

Problems with Multiple Oracles

Shelby Kimmel

Edward Farhi

Center for Theoretical Physics, MIT

What t

TIME

IT PROMISES TO SOLVE SOME OF HUMANITY'S
MOST COMPLEX PROBLEMS. IT'S BACKED
BY JEFF BEZOS, NASA AND THE CIA.
EACH ONE COSTS \$10,000,000 AND OPERATES
AT 459° BELOW ZERO. AND NOBODY KNOWS
HOW IT ACTUALLY WORKS

THE INFINITY MACHINE

BY LEV GROSSMAN



?

Time magazine
Feb 17, 2014

What to do with a Quantum Computer?

- Let's try to solve something hard: 3-SAT

Traveling Salesman
Problem
[Karp '72]

Graph Coloring
[Karp '72]

Tetris
[Demaine et al '03]

Is a graph planar?
[Grigoriev et al '07]

Scheduling
jobs
[Ullman '75]

Sudoku
[Yato et al]

3-SAT

- Goal: Want to satisfy a set of Boolean clauses, each with 3 variables.

$$(x_1 \vee \neg x_2 \vee x_3) \wedge (x_2 \vee x_3 \vee \neg x_4)$$

Each variable x_i can take value 0 or 1

\vee is logical OR:

$$0 \wedge 0 = 0$$

$$0 \wedge 1 = 1$$

$$1 \wedge 0 = 1$$

$$1 \wedge 1 = 1$$

\wedge is logical AND:

$$0 \wedge 0 = 0$$

$$0 \wedge 1 = 0$$

$$1 \wedge 0 = 0$$

$$1 \wedge 1 = 1$$

\neg is logical NOT:

$$\neg 0 = 1$$

$$\neg 1 = 0$$

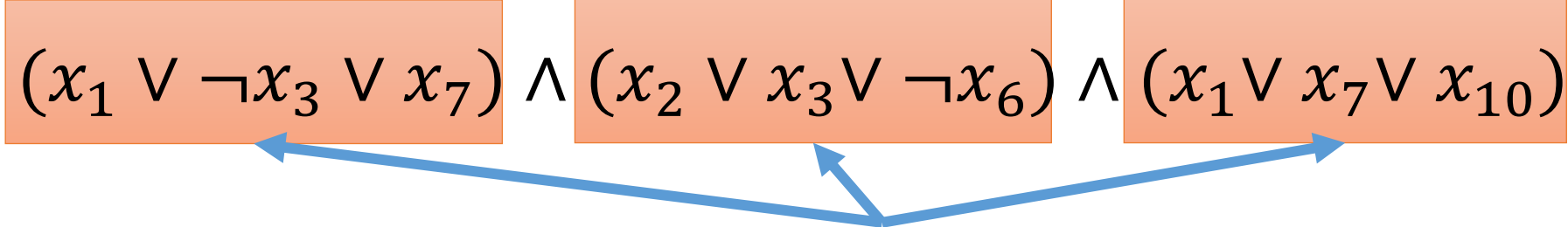
3-SAT

Is there an assignment of the n variables $\{x_1, x_2, \dots, x_n\}$ such that $F(x_1, x_2, \dots, x_n) = 1$, where

$$F(x_1, x_2, \dots, x_n) = (x_1 \vee \neg x_3 \vee x_7) \wedge (x_2 \vee x_3 \vee \neg x_6) \wedge (x_1 \vee x_7 \vee x_{10}) \dots$$


~poly(n) clauses (e.g. Cn^2)

Algorithm for 3-SAT

$$F(x_1, x_2, \dots, x_n) = (x_1 \vee \neg x_3 \vee x_7) \wedge (x_2 \vee x_3 \vee \neg x_6) \wedge (x_1 \vee x_7 \vee x_{10}) \dots$$


$\sim \text{poly}(n)$ clauses (e.g. Cn^2)

- Guess a satisfying assignment. Test if all clauses are satisfied
 - Need to test $\sim 2^n$ possible inputs. With quantum computer can do in $\sqrt{2^n}$ steps

Outline

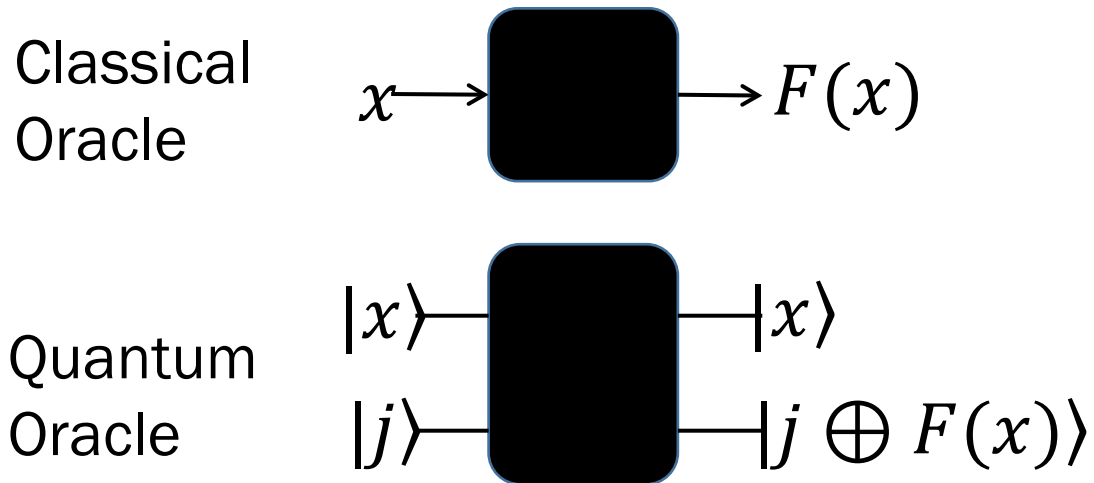
- Oracles and Oracle Models
- Related work
- Simple Example: Search with Multiple Oracles
- Open Problems and Directions for Future Work

Standard Oracle Model vs 3-SAT

3-SAT	Oracle Model
Given a function $F(x_1, x_2, \dots, x_n) = (x_1 \vee \neg x_3 \vee x_7)$	Initially function F is unknown
Determine if input x exists such that $F(x) = 1$	Determine some property of F <ul style="list-style-type: none">• Does x exists such that $F(x) = 1$?• Is F one-to-one?

Standard Oracle Model

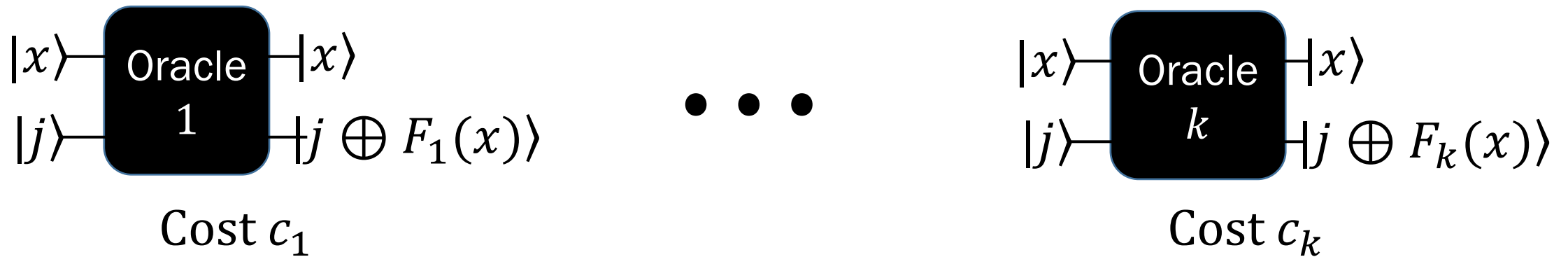
Goal: Determine a property of a function $F(x)$ for Boolean input $x = \{x_1, x_2, \dots, x_n\}$, given an oracle for F .



Only care about # of oracle calls (queries)

Multiple Oracles with Costs Model

Goal: Determine a property of a function $F(x)$ for Boolean input $x = \{x_1, x_2, \dots, x_n\}$, given a set of oracles associated with functions $\{F_1, \dots, F_k\}$ which each have some information related to F



Care about total cost = $\sum_{i=1}^k q_i c_i$ where q_i is the # of times Oracle i is used

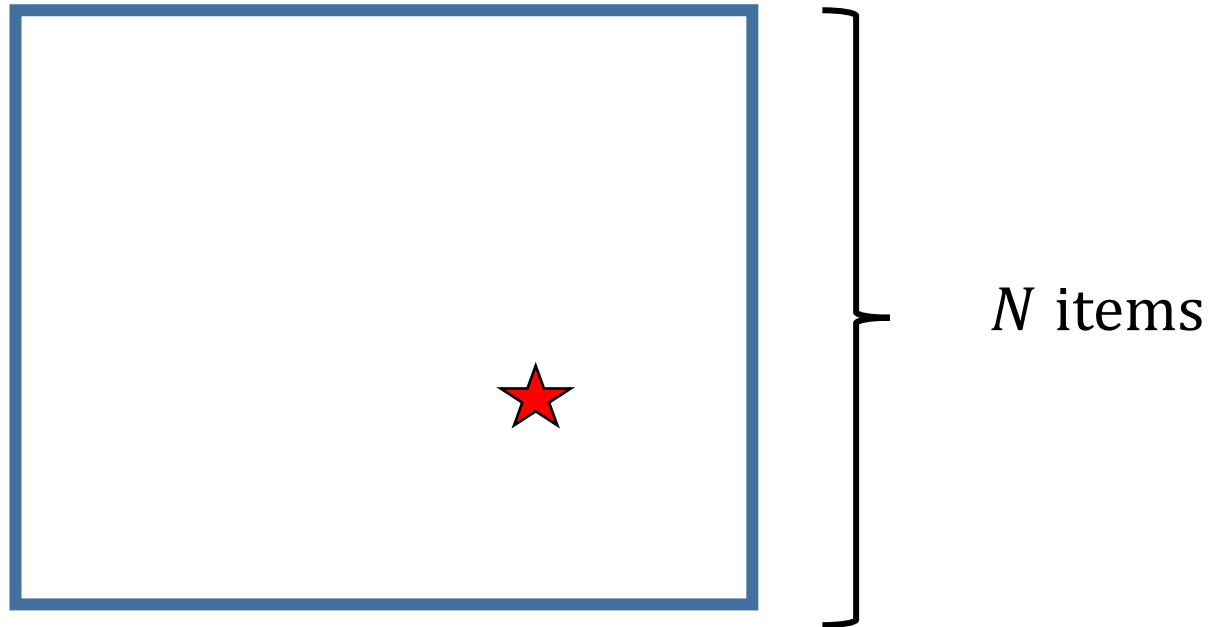
Related Work

- Ambainis '10: One oracle, but querying different x requires different amounts of time
 - E.g. To learn $f(00 \cdots 00)$ takes time 1, but to learn $f(11 \cdots 11)$ takes time 2
- Montanaro '09: Searching when given some additional information as to the location of the marked item.
 - E.g. Told that $f(00 \cdots 00)=1$ is more likely than $f(11 \cdots 11)$
- Cerf et al. '00: Use multiple oracles to speed up evaluation of satisfiability problems.
 - No cost, No lower bounds, Need certain structure.

Searching with an Oracle

Goal: Determine x such that $F(x) = 1$. Can ask oracle, “Is the i^{th} item the starred item?”

- Classically: $\sim N$ queries to oracle
- Quantumly: $\sim \sqrt{N}$ queries to oracle [Grover '97, Bennett et al. '97, Zalka '99]



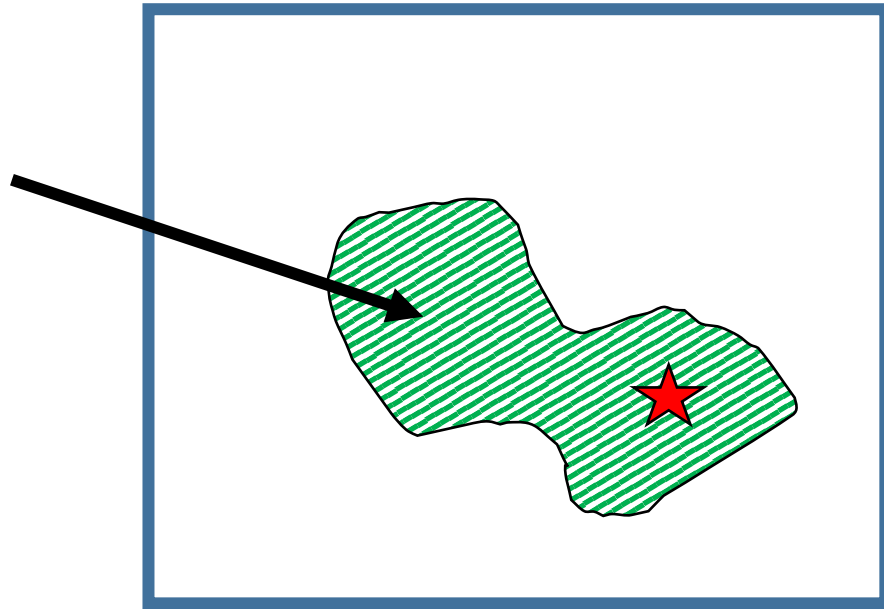
Searching with Multiple Oracles

Can ask ★ **Oracle**, “Is the i^{th} item starred?”

Can ask 🟢 **Oracle**, “Is the i^{th} item striped?”

Promised: The starred item is also striped

M
items



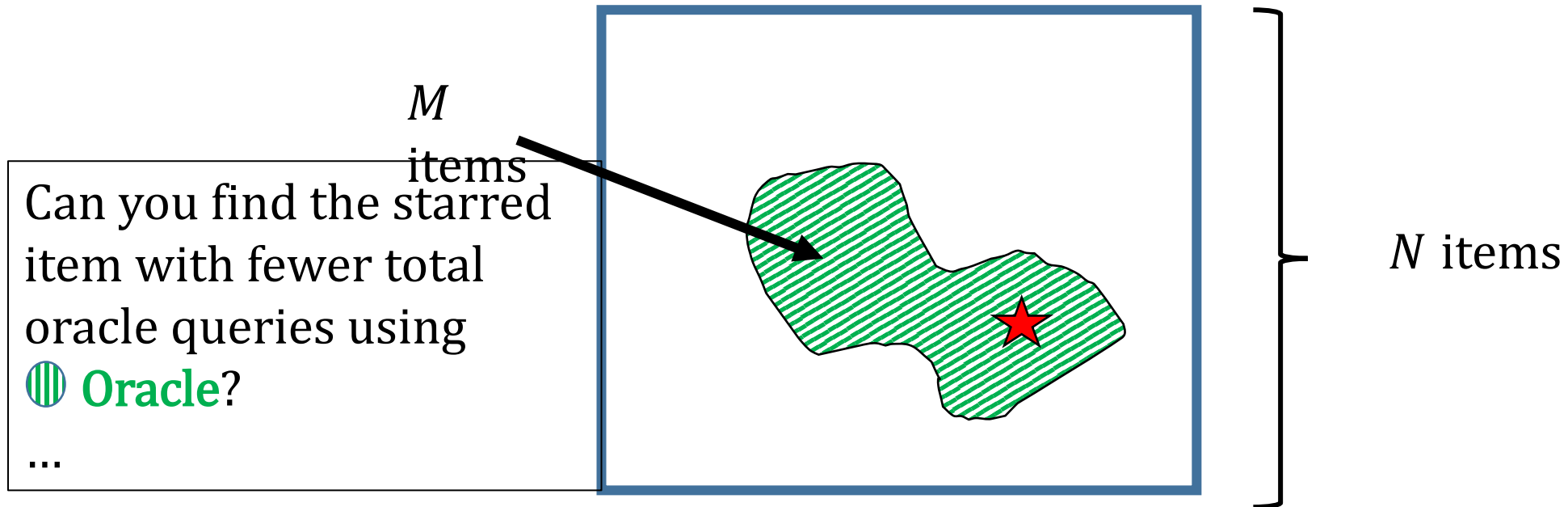
N items

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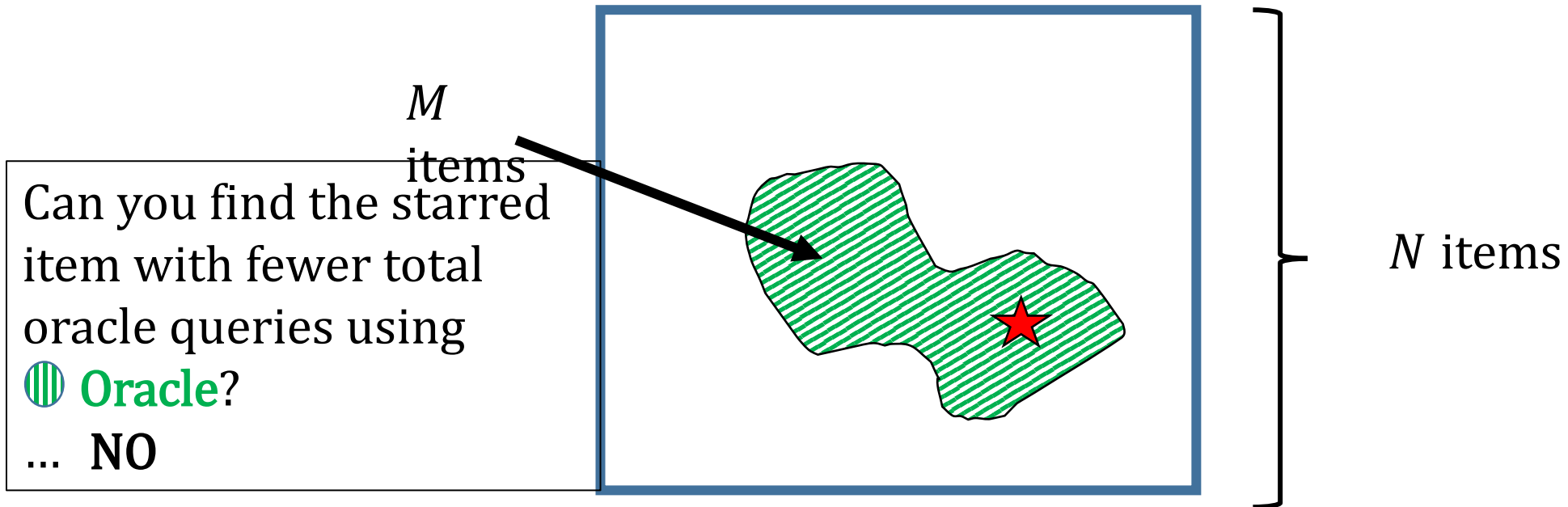


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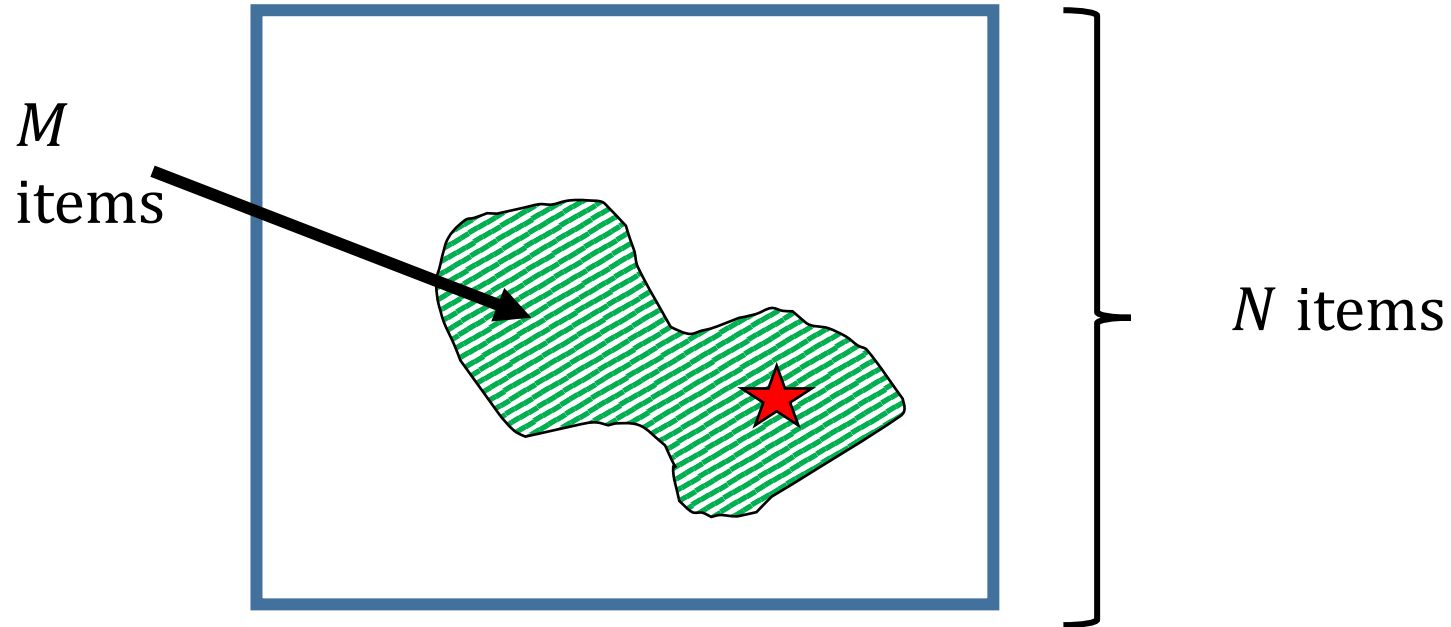
Searching with Multiple Oracles

Can ask ★ Oracle, “Is the i^{th} item starred?” with cost c_{\star}

Can ask ▨ Oracle, “Is the i^{th} item striped?” with cost c_{\parallel}

$$c_{\star} > c_{\parallel}$$

Promised: The starred item is also striped



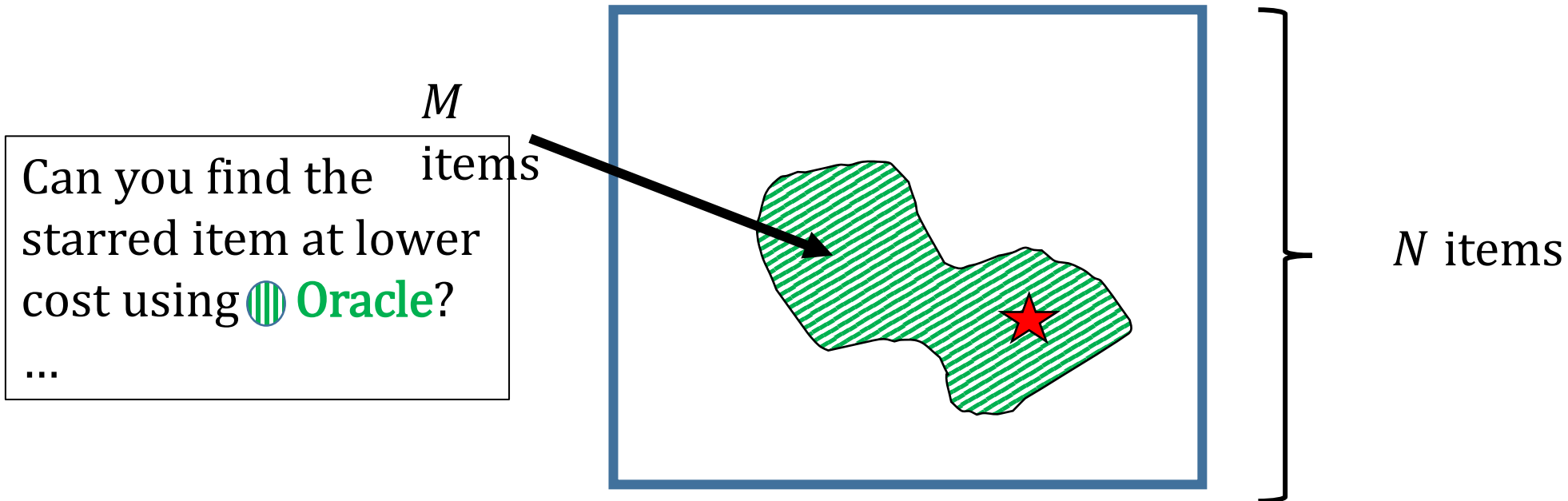
Searching with Multiple Oracles

Can ask ★ **Oracle**, “Is the i^{th} item starred?” with cost c_*

Can ask 🟢 **Oracle**, “Is the i^{th} item striped?” with cost $c_{||}$

$$c_* > c_{||}$$

Promised: The starred item is also striped



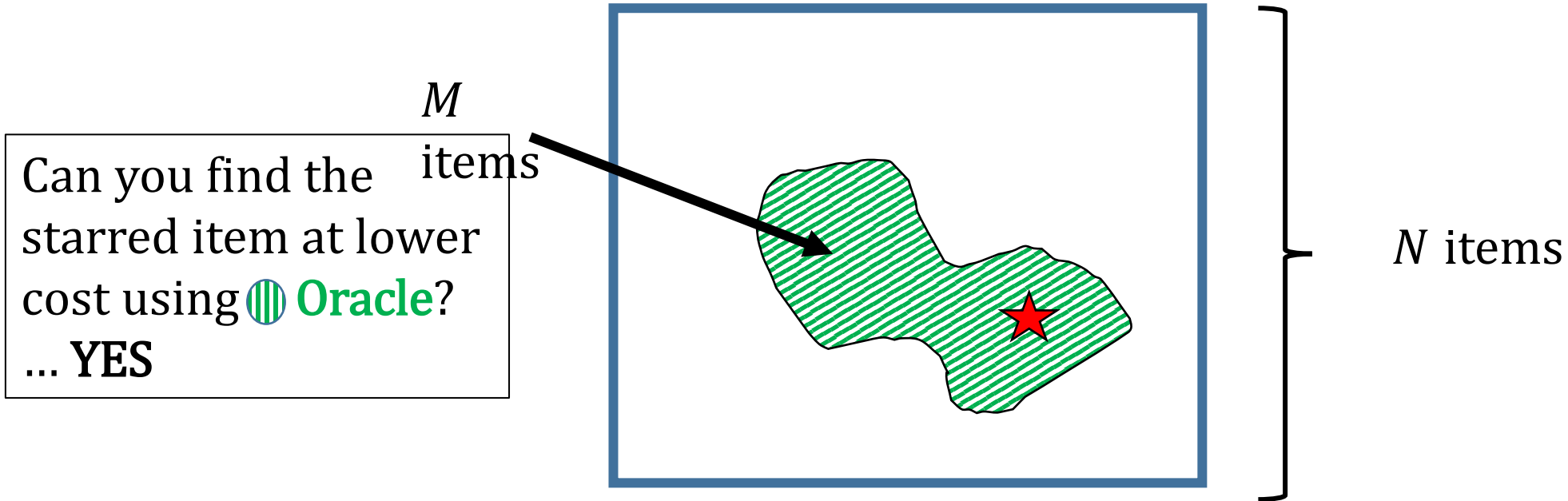
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Searching with Multiple Oracles

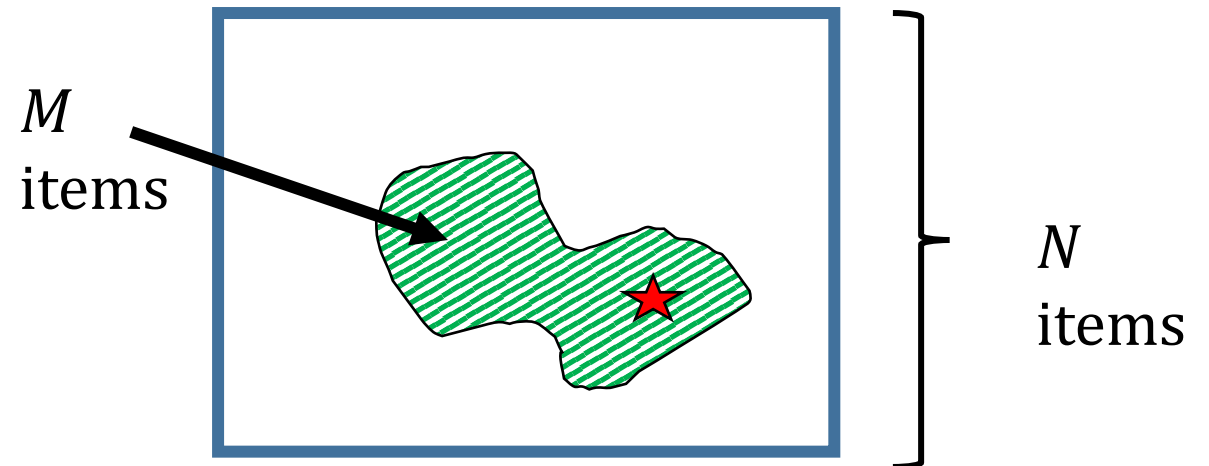
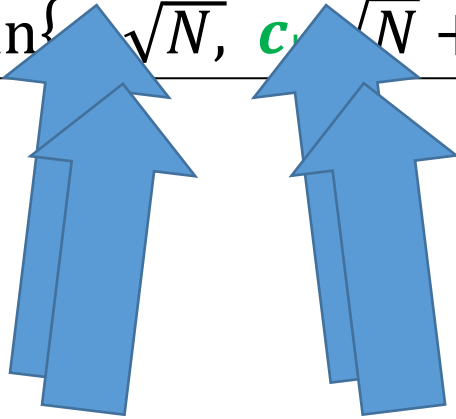
Can ask **★ Oracle**, “Is the i^{th} item starred?” with cost c_*

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$$c_* > c_{||}$$

Promised: The starred item is also striped

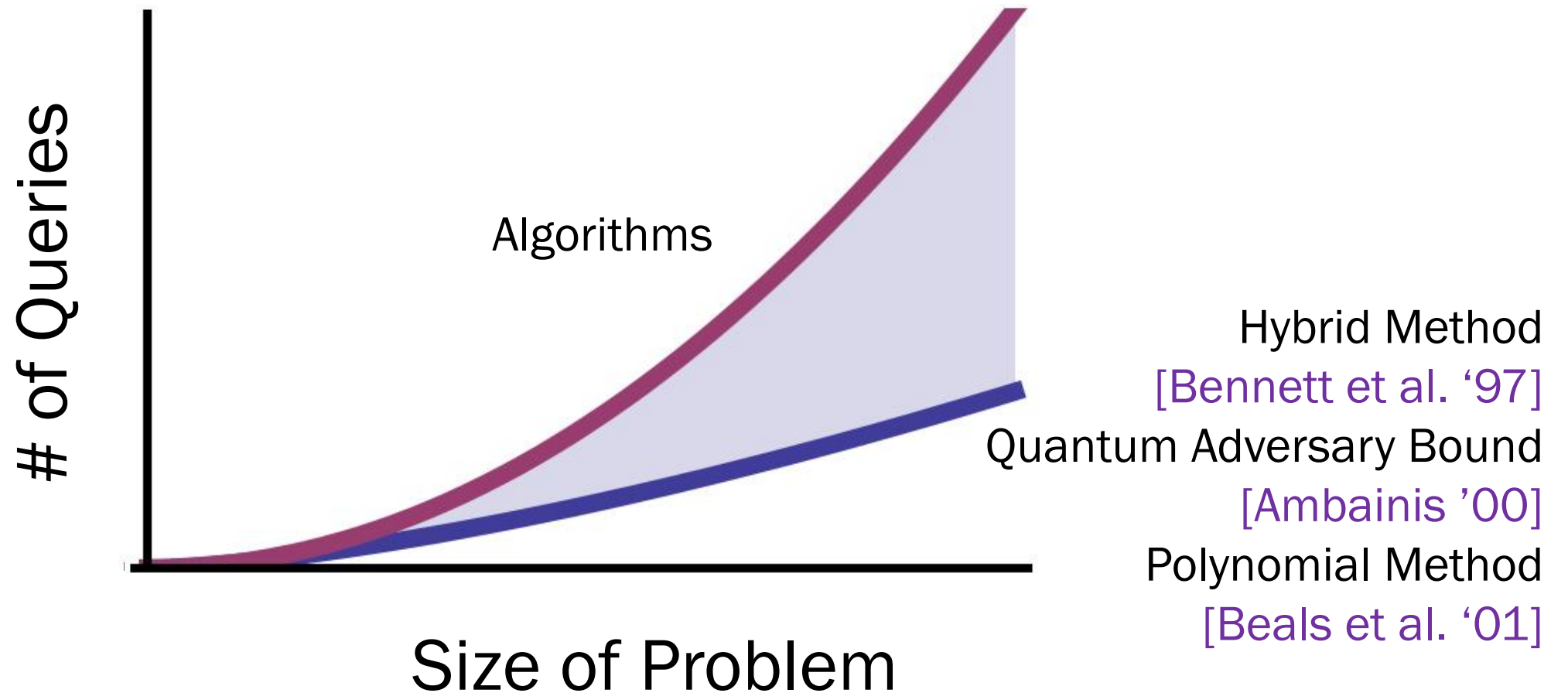
$$\begin{aligned} \text{Classical} &\sim \min\{c_*N, c_{||}N + c_*M\} \\ \text{Quantum} &\sim \min\{\sqrt{N}, c_{||}\sqrt{N} + c_*\sqrt{M}\} \end{aligned}$$



Sometimes best to check all N items using **★ Oracle**

Otherwise can check all N items using cheaper oracle, but still need to use **★ Oracle** for M items

Quantum Query Complexity Bounds



Lower Bounds for Search with Multiple Oracles

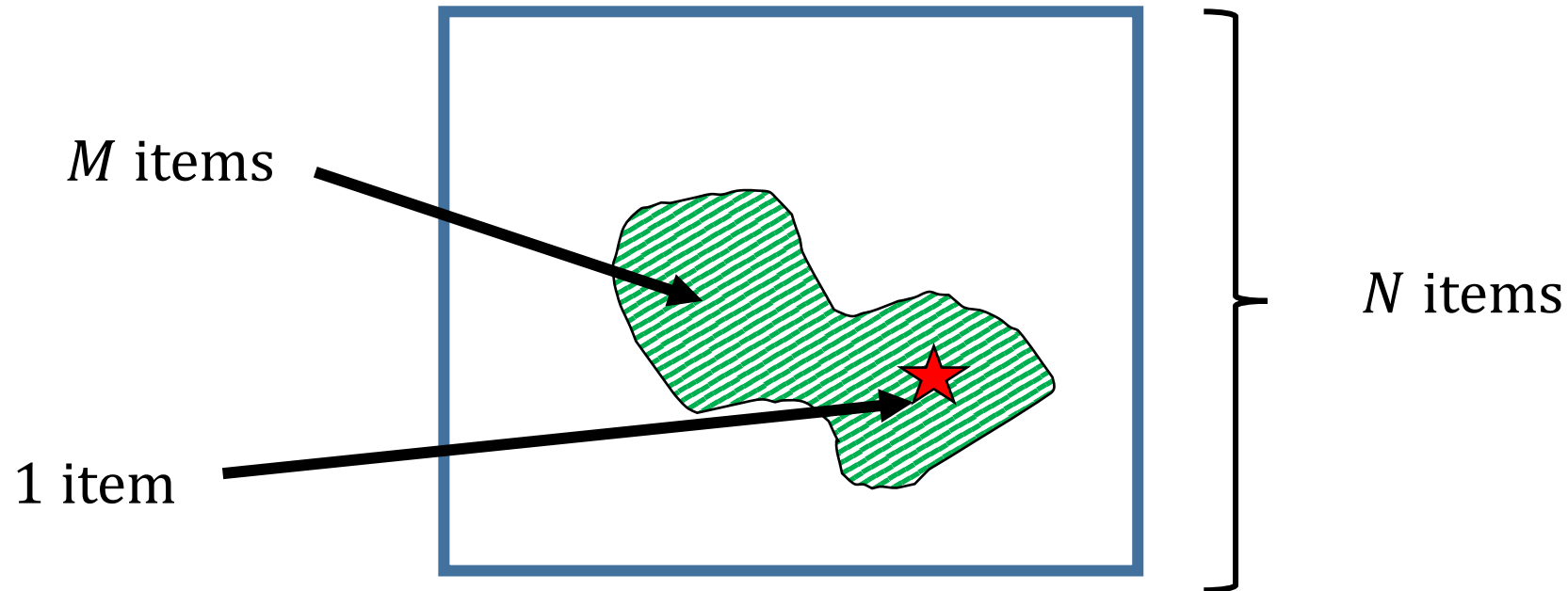
- **TOOL:**

- Need at least $\sim\sqrt{N}$ queries to quantum oracle to find one item out of N [Bennett et al '97]

* “at least $\sim\sqrt{N}$ ” means at least $A\sqrt{N}$ for some constant A as N gets large. $= \Omega(\sqrt{N})$

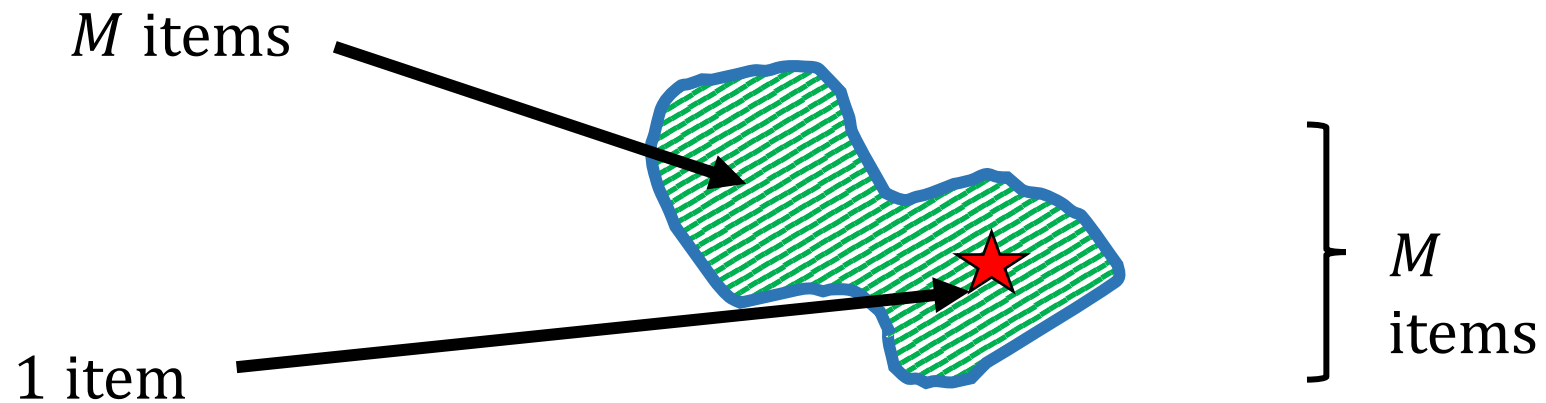
Lower Bounds for Search with Multiple Oracles

- How much can  Oracle help?





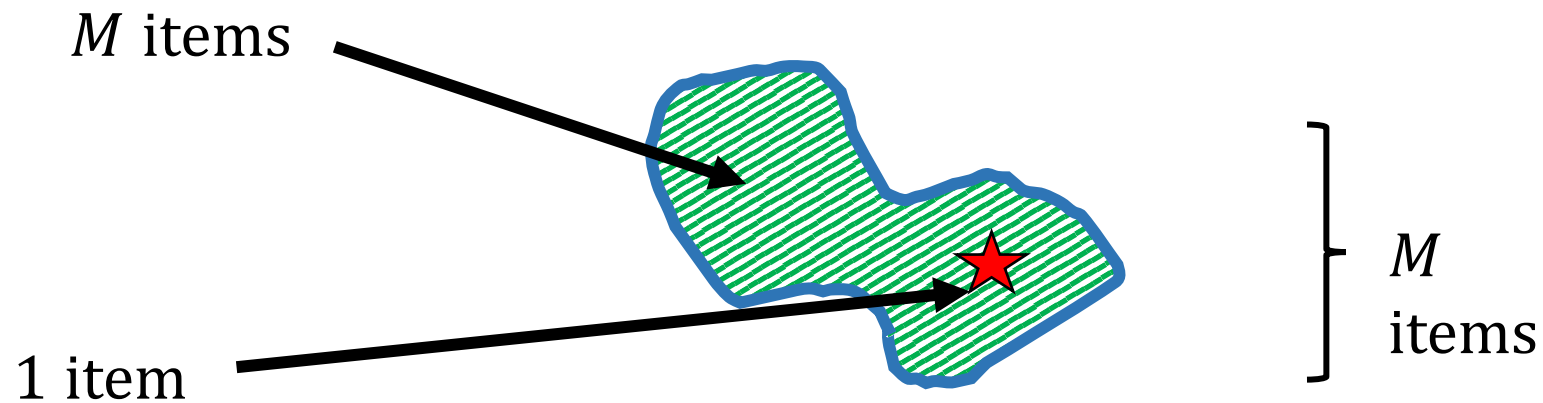
Lower Bounds for Search with Multiple Oracles

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Lower Bounds for Search with Multiple Oracles


- How much can  Oracle help?
 - At best, can narrow down to M items. But now searching for 1 among M , need at least $\sim\sqrt{M}$ queries to  Oracle **TOOL**



Lower Bounds for Search with Multiple Oracles

- How much can  Oracle help?
 - At best, can narrow down to M items. But now searching for 1 among M , need at least $\sim\sqrt{M}$ queries to  Oracle **TOOL**

1.

 Oracle has cost c_* , and need to use it $\sim\sqrt{M}$ times.
Always will have a cost of $\sim c_*\sqrt{M}$

Lower Bounds for Search with Multiple Oracles

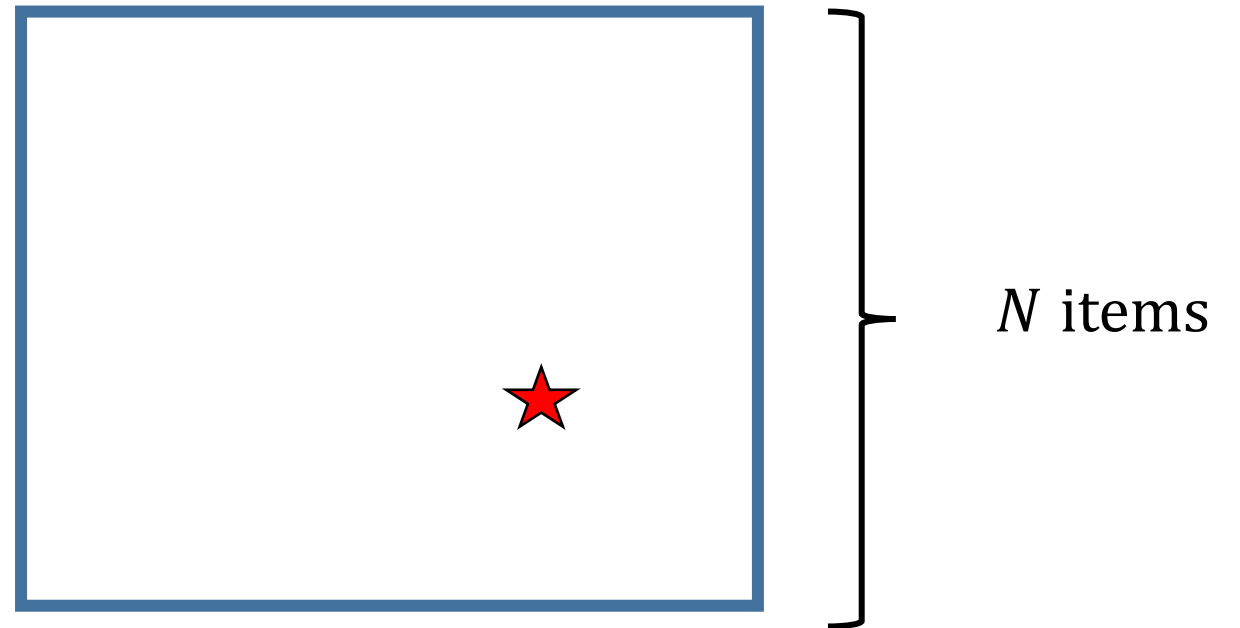
- Need **★ Oracle** $\sim \sqrt{M}$ times; How many times do we need **⊞ Oracle**?
- What if only needed to use **⊞ Oracle** \sqrt{M} times? (For contradiction.)
 - This would be awesome!
 - Would always want to have an **⊞ Oracle**, because it helps so much

Idea: Even if aren't given **⊞ Oracle**, create it using **★ Oracle**.

Lower Bounds for Search with Multiple Oracles

- What if only needed to use  Oracle \sqrt{M} times? (For contradiction.)

Idea: Even if aren't given  Oracle, create it using  Oracle.

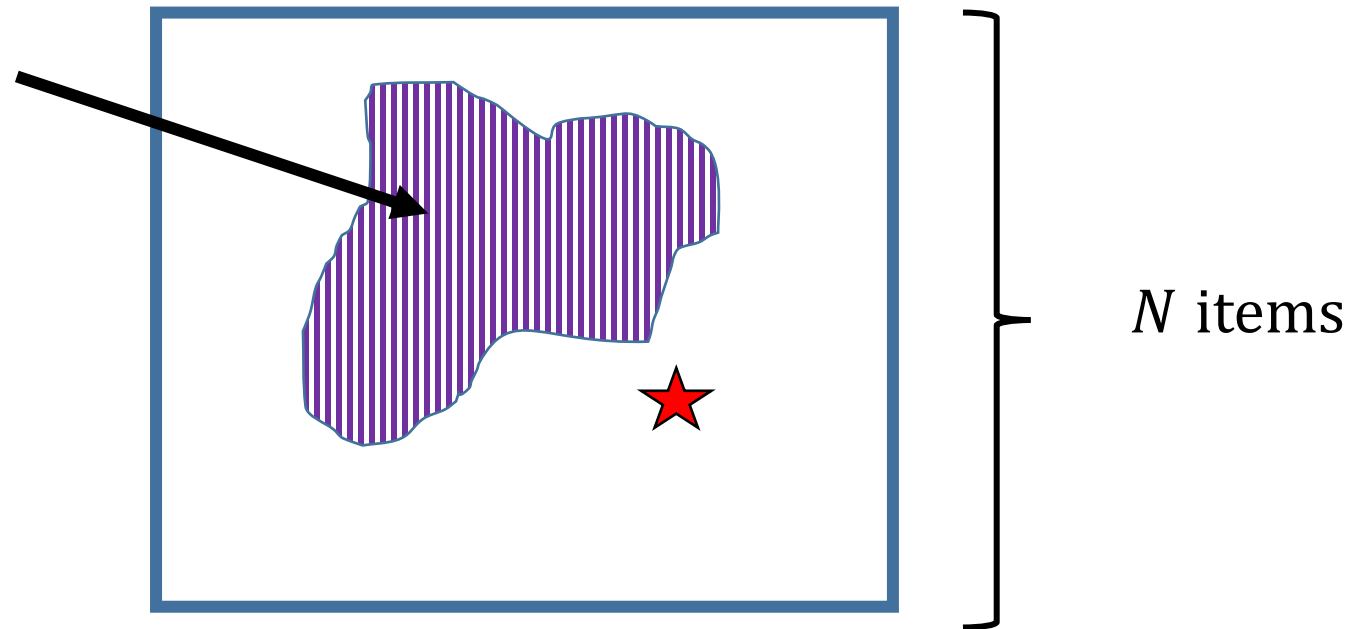


Lower Bounds for Search with Multiple Oracles

- What if only needed to use  Oracle \sqrt{M} times? (For contradiction.)

Idea: Even if aren't given  Oracle, create it using  Oracle.

Choose M items at random to be marked by " Oracle"



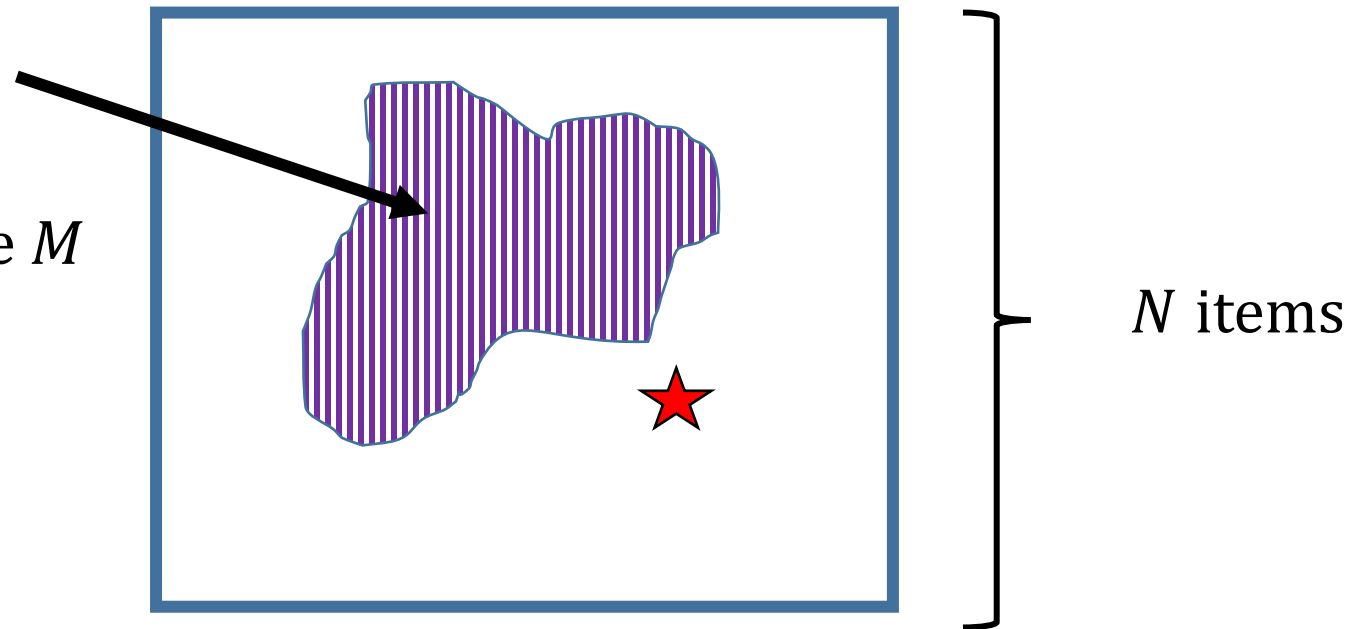
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Problem: Need starred item in the M



Lower Bounds for Search with Multiple Oracles

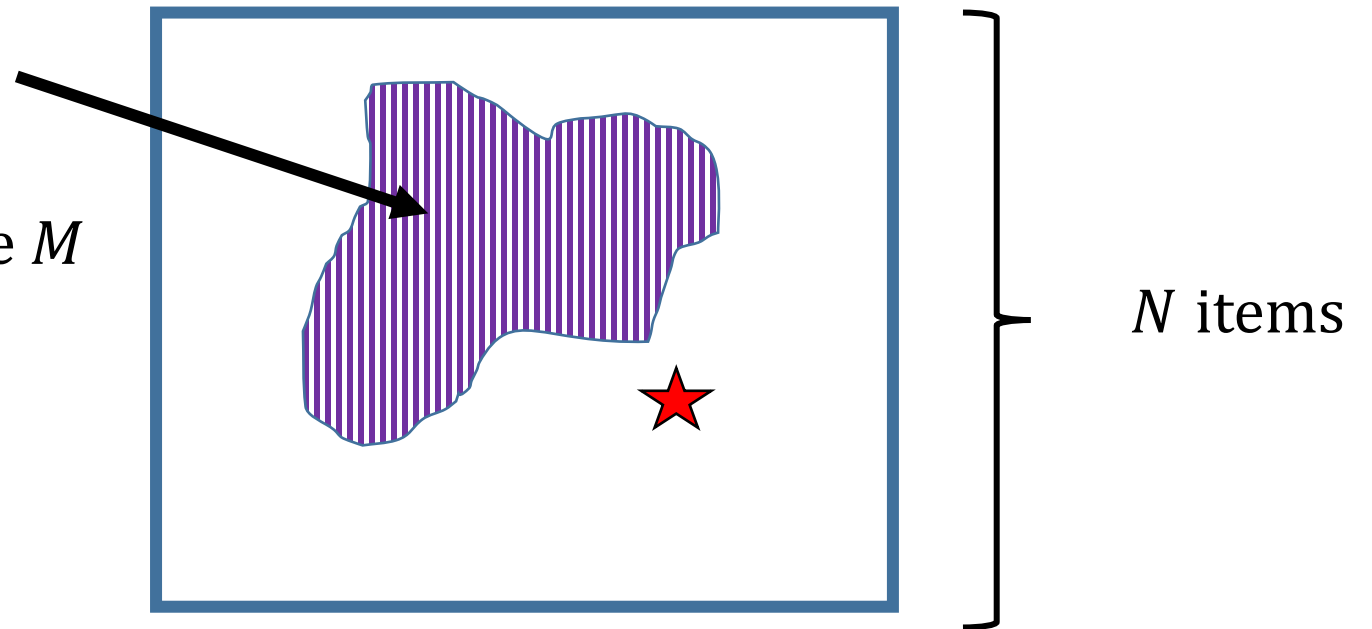
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Problem: Need starred item in the M

Solution: Use  Oracle to check if starred. If it is starred, mark as striped.



Lower Bounds for Search with Multiple Oracles

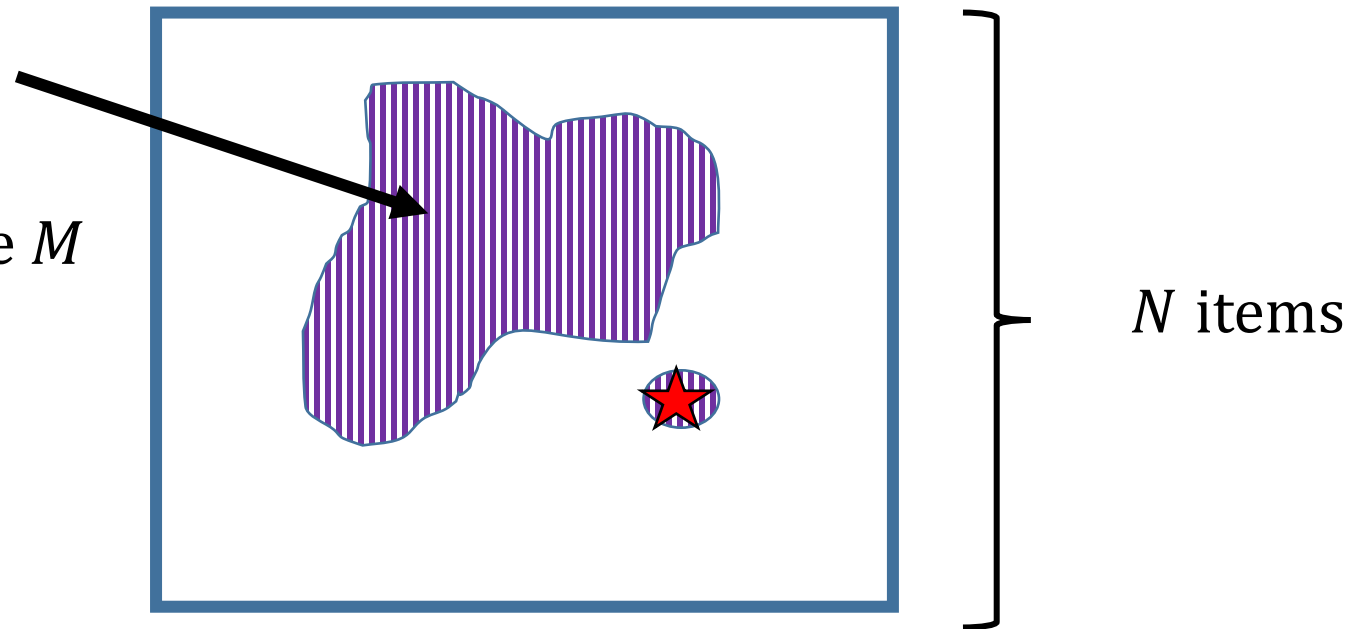
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Solution: Use  Oracle to check if starred. If it is starred, mark as striped.



Lower Bounds for Search with Multiple Oracles

- What if only needed to use $\text{Oracle} \sqrt{M}$ times? (For contradiction.)

Idea: Even if aren't given Oracle , create it using $\star \text{Oracle}$.

Can simulate Oracle using one (two) queries to $\star \text{Oracle}$!

 Only need to use $\star \text{Oracle} \sim \sqrt{M}$ times to simulate Oracle .


Lower Bounds for Search with Multiple Oracles

- What if only needed to use $\textcircled{|||}$ Oracle \sqrt{M} times? (For contradiction.)




Idea: Even if aren't given $\textcircled{|||}$ Oracle, create it using \star Oracle.

Can simulate $\textcircled{|||}$ Oracle using one (two) queries to \star Oracle!









 Only need to use \star Oracle $\sim\sqrt{M}$ times to simulate $\textcircled{|||}$ Oracle.

 Previously showed need $\sim\sqrt{M}$ queries to \star Oracle if have an $\textcircled{|||}$ Oracle.

Lower Bounds for Search with Multiple Oracles

- What if only needed to use  Oracle \sqrt{M} times? (For contradiction.)
Idea: Even if aren't given  Oracle, create it using  Oracle.

Can simulate  Oracle using one (two) queries to  Oracle!

-  Only need to use  Oracle $\sim\sqrt{M}$ times to simulate  Oracle.
-  Previously showed need $\sim\sqrt{M}$ queries to  Oracle if have an  Oracle.
-  Can find starred item using $\sim\sqrt{M}$ queries to  Oracle



Lower Bounds for Search with Multiple Oracles

- What if only needed to use  Oracle \sqrt{M} times? (For contradiction.)
Idea: Even if aren't given  Oracle, create it using  Oracle.

Can simulate  Oracle using one (two) queries to  Oracle!

 Only need to use  Oracle $\sim\sqrt{M}$ times to simulate  Oracle.

 Previously showed need $\sim\sqrt{M}$ queries to  Oracle if have an  Oracle.

 ~~Can find starred item using \sqrt{M} queries to  Oracle~~

TOOL

Lower Bounds for Search with Multiple Oracles

- Using this argument:

2.

Always need to use either ★ Oracle or 🟢 Oracle at least $\sim\sqrt{N}$ times.

Lower Bounds for Search with Multiple Oracles

1.

Always need to use
★ **Oracle** at least $\sim\sqrt{M}$
times.

2.

Always need to use
either ★ **Oracle** or
⊖ **Oracle** at least $\sim\sqrt{N}$
times.

Minimum cost:

$$c_{\parallel}\sqrt{N} + c_{\star}\sqrt{M}$$

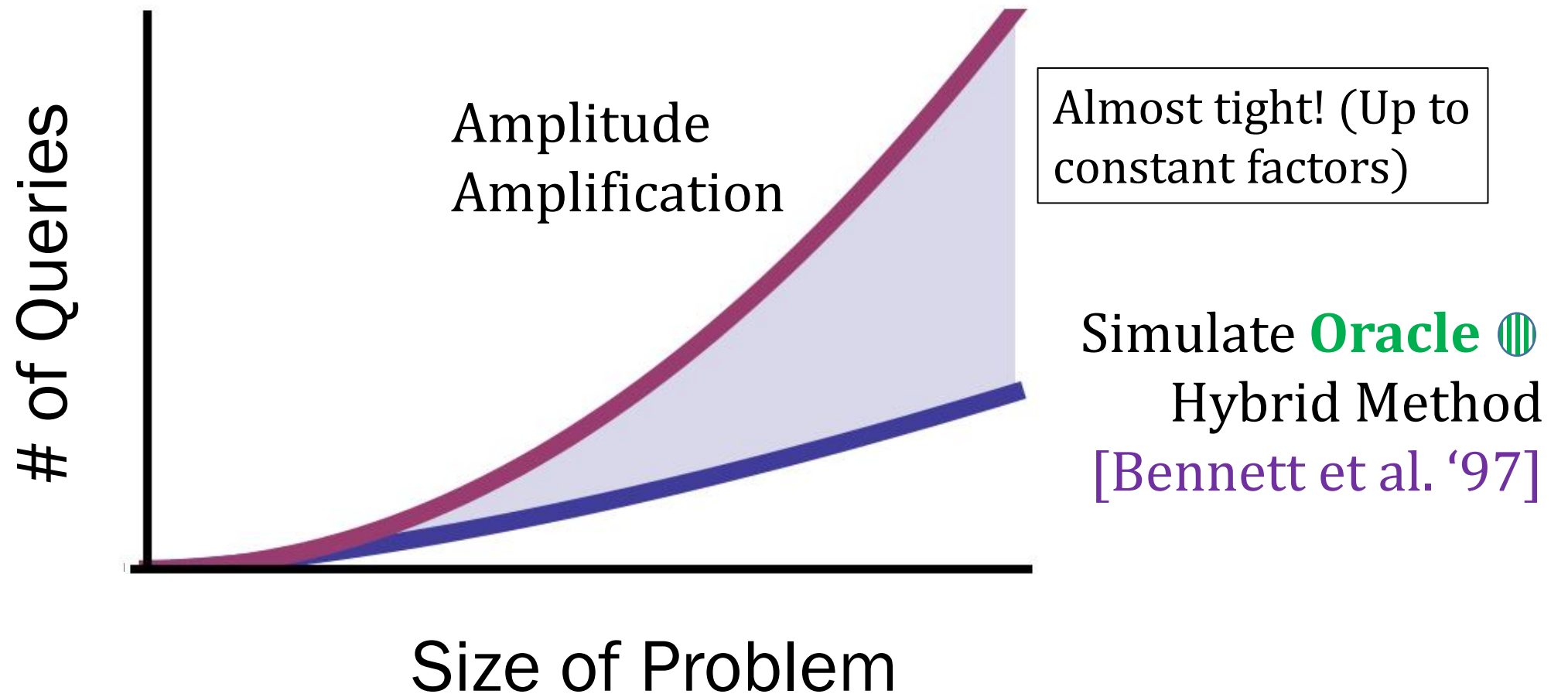
Or

$$c_{\star}\sqrt{N}$$

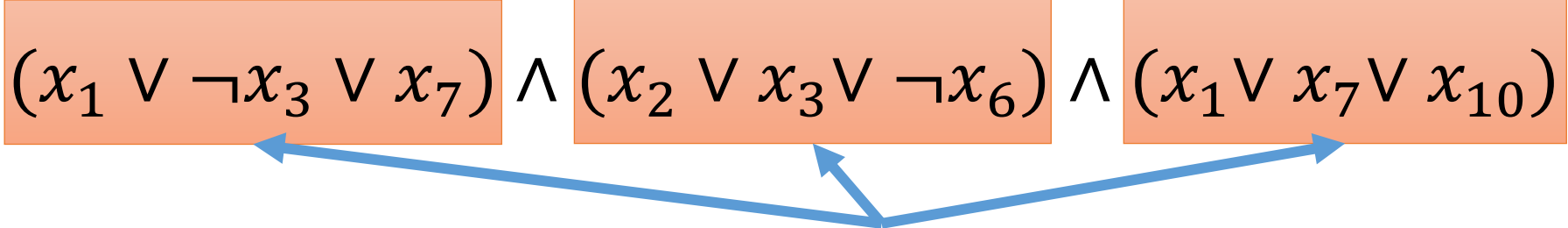
Algorithm for Searching with Multiple Oracles

Amplitude Amplification

Quantum Query Complexity Bounds



Algorithm for 3-SAT

$$F(x_1, x_2, \dots, x_n) = (x_1 \vee \neg x_3 \vee x_7) \wedge (x_2 \vee x_3 \vee \neg x_6) \wedge (x_1 \vee x_7 \vee x_{10}) \dots$$


$\sim \text{poly}(n)$ clauses (e.g. Cn^2)

- Guess a satisfying assignment. Test if all clauses are satisfied **EXPENSIVE**
 - Need to test $\sim 2^n$ possible inputs. With quantum computer can do in $\sqrt{2^n}$ steps
- Guess a satisfying assignment. Test if $\sim \log(n)$ clauses are satisfied **CHEAP**
Defines a subset of possible solutions, including the true satisfying assignment, if it exists

What is M ?

Directions for Future Work

- Create tight bounds for searching with multiple oracles
 - Adversary Bound/Span programs
 - Geometric picture
- Can we create a general framework for understanding oracles with costs, in the way that the adversary bound is a framework for understanding standard oracle problems
- Many quantum oracle problems – does it make sense to add multiple oracles to these problems?

Classical Algorithm

1. Choose item at random and test if striped using Oracle 2
2. If it is striped, test if starred using Oracle 1

Worst case cost:

$$c_1(M - 1) + c_2N$$