# Foundations of Computing Lecture 25

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#### Outline

- 1 Lecture 24 Review
- 2 A New Goal for Proofs
- Opening Knowledge
  3
- 4 Examples of Zero-Knowledge Proofs

#### Lecture 24 Review

- $\bullet$  Proof that co- $\mathcal{NP}\subseteq\mathcal{IP}$
- Arithmetization of Boolean Formulas

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### Reviewing the Definition of $\mathcal{IP}$

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#### A New Property

We say that a proof is *zero-knowledge* if the verifier learns nothing (other than the truth of the statement) from seeing the proof.

# An Example – Where's Waldo



### An Example



# A Second Example - Puppy and Panda









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What does it mean for a machine to learn nothing from a proof?

Answer: Whatever it can (efficiently) compute after seeing the proof, it could have efficiently computed before seeing the proof.

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- IMPORTANT:  $VIEW_V^*$  and S(x) are both distributions, not values. So, equality is of distributions

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- **①** Completeness: If  $\pi(G_0) = G_1$ , then  $\pi'$  correctly maps  $G_{b'}$  to H
- ② Soundness: Suppose  $G_0$  is not isomorphic to  $G_1$ , so there is no such  $\pi$ . Then, if  $b \neq b'$ , there is no permutation that P can give that V will accept

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#### Observations:

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- When S stops, he produces a perfect simulation



# Graph 3-Coloring

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ZK Proofs enable privacy-preserving transactions on a public Blockchain!