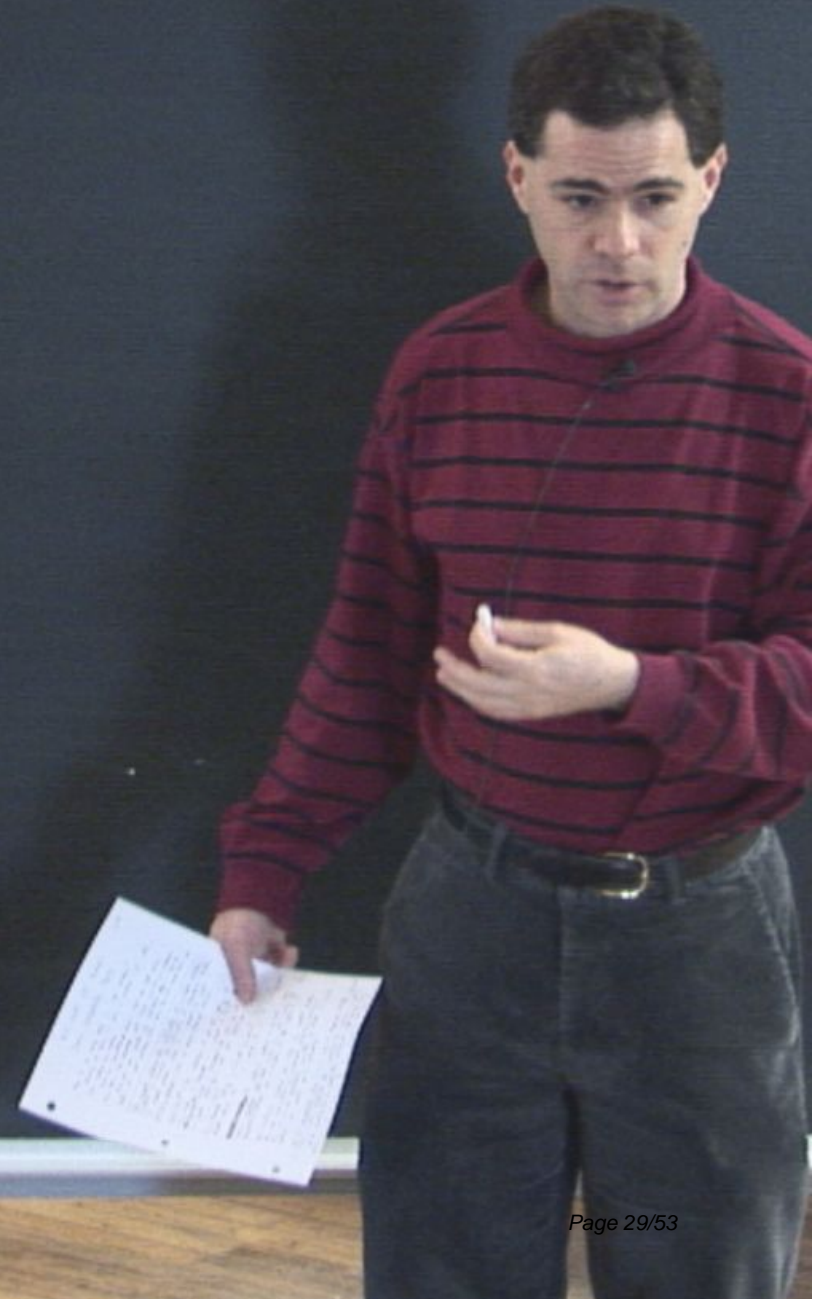
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classify

hard

easy

how much time does it

take to solve it?

solvable?

NP-complete

NP-hard

co-NP

polynomial

time

classes & problems

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