

# Dual Problems in Property Testing

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# Property Testing

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Distinguish between objects that:

- › **Have the property**
- › **Far from having the property**

# A Broad Question

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**What happens when the property that we want to test is “being far from a set”?**

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Example:

- Test the property of graphs that are far from being connected

# A Broad Question

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Distinguish between objects that are:

- › **Far from the set**
- › **Far from any object that is far from the set**

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Distinguish between:

- Graph is far from connected
- Graph is far from any graph that is far from connected

# Dual Problems

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**Standard Problem:**  $x \in \Pi$  vs  $x \in F_{\varepsilon}(\Pi)$

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**Dual Problem:**  $x \in F_{\varepsilon}(\Pi)$  vs  $x \in F_{\varepsilon}(F_{\varepsilon}(\Pi))$

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›  $F_{\varepsilon}(\Pi) = \{ \text{objects that are } \varepsilon\text{-far from } \Pi \}$

# Dual Problems

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**Standard Problem:**

$$x \in \Pi$$

vs

$$x \in F_{\varepsilon}(\Pi)$$

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**Dual Problem:**

$$x \in F_{\varepsilon}(\Pi)$$

vs

$$x \in F_{\varepsilon}(F_{\varepsilon}(\Pi))$$

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›  $F_{\varepsilon}(\Pi) = \{ \text{objects that are } \varepsilon\text{-far from } \Pi \}$

# Dual Problems: Overview

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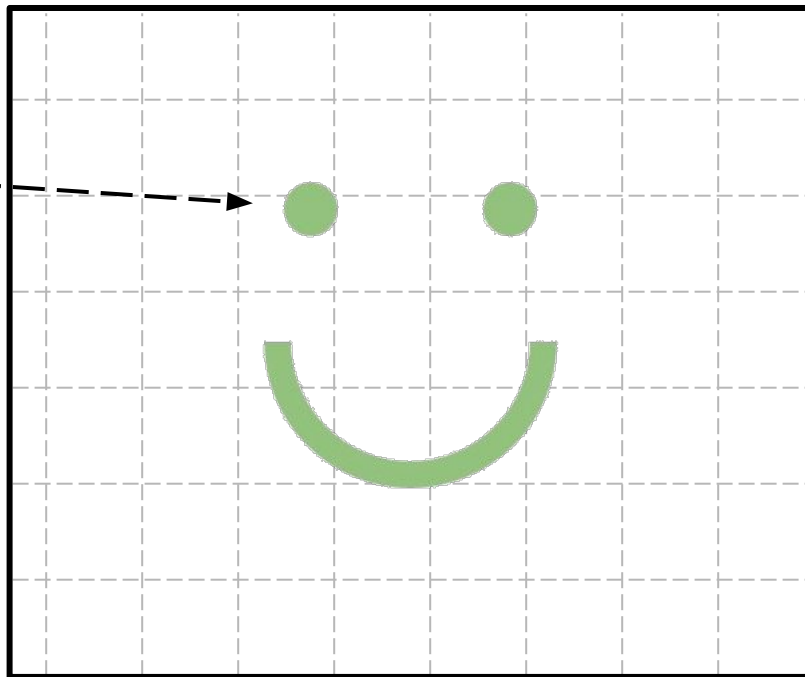
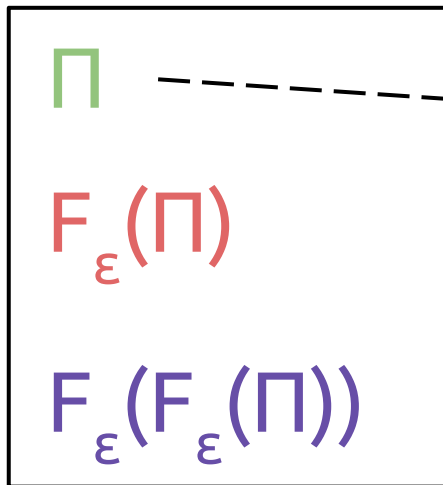
- › **Question has not been asked so far**
- › **Current work - first exploration:**
  - **Non-triviality**, different from original problems
  - Testers for several **prominent dual problems**
  - Identify specific setting of interest - **graphs**

# Non-Triviality of Dual Problems



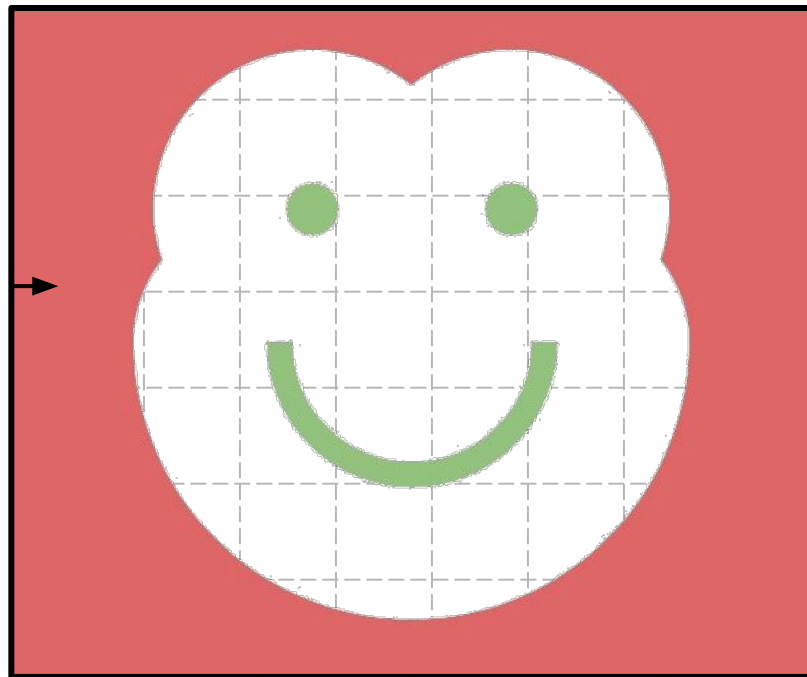
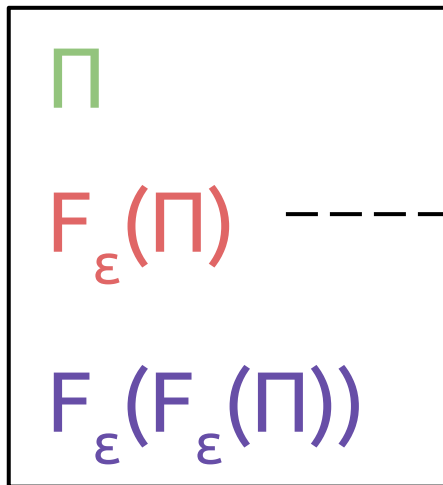
# Non-Triviality: Example

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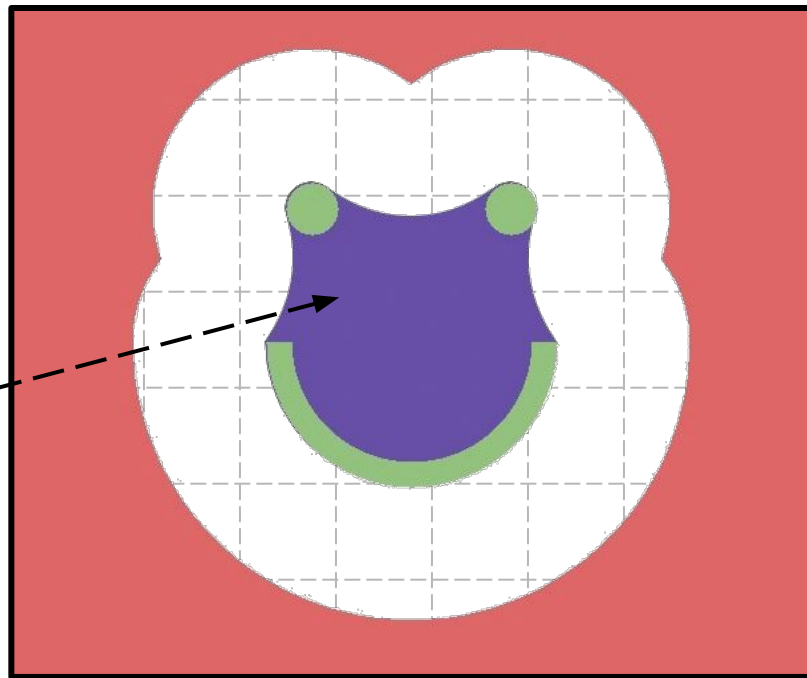
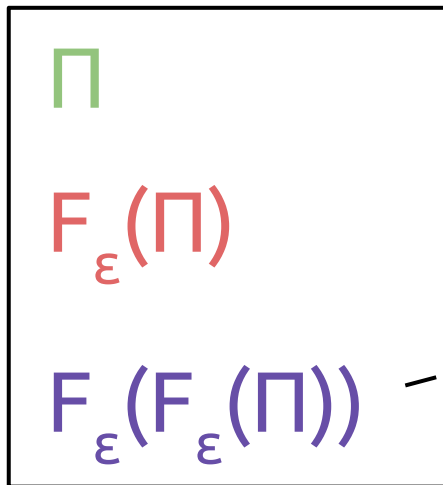
# Non-Triviality: Example

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# Non-Triviality: Example

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# Non-Triviality: Basic Facts

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1. A random<sup>\*</sup> property  $\Pi$  satisfies  $F_\varepsilon(F_\varepsilon(\Pi)) \neq \Pi$ .
2.  $\Pi \subseteq F_\varepsilon(F_\varepsilon(\Pi))$ , but  $F_\varepsilon(F_\varepsilon(\Pi))$  can be **much larger** than  $\Pi$ .<sup>\*\*</sup>
3.  $F_\varepsilon(F_\varepsilon(\Pi))$  can contain points that are **almost  $\varepsilon$ -far** from  $\Pi$ .

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\* In  $\{0,1\}^n$  and in other classes of metric spaces.

\*\* In  $\{0,1\}^n$  the set  $F_\varepsilon(F_\varepsilon(\Pi))$  can be  $\exp(n)$  larger, even for a small  $\varepsilon$ .

# Non-Triviality: More Examples

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## $\Pi \neq F_\varepsilon(F_\varepsilon(\Pi))$ › graph properties

- ›  $k$ -colorable
- › graphs with large clique
- › graphs isomorphic to a given graph
- › connected
- › cycle-free
- › bipartite
- › ...

} dense graphs model

} bounded-degree  
graphs model

# Dual Problems: What we Know

# Our Main Results

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- › **The query complexity of dual testing problems**
  - General lower bounds
  - Testers for specific problems
  
- › **The behavior of “far-from-far” sets**
  - “Far-from-far” closure operator
  - Not presented in this talk

# Our Main Results: General Lower Bounds

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**Thm 1:** The query complexity of any dual problem is lower bounded by that of the original problem.

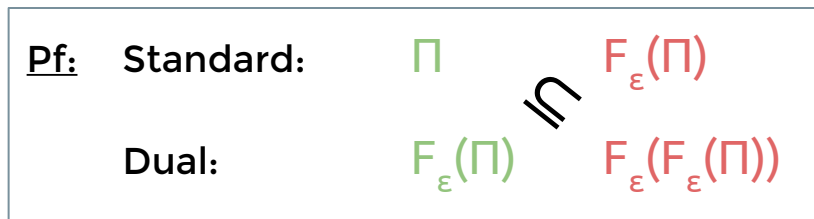
**Thm 2:** Testing any dual problem with one-sided error requires a **linear number of queries** (unless  $F_\epsilon(\Pi) = \emptyset$ ).



# Our Main Results: General Lower Bounds

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**Thm 1:** The query complexity of any dual problem is lower bounded by that of the original problem.



**Thm 2:** Testing any dual problem with one-sided error requires a **linear number of queries** (unless  $F_\epsilon(\Pi)=\emptyset$ ).

# Our Main Results: Specific Upper Bounds

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› Testers via equivalence to the original problem (  $\Pi = F_\epsilon(F_\epsilon(\Pi))$  )

**Thm 3:** The following dual problems are equivalent to the original problems:

1. Testing whether a string is **far from a code**. \*
2. Testing whether a function is **far from monotone**. \*\*
3. Testing whether a distribution is **far from uniform**. \*\*\*

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\* A code with constant relative distance.

\*\* Functions  $D \rightarrow \mathbb{R}$  such that the width of  $D$  is bounded (includes functions  $\{0,1\}^n \rightarrow \{0,1\}$ ).

\*\*\* Generalizes to testing whether a distribution is far from  $D$ , if  $D$  is from a large class.

# Our Main Results: Specific Upper Bounds

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› Testers via reductions to tolerant testing

**Thm 4:** For every  $\varepsilon$ , it is possible to test whether a graph is:

1. Far from **k-colorable**, with  $\text{Tower}(1/\varepsilon)$  queries. \*
2. Far from being **connected**, with  $\text{poly}(1/\varepsilon)$  queries. \*\*
3. Far from being **cycle-free**, with  $\text{poly}(1/\varepsilon)$  queries. \*\*

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\* Dense graphs model.

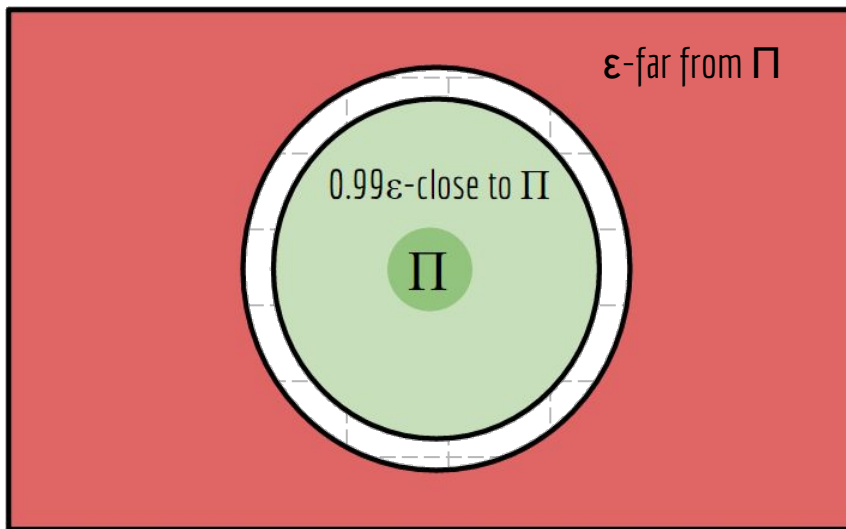
\*\* Bounded-degree graphs model.

# Reductions to Tolerant Testing

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› Tolerant testing [PRR]: Distinguish between objects that are

- **$0.99\varepsilon$ -close to  $\Pi$**
- **$\varepsilon$ -far from  $\Pi$**

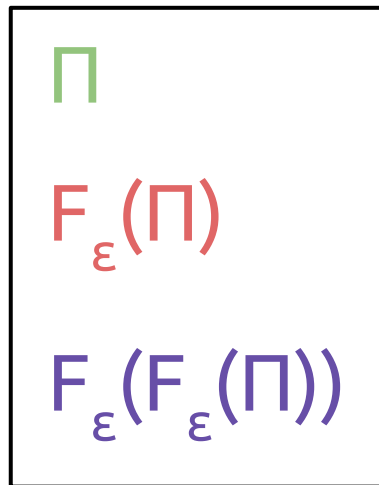


# Reductions to Tolerant Testing

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- › Tolerant testing [PRR]: Distinguish between objects that are
  - $0.99\varepsilon$ -close to  $\Pi$
  - $\varepsilon$ -far from  $\Pi$
- › Dual reduces to tolerant testing if all points in  $F_\varepsilon(F_\varepsilon(\Pi))$  are  $0.99\varepsilon$ -close to  $\Pi$

Sometimes  $F_\varepsilon(F_\varepsilon(\Pi))$  is  $0.99\varepsilon$ -close to  $\Pi$  ...



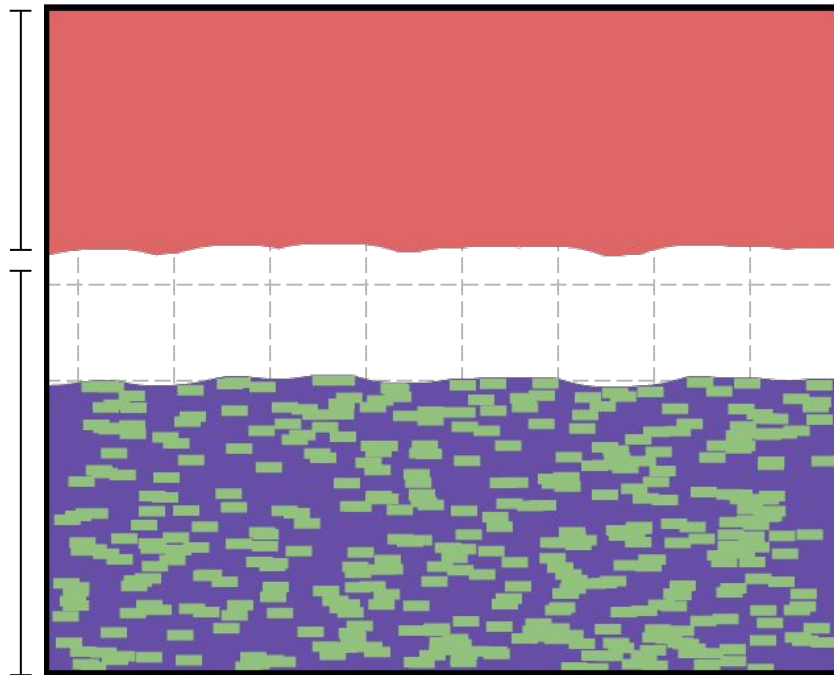
$\varepsilon$ -far from  $\Pi$

↑

Distinguish

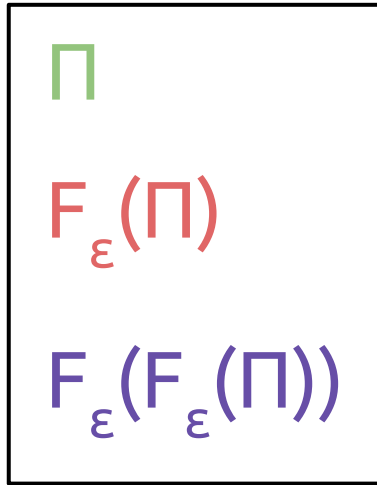
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$0.99\varepsilon$ -close to  $\Pi$

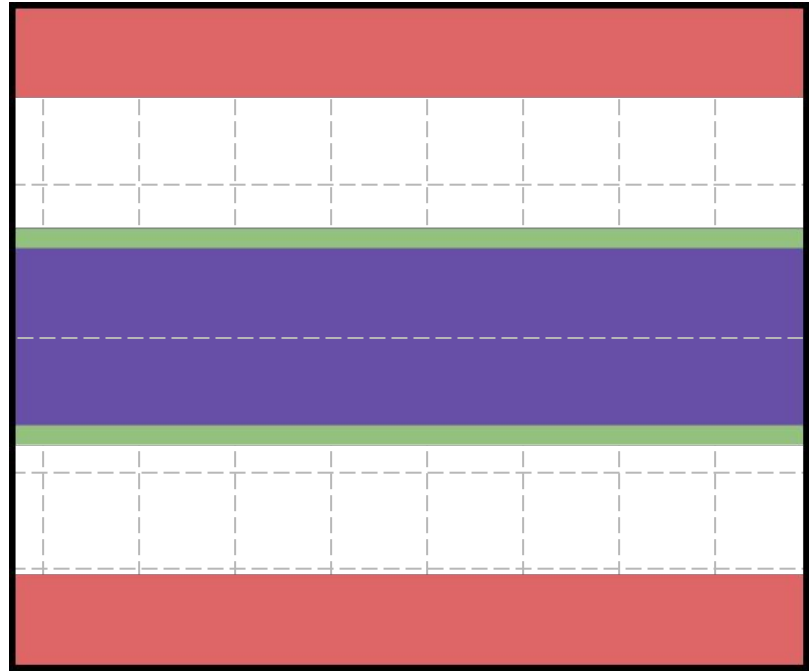


... but  $F_\varepsilon(F_\varepsilon(\Pi))$  not always  $0.99\varepsilon$ -close to  $\Pi$

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Almost  $2\varepsilon$ ...




# Generalized Version: $\varepsilon'$ -far from $\varepsilon$ -far

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**Standard Problem:**  $x \in \Pi$  vs  $x \in F_{\varepsilon}(\Pi)$

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**Generalized Dual Problem:**  $x \in F_{\varepsilon}(\Pi)$  vs  $x \in F_{\varepsilon'}(F_{\varepsilon}(\Pi)) \forall \varepsilon'$



**Generalization**

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›  $F_{\varepsilon}(\Pi) = \{ \text{objects that are } \varepsilon\text{-far from } \Pi \}$



# Dual Problems: Digest and Current Frontiers

# Dual Problems: Key Takeaways

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- › **Class of natural and unexplored problems**
  - Current work: General lower bounds, six specific testers
- › **Different from original problems**
  - And don't reduce (in general) to tolerant testing
- › **Not expecting one global answer**
  - Different settings, different behaviors (graphs vs codes)

# Dual Problems: Two Frontiers

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## 1. Can a dual problem be **more difficult to test than the original problem?**

- Current work: Gap in upper bounds, but no separation

## 2. Dual problems of **graph partition problems**

- Does testing whether a graph is far from having a large clique\* reduce to tolerant testing?

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\* Where “large clique” means clique of density  $\rho|V|$ , for a constant predetermined  $\rho > 0$ .

# Thank you!

A far-from-far visual game is available at  
<http://sites.google.com/site/roeitell>