

## 6. Quantum computational complexity (mostly reading)

NC 3.2 (less detailed), KLM 9.1 (more detailed)

Professor John Watrous Lecture notes  
Quantum Computation spring 2006, lecture 22  
<https://johnwatrous.com/lecture-notes/>  
scroll to the very bottom!

Complexity Zoo by Scott Aaronson

## Big-O notation (reading):

Choose a parameter  $n$ . Let  $f, g : \mathbb{N} \rightarrow \mathbb{R}$ .

$$g(n) \in O(f(n)) \quad \text{iff} \quad \exists n_0, c \forall n > n_0 \quad g(n) \leq c f(n)$$

$$g(n) \in \Omega(f(n)) \quad \text{iff} \quad \exists n_0, c \forall n > n_0 \quad g(n) \geq c f(n)$$

$$\text{iff} \quad f(n) \in O(g(n))$$

$$g(n) \in \Theta(f(n)) \quad \text{iff} \quad g(n) \in O(f(n)) \wedge g(n) \in \Omega(f(n))$$

$$g(n) \in o(f(n)) \quad \text{iff} \quad \lim_{n \rightarrow \infty} \frac{g(n)}{f(n)} = 0$$

$$g(n) \in \text{poly}(n) \quad \text{iff} \quad g(n) \in O(n^c) \text{ for some fixed } c.$$

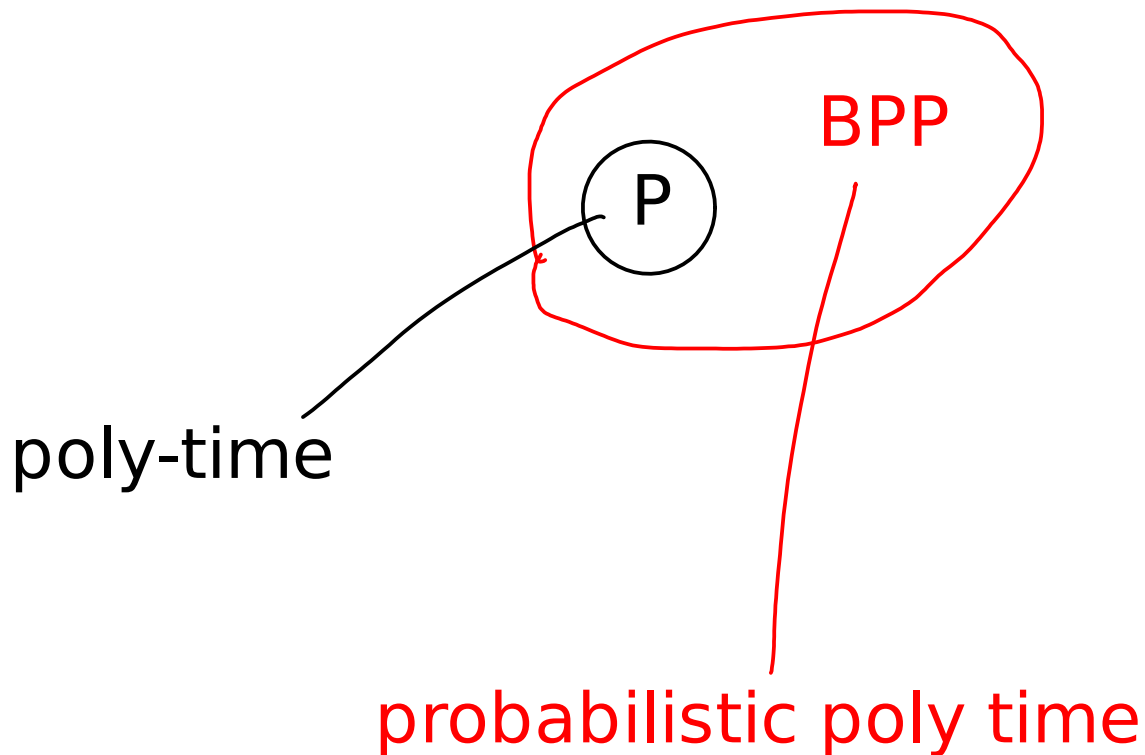
$$\text{eg } 5n^3 + 2n - 8 \in O(n^3), O(n^4), \Omega(n^3), \Omega(n^2)$$

$C=6 \quad C=1 \quad C=4 \quad C=1$

$$\in \Theta(n^3), \text{poly}(n)$$

Polynomial time classical computation --  
Problems whose complexity increases "slowly enough"  
in the input size, and what's considered "feasible".

Suspected:  $P=BPP$   
ie randomness doesn't help

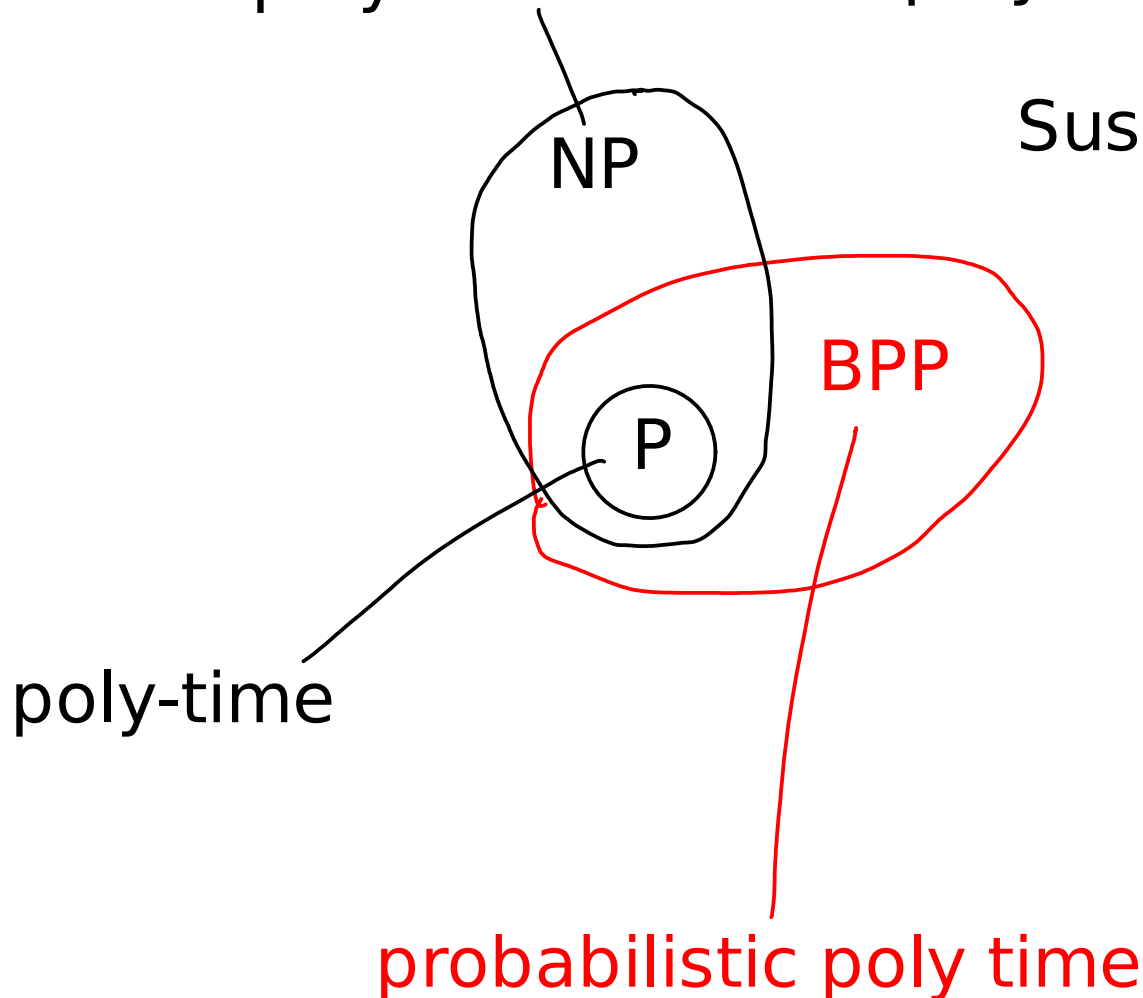


Nondeterministic polynomial time problems: those, given the answer, can be verified in polynomial time

verifiable in poly-time

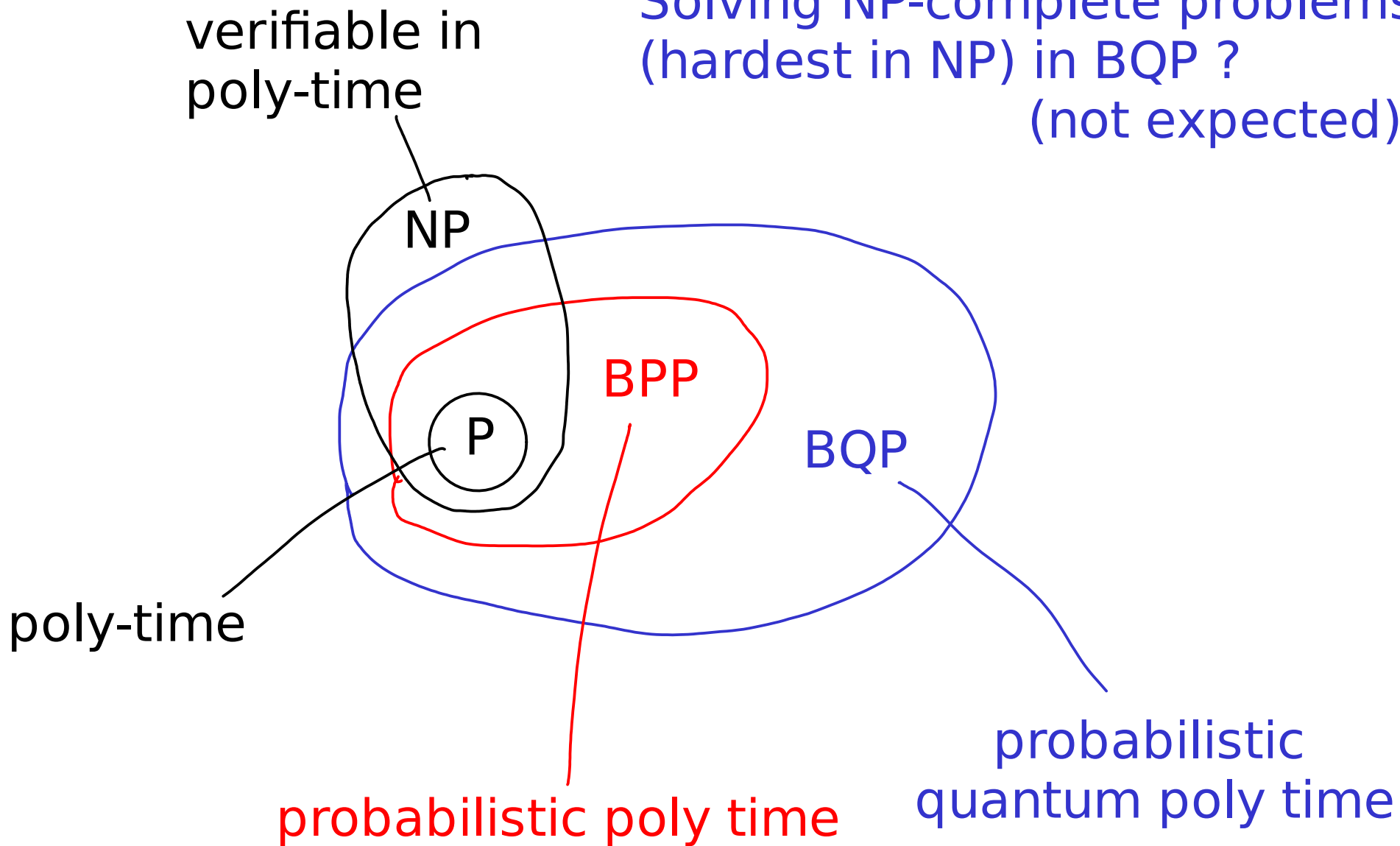
May not know how to solve in poly-time, e.g., 3-SAT

Suspected:  $P \neq NP$



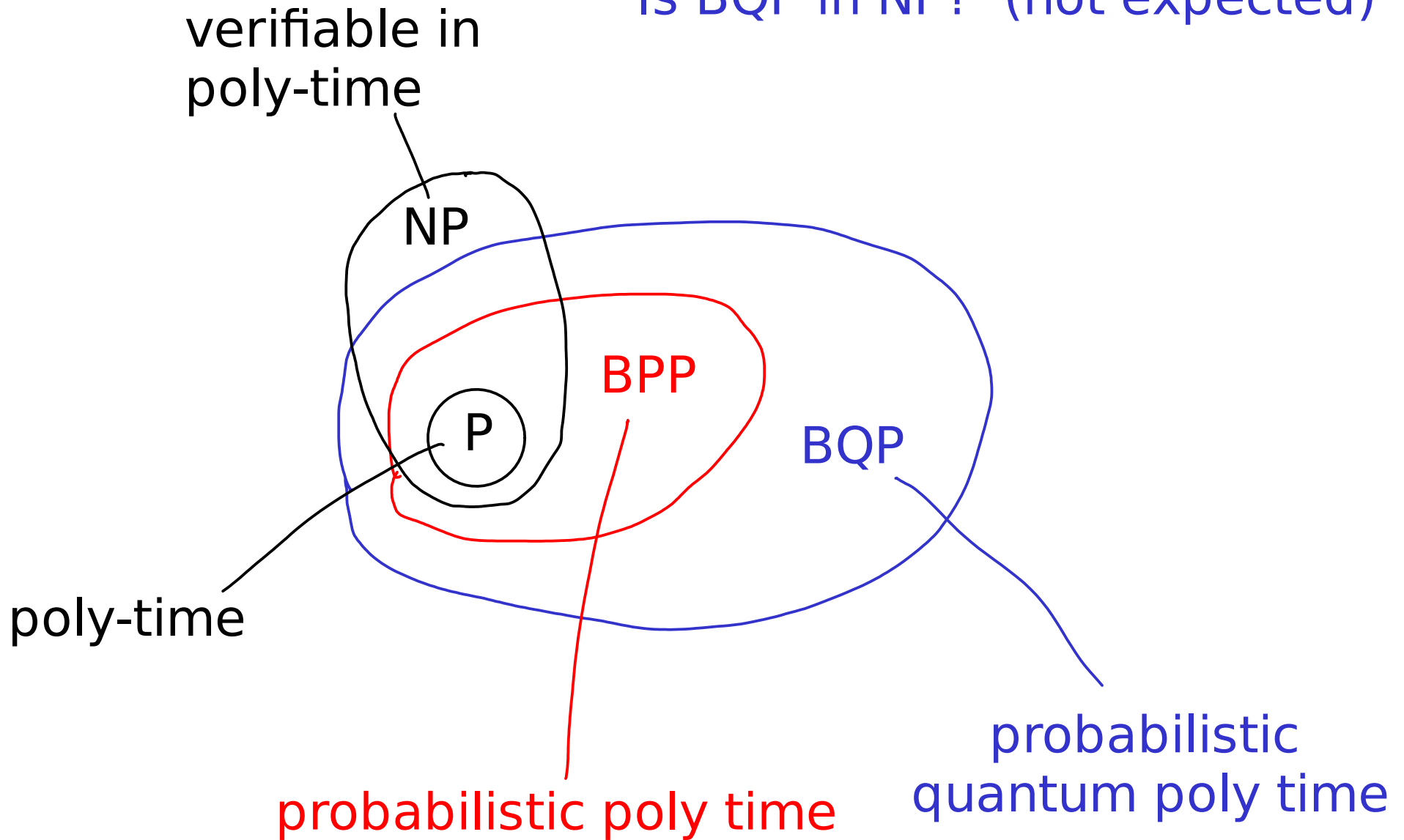
Is a quantum computer much more powerful than a classical computer?

Solving NP-complete problems  
(hardest in NP) in BQP ?  
(not expected)



Is a quantum computer much more powerful than a classical computer?

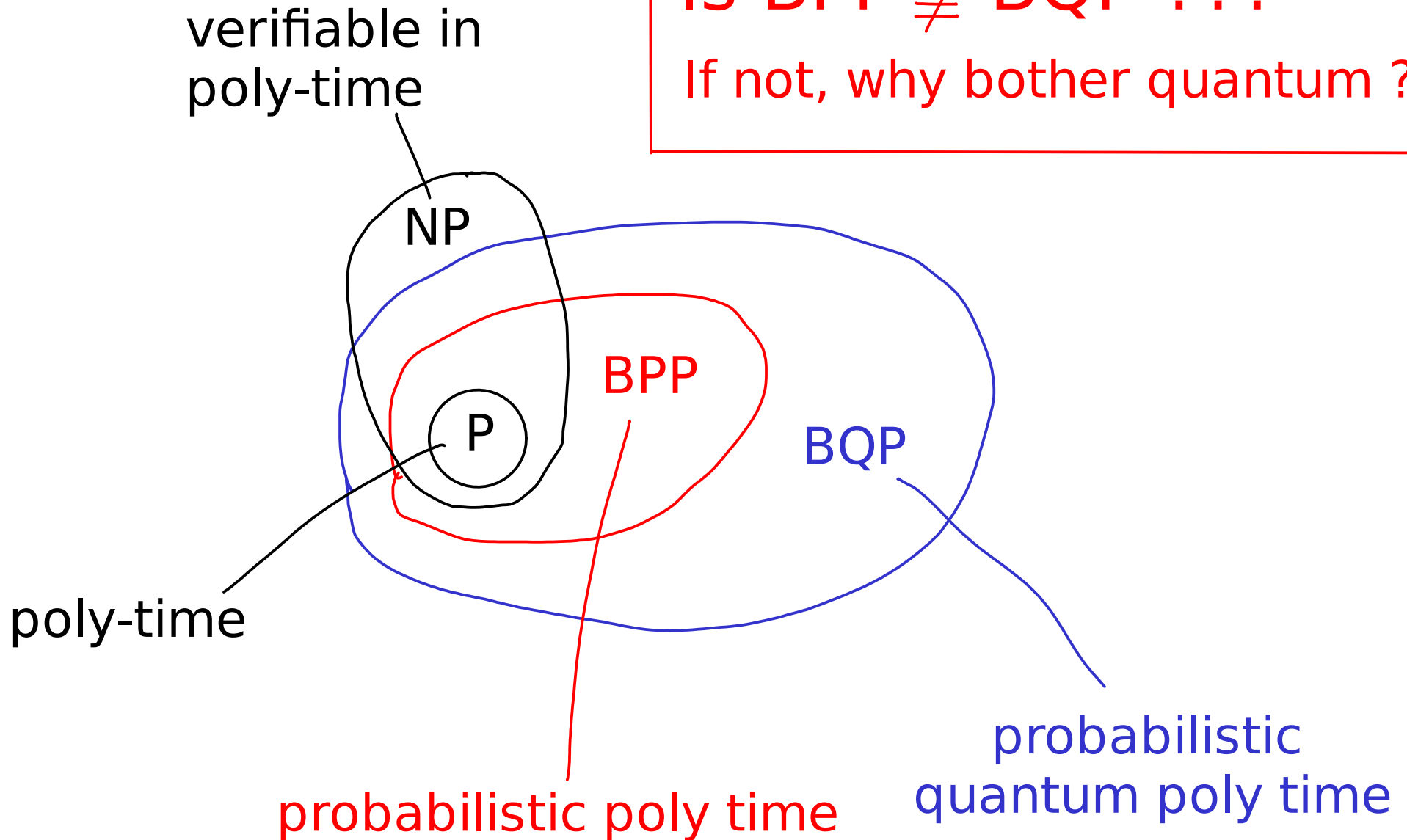
Is BQP in NP? (not expected)



Is a quantum computer much more powerful than a classical computer?

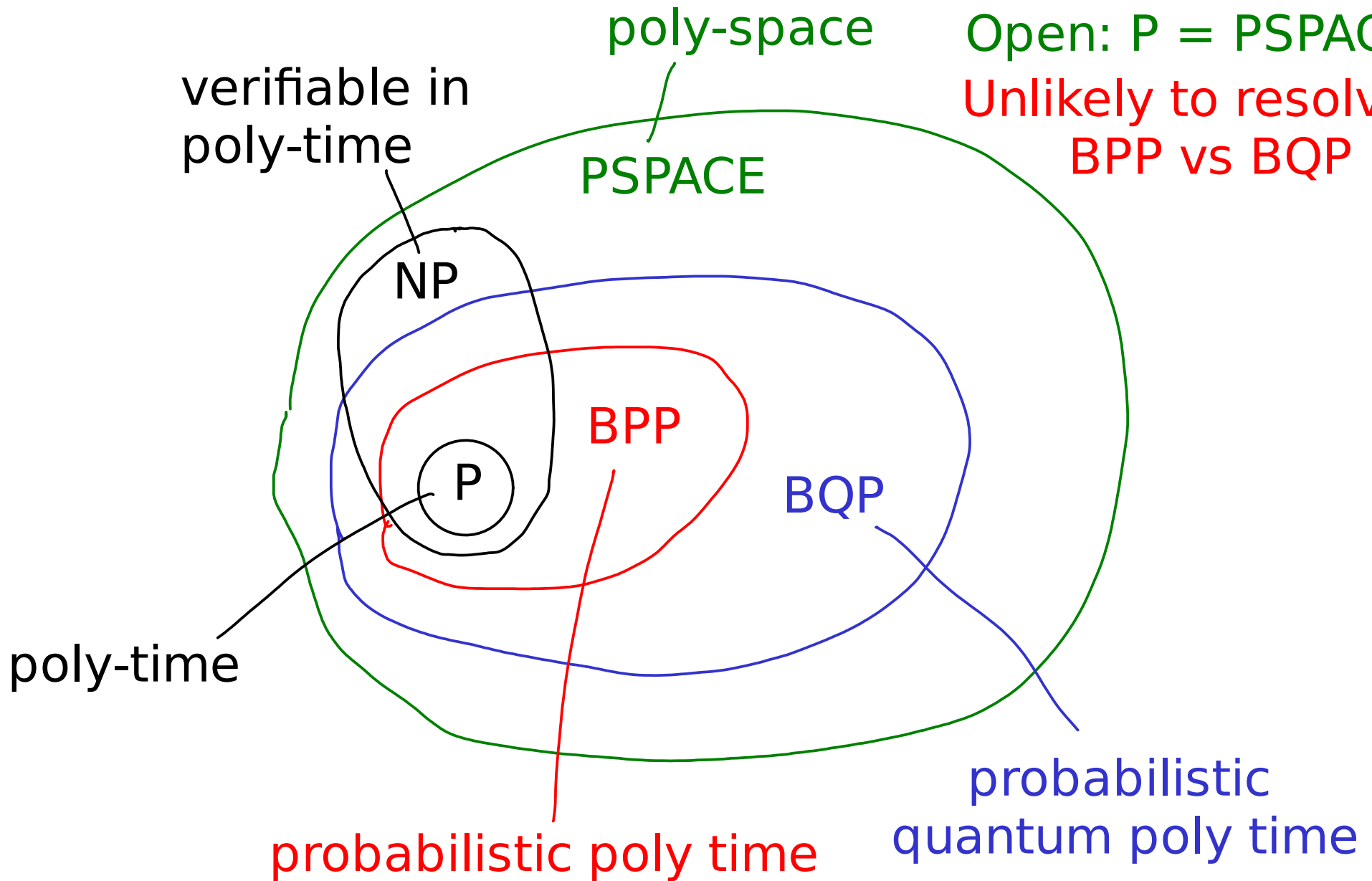
Is  $BPP \subsetneq BQP$  ???

If not, why bother quantum ?



Is a quantum computer much more powerful than a classical computer?

$BQP \subseteq PSPACE$   
Open:  $P = PSPACE$   
Unlikely to resolve  
BPP vs BQP ...





Surprisingly hard to show a problem is hard ...

The fact we can't find an efficient algorithm doesn't imply there is none ...

Idea: we turn to a different measure of complexity (not the circuit size).

## 7. Quantum algorithms (part 1)

(a) Quantum query complexity: (KLM 9.2\*, 6.2\*)  
black box model, phase kick back

(d) Deutsch-Jozsa algorithm  
(NC 1.4.2-1.4.5, KLM 6.3-6.4, M 2.2)

(e) Quantum fourier transform (I)  
(NC 5.1, M 3.5, KLM p110-117)

(f) Simon's algorithm (M 2.5, KLM 6.5)

(g) Shor's factoring algorithm  
(M 3.1-3.4, 3.7-3.10, NC 5.3, 5.4.1-5.4.2,  
KLM 7.1.2-7.1.3, 7.3.1-7.3.2, 7.3.4, 7.4)

(h) Hidden subgroup framework (NC 5.4.3, KLM 7.5)

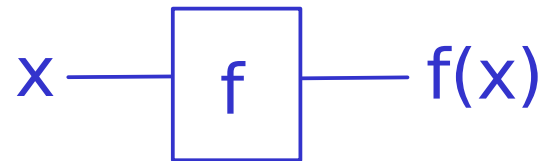
## Black box model

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Goal: determine some properties of  $f$ .

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Allowed: "query" a blackbox for  $f$  :



If input is  $x$  (in domain of  $f$ ), the blackbox outputs  $f(x)$ .

**Not allowed: open a blackbox and see what's inside.**

## Black box model

e.g.  $f(x) = a x^2 + b x + c$ , a polynomial over a field  $F$ .

Known:  $f$  polynomial of degree 2

Unknown:  $a, b, c$ .

(1) How many queries are needed to learn  $c$ ?

(2) What about  $b$ ?

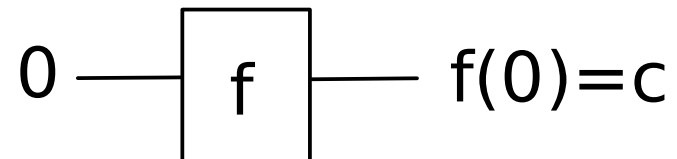
Goal:

- Solve problem with few queries
- Check if solution is optimal

## Black box model

e.g.  $f(x) = a x^2 + b x + c$

(1) 1 query is necessary and sufficient to learn  $c$ :



NB inputs to queries should be optimized!

## Black box model

e.g.  $f(x) = a x^2 + b x + c$

(2) 2 queries are necessary and sufficient to learn  $b$ :

## Black box model

e.g.  $f(x) = a x^2 + b x + c$

(2) 2 queries are necessary and sufficient to learn b:

Sufficiency:

i.e., an algorithm to solve the problem,  
giving an upper bound on the required # of queries



## Black box model

e.g.  $f(x) = a x^2 + b x + c$

(2) 2 queries are necessary and sufficient to learn  $b$ :

Sufficiency:

Pick  $q \neq 0$ , query  $q$  and  $-q$ ;  $b = (f(q) - f(-q))/2q$ .

\     /  
from the black box

## Black box model

e.g.  $f(x) = a x^2 + b x + c$

(2) 2 queries are necessary and sufficient to learn b:

Necessity:

ie., proving lower-bound on the required # of queries  
-- useful for checking optimality of known solutions

## Black box model

e.g.  $f(x) = a x^2 + b x + c$

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Suppose, by contradiction, 1 query suffices.

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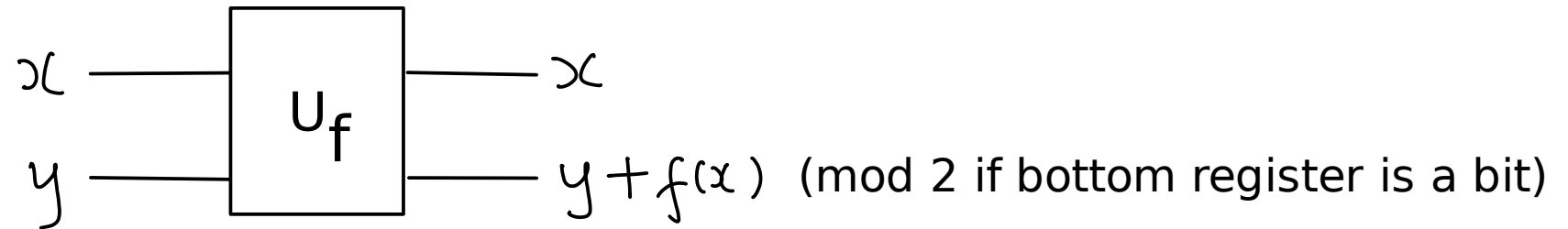
So, query  $q$  cannot distinguish  $f(x)$  from  $g(x)$  but they have different linear coefficients, a contradiction.

## Student feedback from W2019:

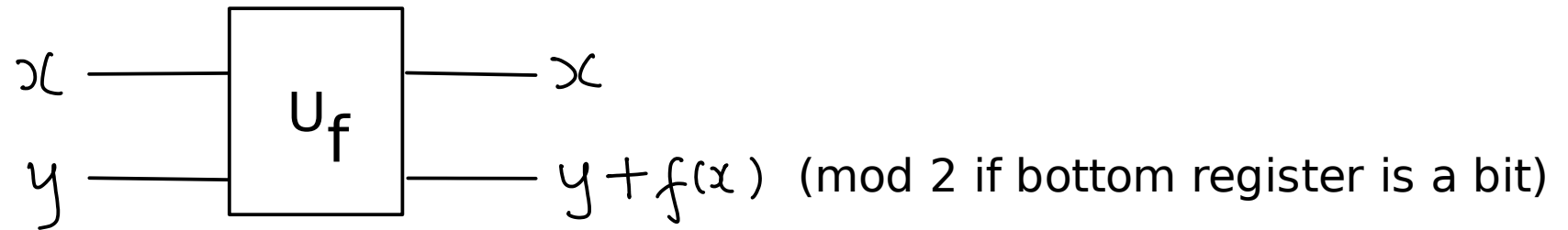
If the coefficients are real, but the input/output are allowed to be complex, then 1 query suffices. Note that this scenario breaks the condition that the polynomial is over a field (both inputs and coeffs are from the same field). In this scenario,  $g(x)$  in the proof is not a valid polynomial (why there is no contradiction to our proven result).



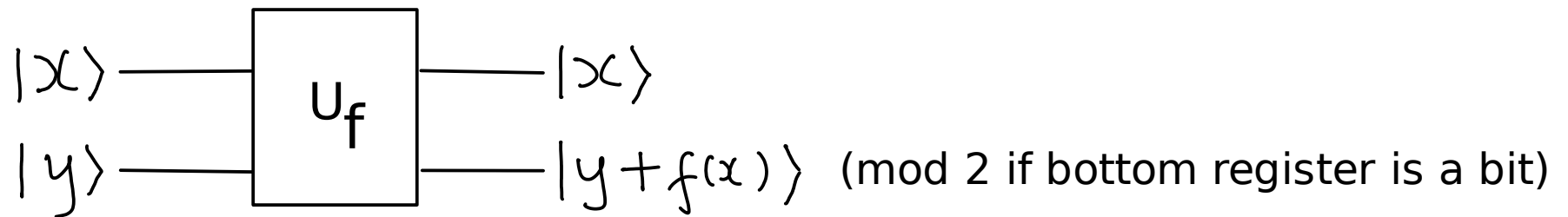
## Reversible blackbox:



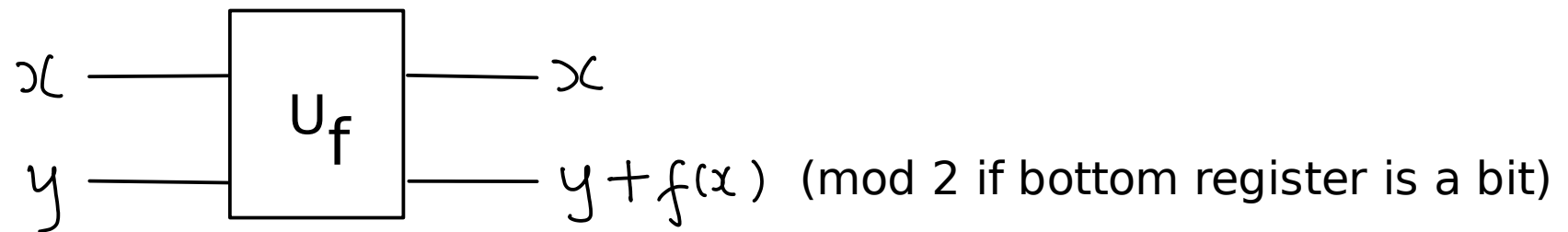
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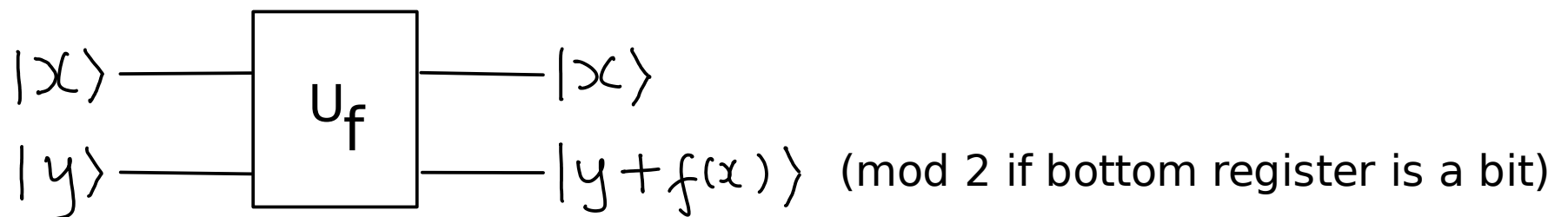
## Quantum blackbox:



## Reversible blackbox:



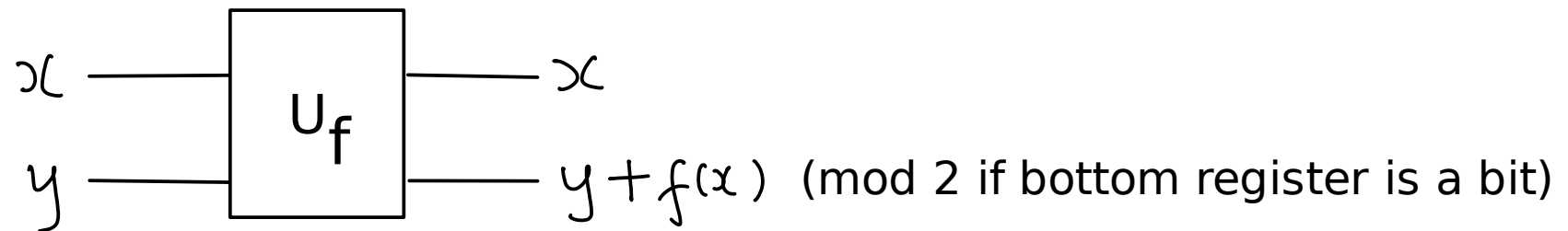
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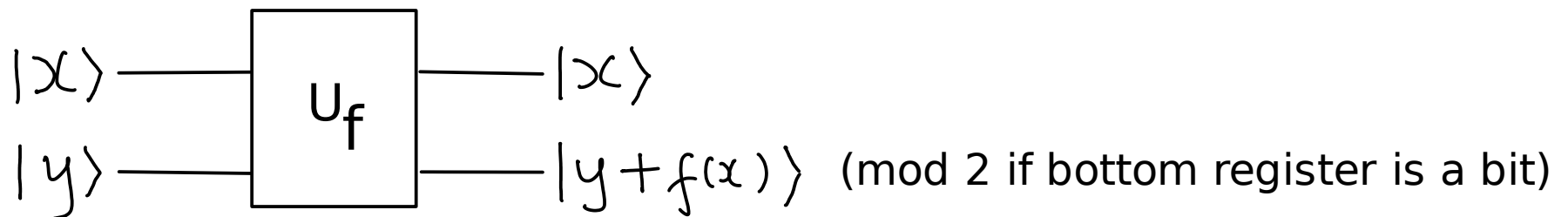
It's like an "f(x)-controlled-NOT".

1. compute  $f(x)$  keeping  $x$
2. CNOT from  $f(x)$  to target
3. uncompute  $f(x)$

## Reversible blackbox:



## Quantum blackbox:



Qn: is quantum computation with quantum black boxes more powerful than classical computation with reversible classical blackboxes?

Quantum programming technique 1

Phase kick back

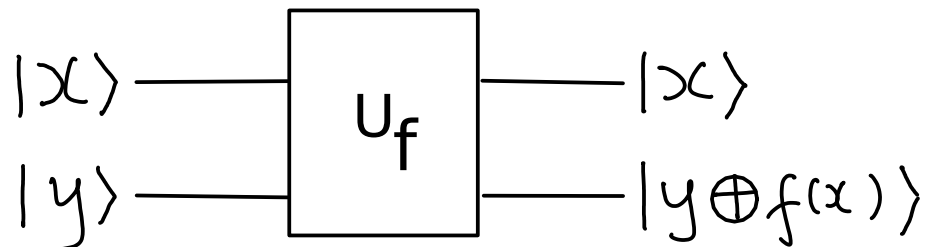
## Phase kick back

For a Boolean function  $f$  (the range is  $\{0,1\}$ ), the quantum blackbox of  $f$  can be modified to "answer in the phase".

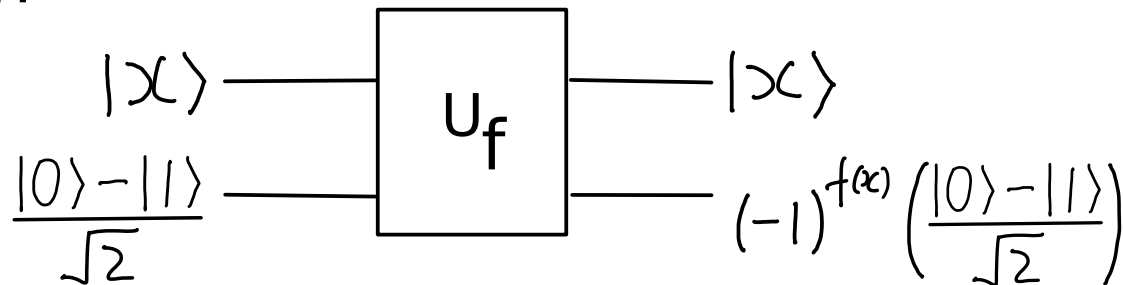
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i.e., If

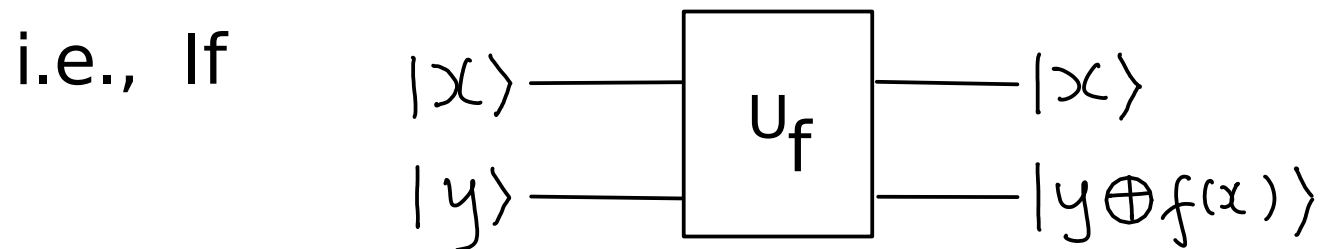


then

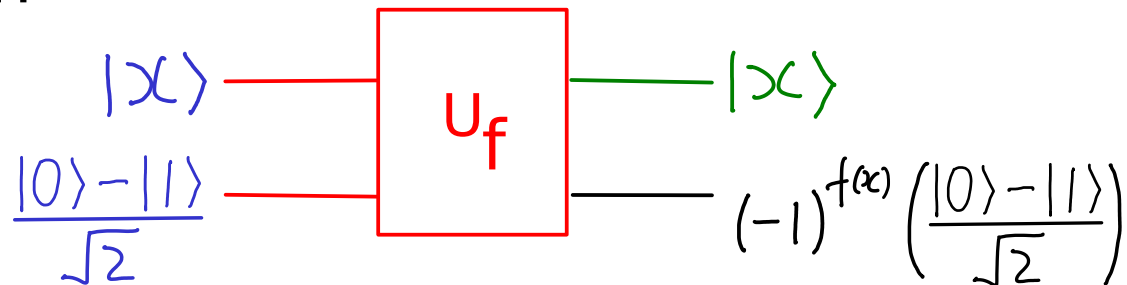


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For a Boolean function  $f$  (the range is  $\{0,1\}$ ), the quantum blackbox of  $f$  can be modified to "answer in the phase".



then



Proof:

$$|x\rangle \left( \frac{|0\rangle - |1\rangle}{\sqrt{2}} \right) \xrightarrow{U_f} \frac{1}{\sqrt{2}} \left( |x\rangle |f(x)\rangle - |x\rangle |f(x) \oplus 1\rangle \right)$$



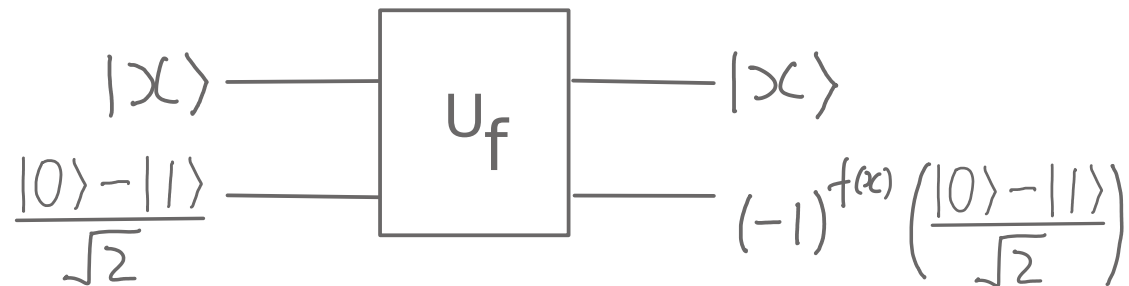
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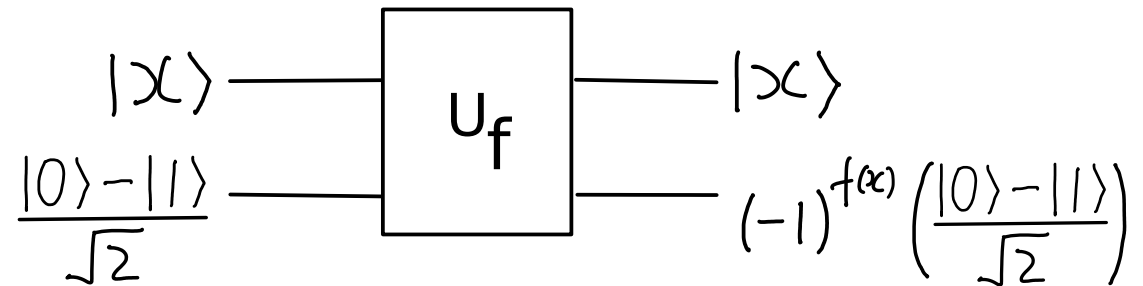
$$= \frac{1}{\sqrt{2}} |x\rangle \otimes \begin{cases} |0\rangle - |1\rangle & \text{if } f(x) = 0 \\ |1\rangle - |0\rangle & \text{if } f(x) = 1 \end{cases}$$

$$\begin{aligned}
|x\rangle \left( \frac{|0\rangle - |1\rangle}{\sqrt{2}} \right) &\xrightarrow{U_f} \frac{1}{\sqrt{2}} \left( |x\rangle |f(x)\rangle - |x\rangle |f(x) \oplus 1\rangle \right) \\
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&= |x\rangle \otimes \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) (-1)^{f(x)} \quad \square
\end{aligned}$$

which is what we seek to prove:

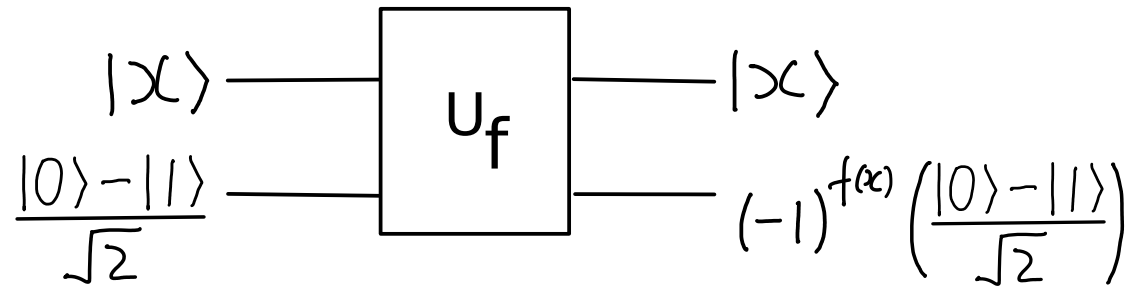


## Phase kick back



For one  $x$ , the black box kicks back an overall phase, for a superposition of inputs, the phase is relative !

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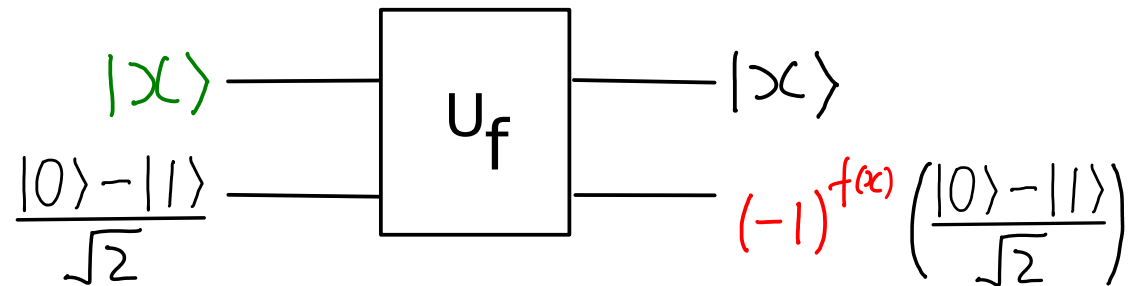
e.g.,  $f(x) = x$ ,  $x = 0, 1$

Input  $\frac{1}{\sqrt{2}} (|0\rangle + |1\rangle)$  (superpose  $x=0$  &  $x=1$ ).

$$\frac{1}{\sqrt{2}} (|0\rangle + |1\rangle) \left( \frac{|0\rangle - |1\rangle}{\sqrt{2}} \right) \xrightarrow{U_f} \frac{1}{\sqrt{2}} (+|0\rangle - |1\rangle) \left( \frac{|0\rangle - |1\rangle}{\sqrt{2}} \right)$$

So, kick back is NOT an overall phase for  $U_f$ .

## Phase kick back



In fact, the black box is like a controlled-gate:

$(-1)^{f(x)} I$  is applied to the target if the control is  $|x\rangle$ .

with target input is fixed to  $\frac{|0\rangle - |1\rangle}{\sqrt{2}}$ .

Recall: control qubit can change.

Goal: use this change to compute !

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Deutsch-Josza algorithm



## Deutsch's problem:

Given: a black box for a function  $f: \{0,1\} \rightarrow \{0,1\}$

Problem: Is  $f$  constant ( $f(0)=f(1)$ )  
or balanced ( $f(0)\neq f(1)$ ) ? i.e., find  $f(0) \oplus f(1)$

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Classically, 2 queries are needed.

Ex: for each query  $x=0$  or  $1$ , for each possible answer, you have exactly 1 constant & 1 balanced function that are possible ...

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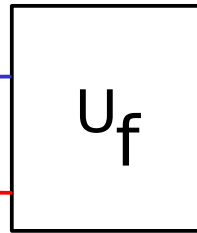
Quantumly, 1 query suffices!

## What doesn't work:

query in  
superposition

$$\frac{1}{\sqrt{2}}(|0\rangle + |1\rangle)$$

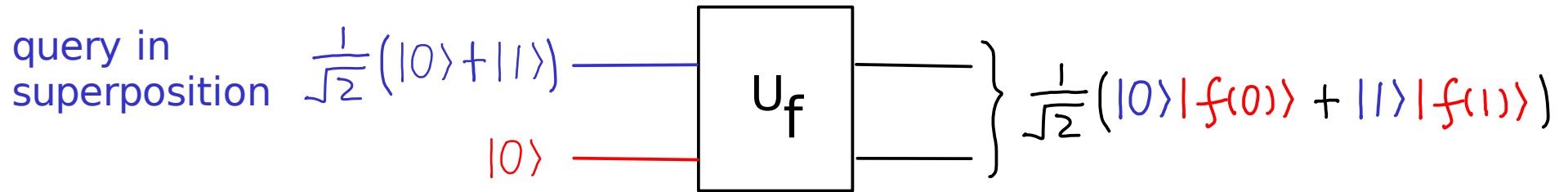
$$|0\rangle$$



$$\left. \vphantom{\frac{1}{\sqrt{2}}} \right\} \frac{1}{\sqrt{2}} (|0\rangle |f(0)\rangle + |1\rangle |f(1)\rangle)$$

looks like we have both  
f(0) & f(1) but measuring  
2nd register gives one of  
them at random ....

## What doesn't work:



(IN)Distinguishability problem!

Possibility (1):  $f$  is constant, output is

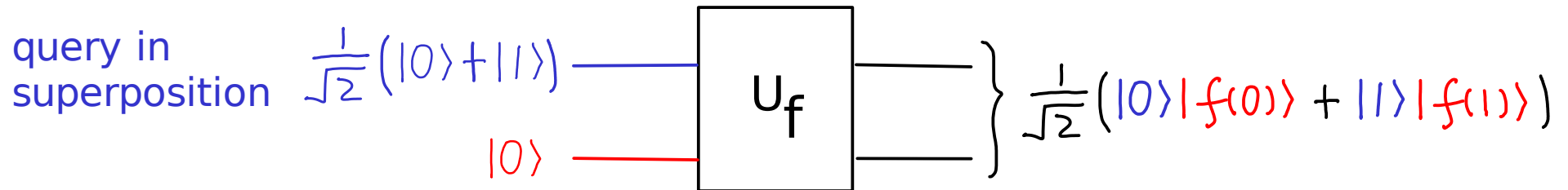
$$\frac{1}{\sqrt{2}}(|0\rangle + |1\rangle)|0\rangle \quad \text{or} \quad \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle)|1\rangle$$

Possibility (2):  $f$  is balanced, output is

$$\frac{1}{\sqrt{2}}(|00\rangle + |11\rangle) \quad \text{or} \quad \frac{1}{\sqrt{2}}(|01\rangle + |10\rangle)$$

The two states within each possibility are mutually orthogonal, ...

## What doesn't work:



(IN)Distinguishability problem!

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The two states within each possibility are mutually orthogonal, **BUT ... each state in possibility (1) is NOT orthogonal to each state in possibility (2).**

So, the two possibilities are NOT distinguishable !

# What works:

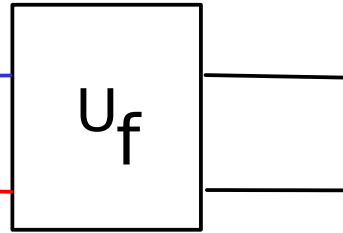
query in  
superposition

$$\frac{1}{\sqrt{2}}(|0\rangle + |1\rangle)$$

ancilla for  
phase kick  
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$$\frac{1}{\sqrt{2}}(|0\rangle - |1\rangle)$$

||  
|→



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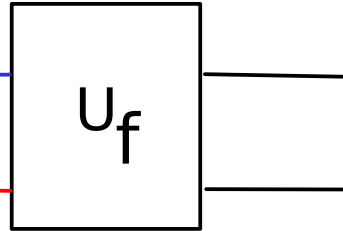
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||  
|→



$$\frac{1}{\sqrt{2}}(|0\rangle + |1\rangle) |-\rangle \xrightarrow{U_f} \left( \frac{1}{\sqrt{2}} |0\rangle (-1)^{f(0)} + \frac{1}{\sqrt{2}} |1\rangle (-1)^{f(1)} \right) |-\rangle$$



# What works:

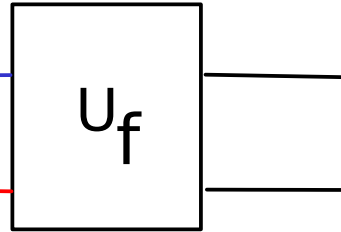
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$$\frac{1}{\sqrt{2}}(|0\rangle + |1\rangle) | \rightarrow \xrightarrow{U_f} \left( \frac{1}{\sqrt{2}}|0\rangle(-1)^{f(0)} + \frac{1}{\sqrt{2}}|1\rangle(-1)^{f(1)} \right) | \rightarrow$$

$$= \underset{\substack{\uparrow \\ \text{overall phase}}}{(-1)^{f(0)}} \frac{1}{\sqrt{2}} \left( |0\rangle + |1\rangle \underset{\substack{\uparrow \\ \text{relative phase}}}{(-1)^{f(0) \oplus f(1)}} \right) | \rightarrow$$

# What works:

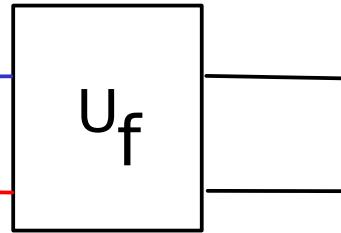
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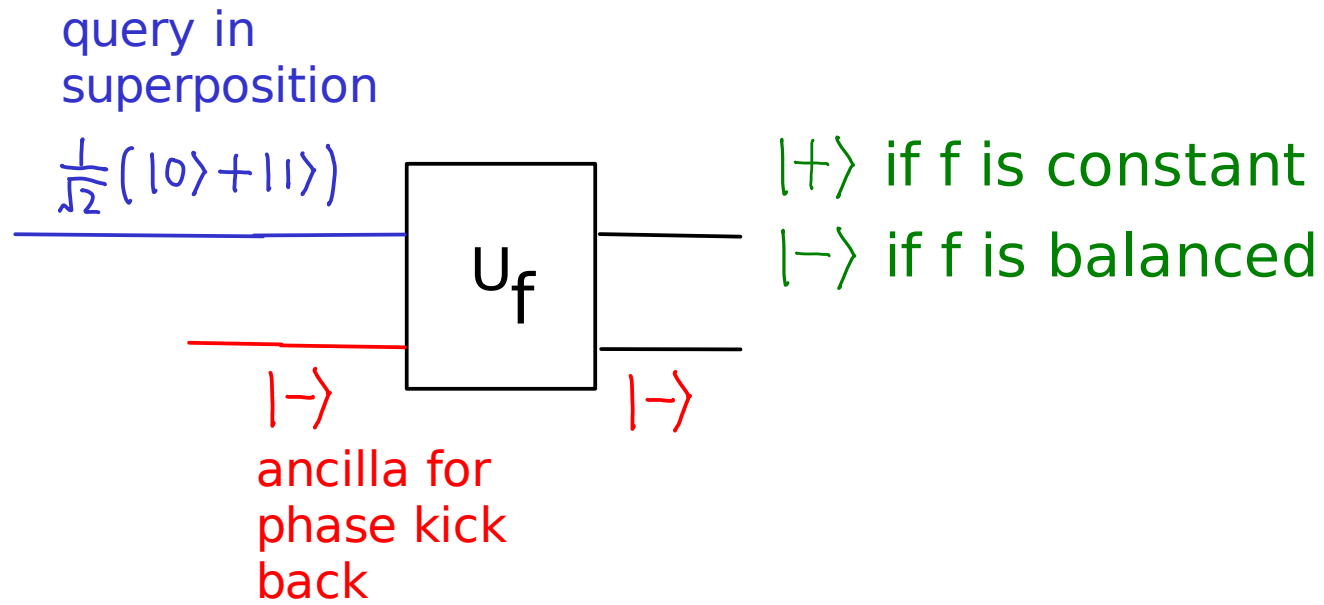
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$$= \underbrace{(-1)^{f(0)}}_{\substack{\uparrow \\ \text{overall phase}}} \frac{1}{\sqrt{2}} \left( |0\rangle + |1\rangle \right) \underbrace{(-1)^{f(0) \oplus f(1)}}_{\substack{\uparrow \\ \text{relative phase}}} |-\rangle$$

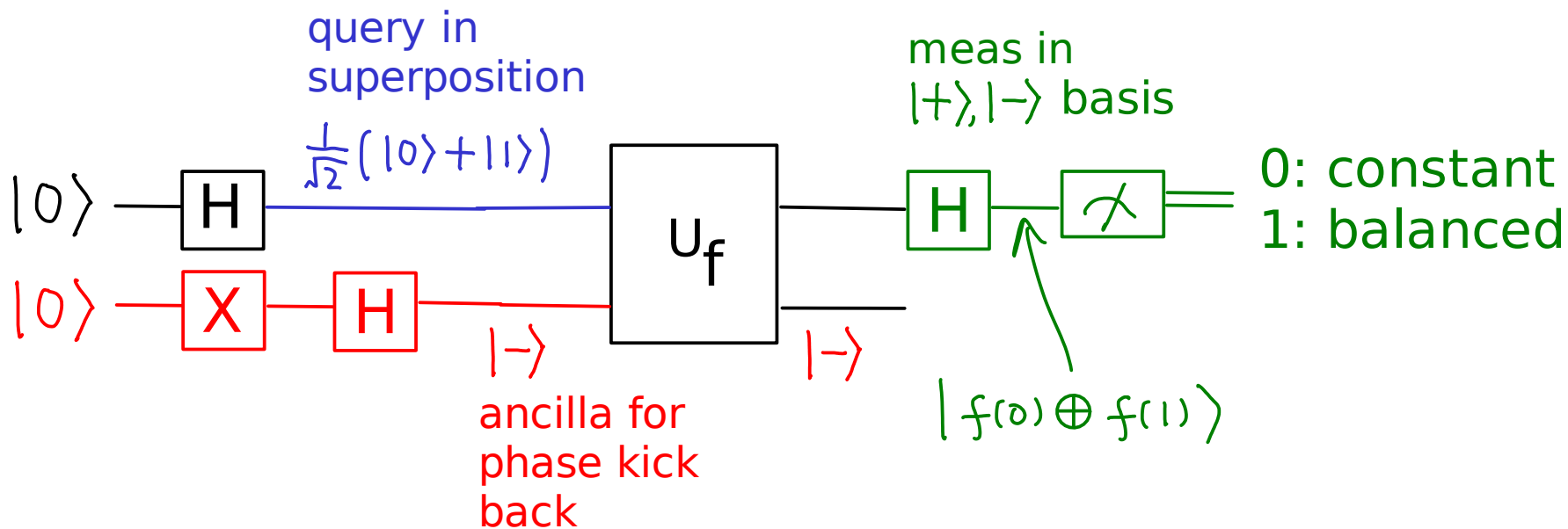
$$= \begin{cases} |+\rangle |-\rangle & \text{if } f \text{ is constant} \\ |-\rangle |-\rangle & \text{if } f \text{ is balanced} \end{cases}$$

perfectly distinguishable!

# The black box:

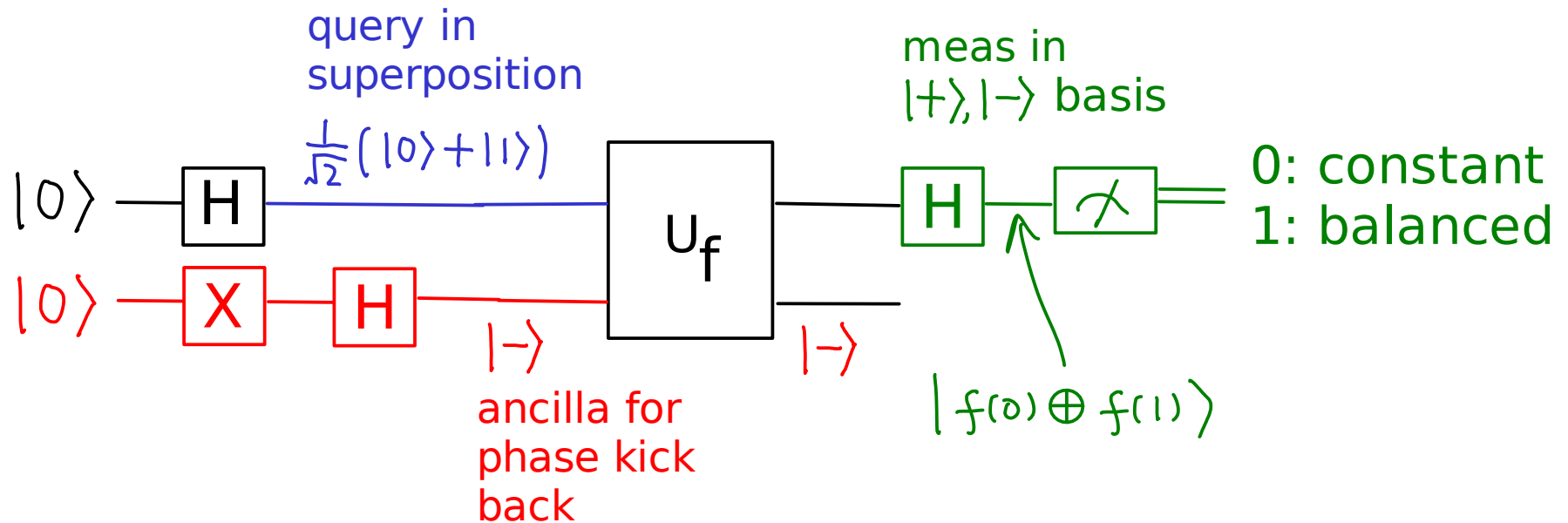


# The complete circuit:



Recall:  $H = \frac{1}{\sqrt{2}} \begin{bmatrix} 1 & 1 \\ 1 & -1 \end{bmatrix}$ ,  $H|0\rangle = \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle)$ ,  $H|1\rangle = \frac{1}{\sqrt{2}}(|0\rangle - |1\rangle)$ .

## The complete circuit:



The relative phase (quantum interference) carries a global property of  $f$  which is mapped by the final H to something measurable in the computational basis !

## Deutsch-Josza Problem

Given: a black box for a function  $f : \{0,1\}^n \rightarrow \{0,1\}$

Promise (partial information about  $f$ ):

$f$  is either constant

or balanced (half of the  $f(x)$ 's = 0)

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e.g.,  $n=3$ , a balanced function is

$f(000) = 0$	$f(100) = 1$
$f(001) = 0$	$f(101) = 1$
$f(010) = 1$	$f(110) = 1$
$f(011) = 0$	$f(111) = 0$

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Problem: Is  $f$  constant or balanced?

Question:

Classically, how many queries are needed to solve the D-J problem for the worst  $f$  deterministically ?

- (a) 2      (b)  $2^{n-1}$       (c)  $2^{n-1} + 1$       (d)  $2^n$



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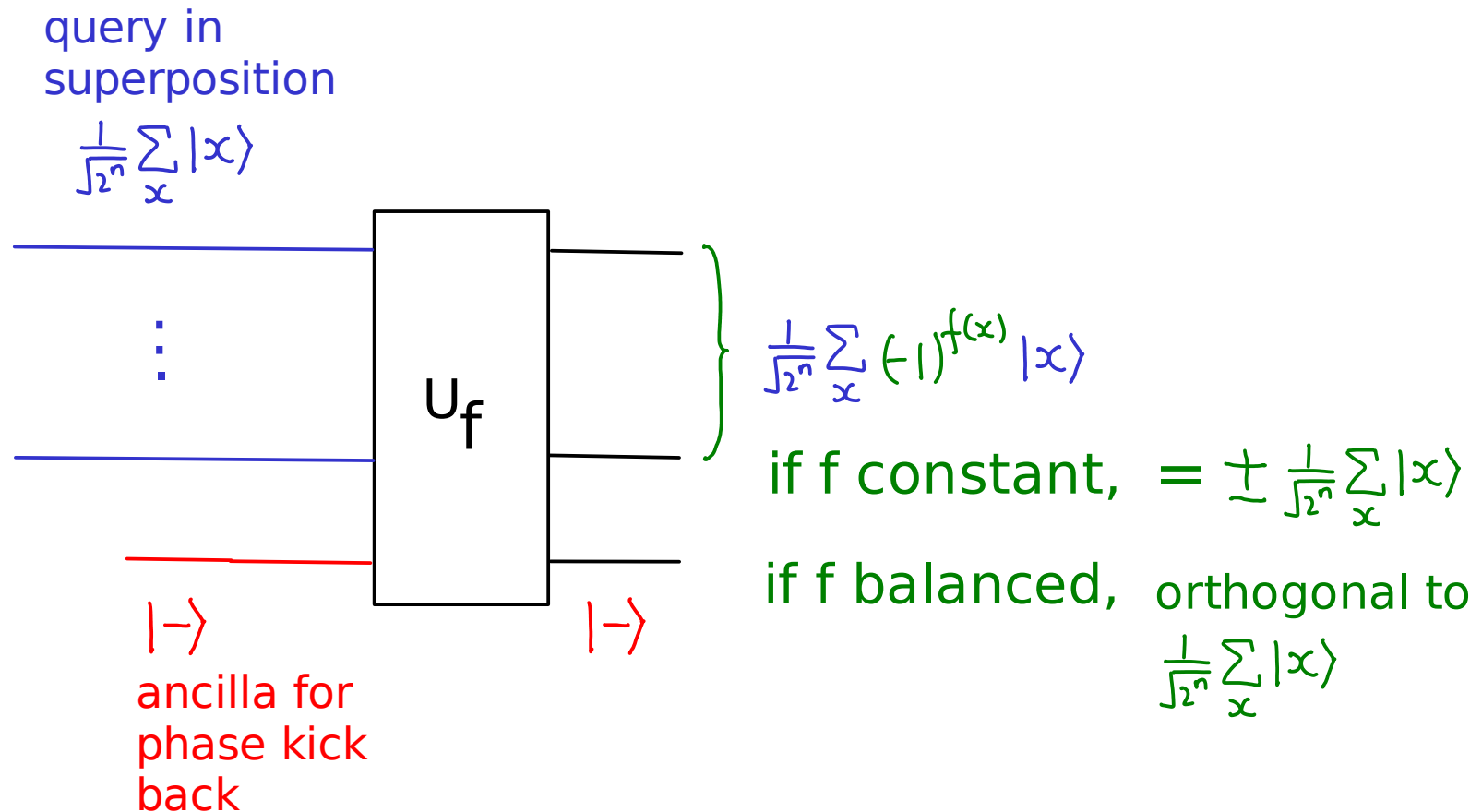
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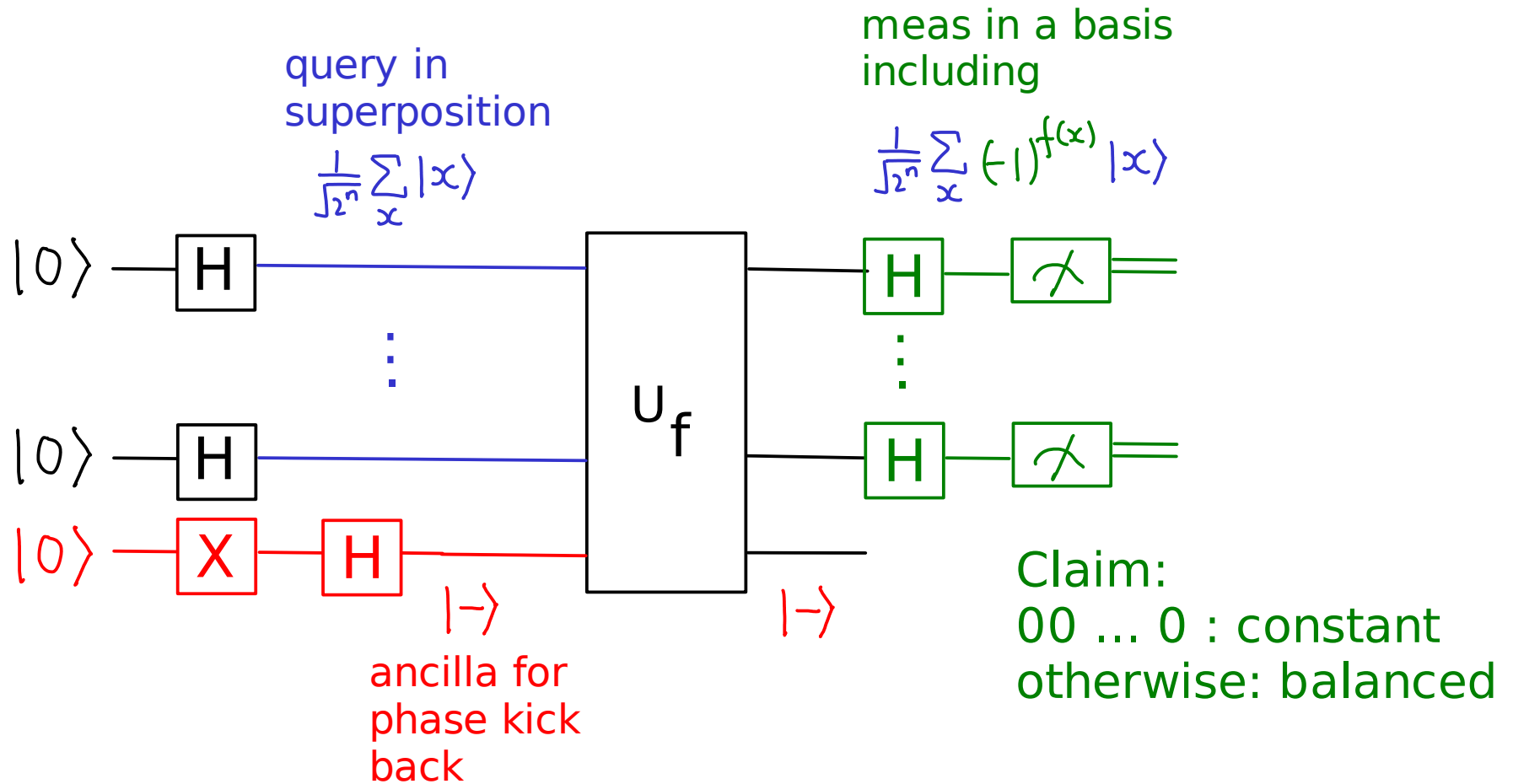
Quantumly, 1 query suffices!

## The black box:



Suffices to prepare query and ancilla, and design a measurement to distinguish the two possibilities.

# The complete circuit:



Analysis: (checking that the circuit works)

1. Initialize input in superposition & ancilla :

$$|0\rangle^{\otimes n} |0\rangle \xrightarrow{H^{\otimes n} \otimes HX} \frac{1}{\sqrt{2^n}} \sum_x |x\rangle |-\rangle$$

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2. Apply blackbox with phase kick back:

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3. Apply Hadamard to "first register" (first n qubits):

$$\frac{1}{\sqrt{2^n}} \sum_x |x\rangle (-1)^{f(x)} \xrightarrow{H^{\otimes n}} \frac{1}{2^n} \sum_x \sum_y |y\rangle (-1)^{x \cdot y} (-1)^{f(x)}$$

derived next page 

## The Fourier transform:

For 1 qubit:  $H|x\rangle = \frac{1}{\sqrt{2}} (|0\rangle + (-1)^x |1\rangle) = \frac{1}{\sqrt{2}} \sum_{y \in \{0,1\}} (-1)^{x \cdot y} |y\rangle$



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$$\begin{aligned} \text{For } n \text{ qubits: } H^{\otimes n} |x_1 x_2 \dots x_n\rangle \\ = (H|x_1\rangle) \otimes (H|x_2\rangle) \dots \otimes (H|x_n\rangle) \end{aligned}$$

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$$= \frac{1}{\sqrt{2^n}} \sum_{y_1, y_2, \dots, y_n \in \{0,1\}^n} (-1)^{x_1 y_1 + x_2 y_2 + \dots + x_n y_n} |y_1 y_2 \dots y_n\rangle$$

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where  $x = x_1 x_2 \dots x_n$ ,  $y = y_1 y_2 \dots y_n$ .

3. Apply Hadamard to "first register" (first n qubits):

$$\begin{aligned} \frac{1}{\sqrt{2^n}} \sum_x |x\rangle (-1)^{f(x)} &\xrightarrow{H^{\otimes n}} \frac{1}{2^n} \sum_x \sum_y |y\rangle (-1)^{x \cdot y} (-1)^{f(x)} \\ &= \frac{1}{2^n} \sum_y \sum_x (-1)^{x \cdot y} (-1)^{f(x)} |y\rangle \end{aligned}$$

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If f constant,  $(-1)^{f(x)} = c$ ,

$$\sum_x (-1)^{x \cdot y} (-1)^{f(x)} = c \sum_x (-1)^{x \cdot y} = c \begin{cases} 2^n & \text{if } y = 00\dots 0 \\ 0 & \text{otherwise} \end{cases}$$

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If  $f$  balanced,  $y = 00\dots 0$ ,

$$\sum_x (-1)^{x \cdot y} (-1)^{f(x)} = \sum_x (-1)^{f(x)} = 0.$$

$\therefore \sum_x (-1)^{x \cdot y} (-1)^{f(x)} \begin{cases} \text{nonzero only for } y=0 \text{ if } f \text{ constant} \\ \text{zero for } y=0 \text{ if } f \text{ balanced} \end{cases}$



4. Measure first register in computational basis:

$$\frac{1}{2^n} \sum_y \sum_x (-1)^{x \cdot y} (-1)^{f(x)} |y\rangle \longrightarrow \begin{array}{l} y=0 \text{ if } f \text{ constant} \\ y \neq 0 \text{ if } f \text{ balanced} \end{array}$$

nonzero only for  $y=0$  if  $f$  constant, outcome  $y=0$  always  
zero for  $y=0$  if  $f$  balanced, outcome never being  $y=0$ .

So, circuit works and 1 query suffices !

You saw the first exponential separation between quantum and classical computation, in the blackbox model if the answer must be correct.

If we allow a small error, classically, a constant # of queries suffices.

We will see more algorithms revolving about the Fourier transform, and the advantage will be over BPP, and eventually outside of the blackbox model.

The Deutsch problem with solution was first proposed by Deutsch in 1985. In 1992, it was extended to the Deutsch-Jozsa problem and algorithm.

The algorithm you saw today is an improved version from Cleve, Ekert, Macchiavello, and Mosca 1998, and independently, by Tapp.