



APPROXIMATE SPAN PROGRAMS

NEW TECHNIQUES FOR DESIGNING QUANTUM ALGORITHMS

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a span program

P



A_P

a quantum algorithm for f_P

a span program



A_P

a quantum algorithm for f_P

Does x satisfy f_P ?

USING APPROXIMATE SPAN PROGRAMS:



$A_{P,\lambda}$

a quantum algorithm for $f_{P,\lambda}$

Is x “close to” satisfying f_P
or “far from” satisfying f_P ?

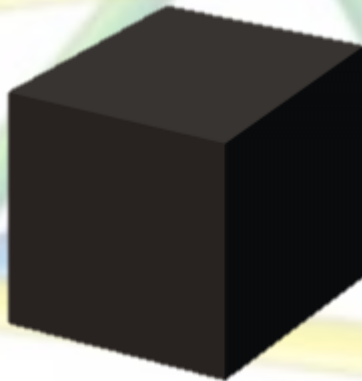


Est_P

a quantum algorithm
for estimating w_P

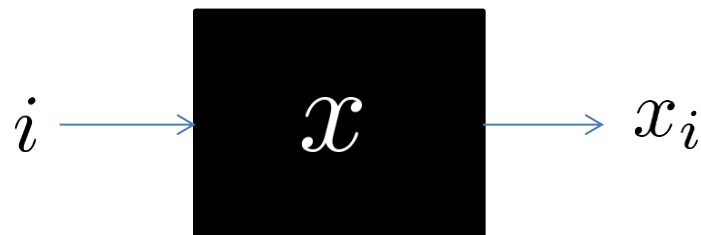
“How much” does x satisfy f_P ?

QUANTUM QUERY COMPLEXITY



QUANTUM QUERY COMPLEXITY

$$x \in \{0, 1\}^n$$



quantum query complexity of an algorithm:

$$Q(\mathcal{A}) = \text{number of oracle calls made by } \mathcal{A}$$

(bounded error) quantum query complexity of a function:

$$Q(f) = \text{minimum } Q(\mathcal{A}) \text{ over all bounded error algorithms for } f, \mathcal{A}$$

bounded error: for any input, algorithm must be correct with probability $\geq \frac{2}{3}$



SPAN PROGRAMS

SPAN PROGRAMS

$$x, y \in \{0, 1\}^n$$

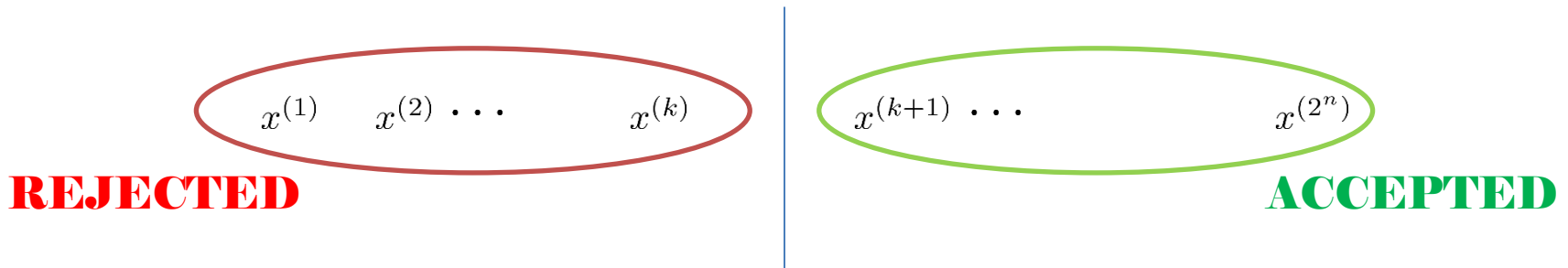
$V(y)$
REJECTED

$V(x)$
ACCEPTED

$\vec{\tau}$

SPAN PROGRAMS

$$\{0, 1\}^n = \{x^{(1)}, \dots, x^{(2^n)}\}$$



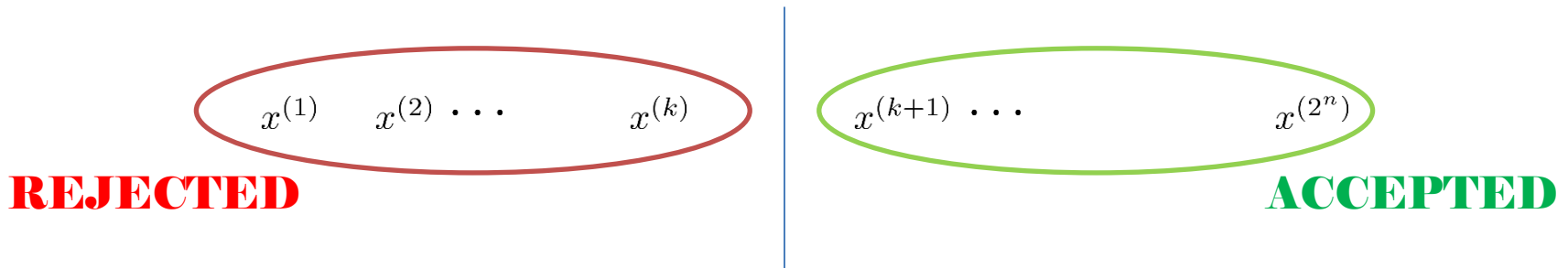
$$f_P(x) = \begin{cases} 1 & \text{if } x \text{ is accepted by the span program} \\ 0 & \text{if } x \text{ is rejected by the span program} \end{cases}$$

The span program decides f_P .

Theorem: For any span program P , there is a quantum algorithm that decides f_P in query complexity equal to the *span program complexity*. [Reichardt '09]

SPAN PROGRAMS

$$\{0, 1\}^n = \{x^{(1)}, \dots, x^{(2^n)}\}$$



x is accepted $\Leftrightarrow x$ has a positive witness \vec{w}

positive witness size of x : $w_+(x) = \min_{\vec{w}} \|\vec{w}\|^2$

x is rejected $\Leftrightarrow x$ has a negative witness \vec{v}

negative witness size of x : $w_-(x) = \min_{\vec{v}} \|\vec{v}\|^2$

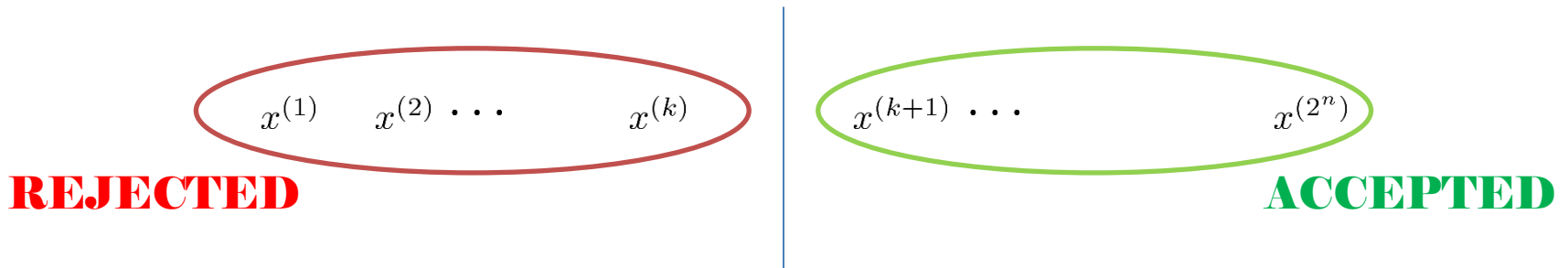
$$W_+ = \max_x w_+(x)$$

$$W_- = \max_x w_-(x)$$

Theorem: For any span program P , there is a quantum algorithm that decides f_P in query complexity equal to the *span program complexity*. [Reichardt '09]

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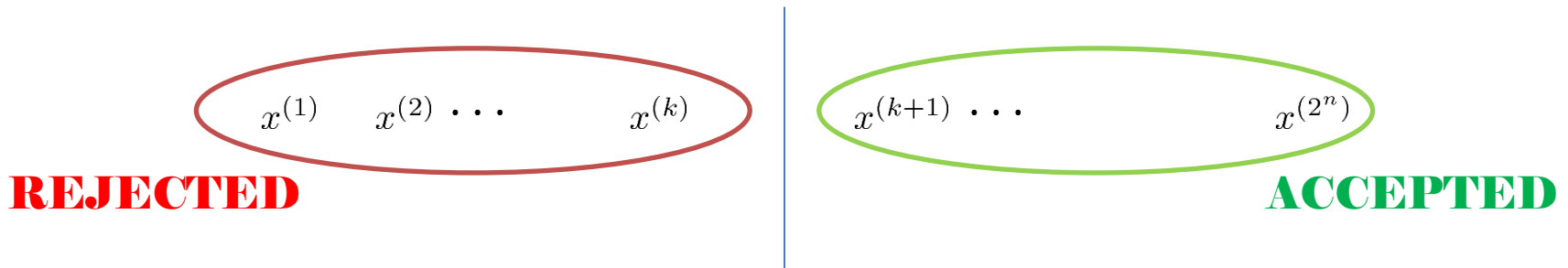
$$W_- = \max_x w_-(x)$$

Theorem: For any span program P , there is a quantum algorithm that decides f_P in query complexity equal to $O(\sqrt{W_+ W_-})$.

[Reichardt '09]

SPAN PROGRAMS

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$$D \subseteq \{0, 1\}^n \quad W_+ = \max_{x \in D} w_+(x) \quad W_- = \max_{x \in D} w_-(x)$$

Theorem: For any span program P , there is a quantum algorithm that decides $f_P|_D$ in query complexity equal to $O(\sqrt{W_+ W_-})$.

[Reichardt '09]

EXAMPLE: OR

$$\{0, 1\}^n = \{x^{(1)}, \dots, x^{(2^n)}\}$$

000...0

REJECTED

000...01

...

111...1

ACCEPTED

x is accepted $\Leftrightarrow x$ has a positive witness \vec{w}

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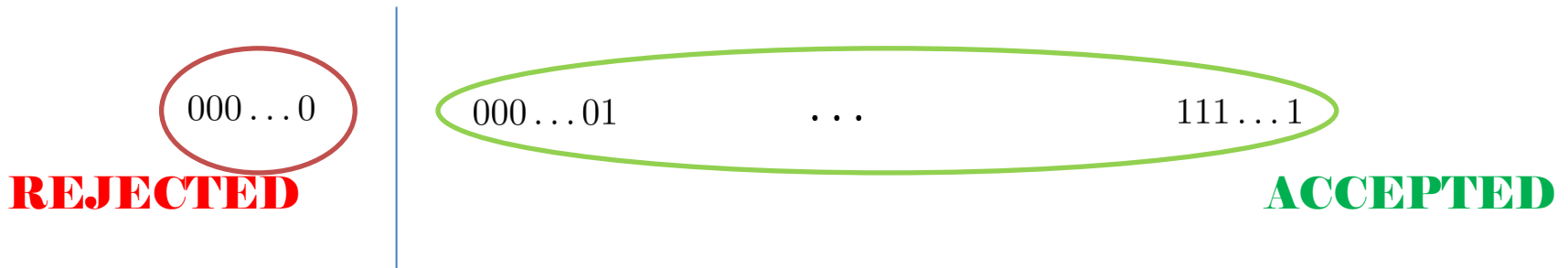
negative witness size of x : $w_-(x) = \min_{\vec{v}} \|\vec{v}\|^2$

$$W_+ = \max_x w_+(x)$$

$$W_- = \max_x w_-(x)$$

EXAMPLE: OR

$$\{0, 1\}^n = \{x^{(1)}, \dots, x^{(2^n)}\}$$



x is accepted $\Leftrightarrow x$ has a positive witness \vec{w}

positive witness size of x : $w_+(x) = \frac{1}{|x|}$

x is rejected $\Leftrightarrow x$ has a negative witness \vec{v}

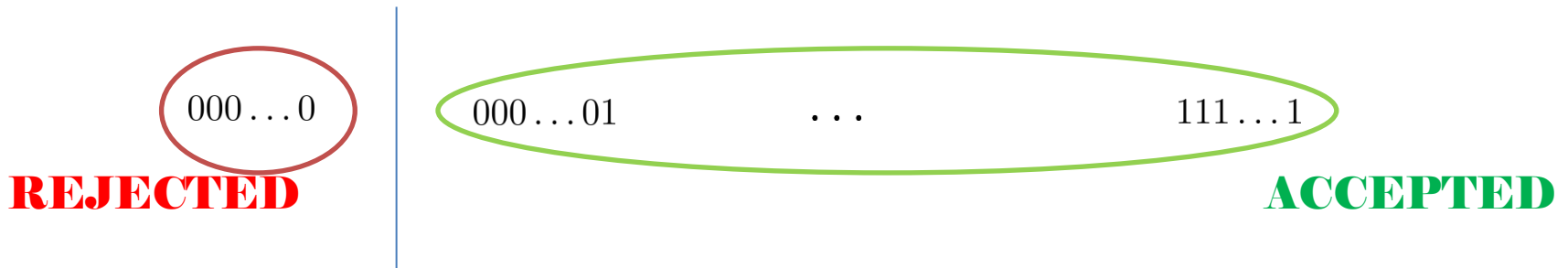
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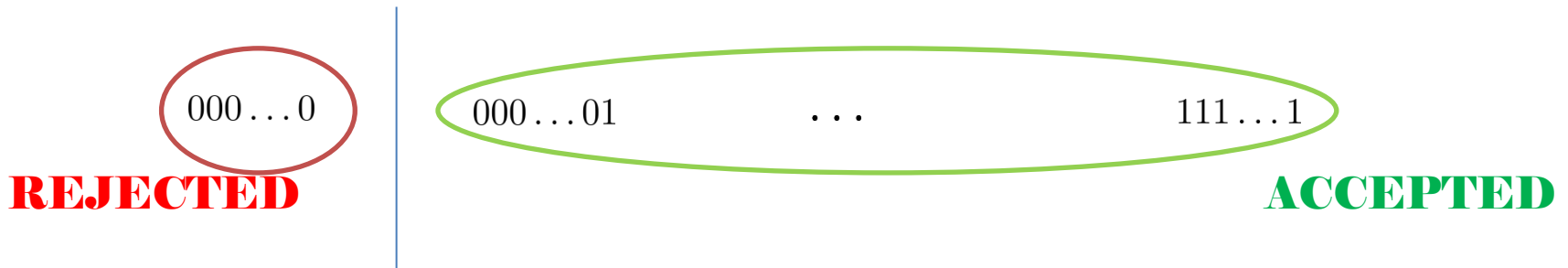
negative witness size of x : $w_-(x) = n$

$$W_+ = \max_x w_+(x)$$

$$W_- = \max_x w_-(x)$$

EXAMPLE: OR

$$\{0, 1\}^n = \{x^{(1)}, \dots, x^{(2^n)}\}$$



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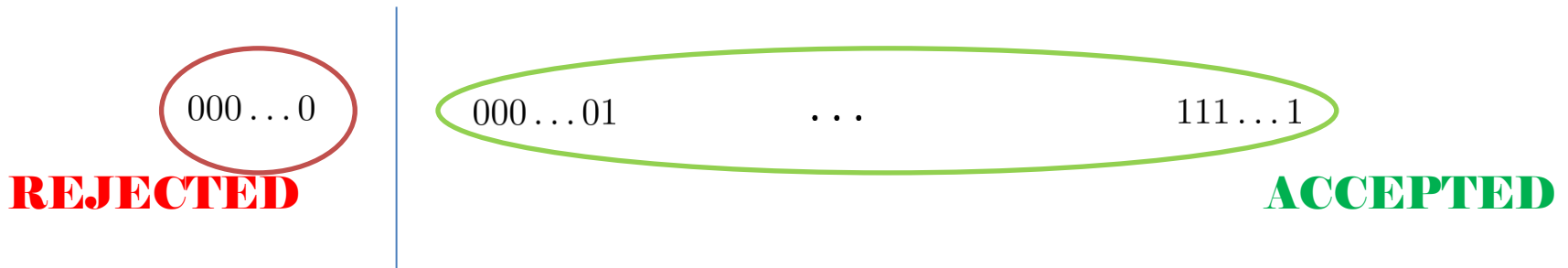
x is rejected $\Leftrightarrow x$ has a negative witness \vec{v}

negative witness size of x : $w_-(x) = n$

$$W_+ = \max_x w_+(x) = 1 \quad W_- = \max_x w_-(x)$$

EXAMPLE: OR

$$\{0, 1\}^n = \{x^{(1)}, \dots, x^{(2^n)}\}$$



x is accepted $\Leftrightarrow x$ has a positive witness \vec{w}

positive witness size of x : $w_+(x) = \frac{1}{|x|}$

x is rejected $\Leftrightarrow x$ has a negative witness \vec{v}

negative witness size of x : $w_-(x) = n$

$$W_+ = \max_x w_+(x) = 1 \quad W_- = \max_x w_-(x) = n$$

Span program complexity: $\sqrt{W_+ W_-} = \sqrt{n}$

SPAN PROGRAMS = BOUNDED ERROR QUANTUM QUERY COMPLEXITY

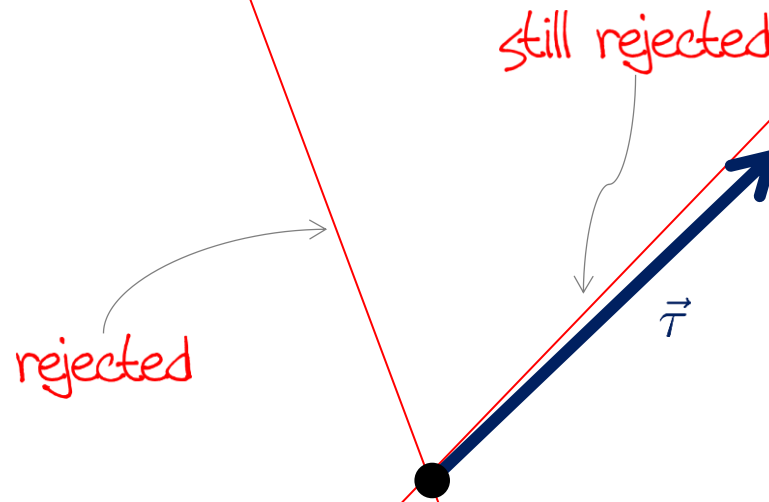
For any decision problem f :

minimum complexity of a
span program that decides f

=

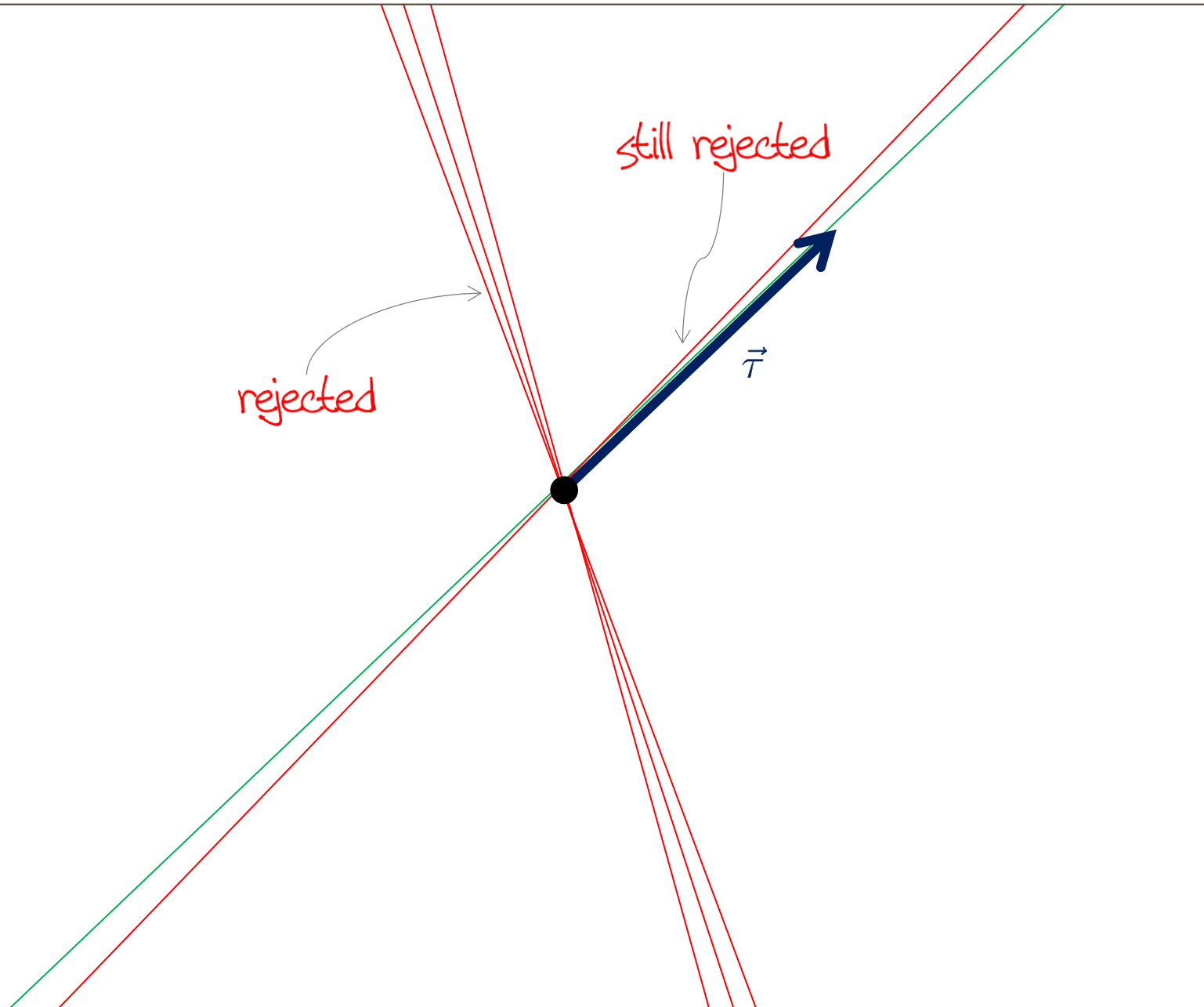
bounded error
quantum query complexity of f

EXACTNESS OF SPAN PROGRAMS



Problem: Span programs want us to **exactly** hit a target.
Quantum algorithms just want us to get **close**.

EXACTNESS OF SPAN PROGRAMS



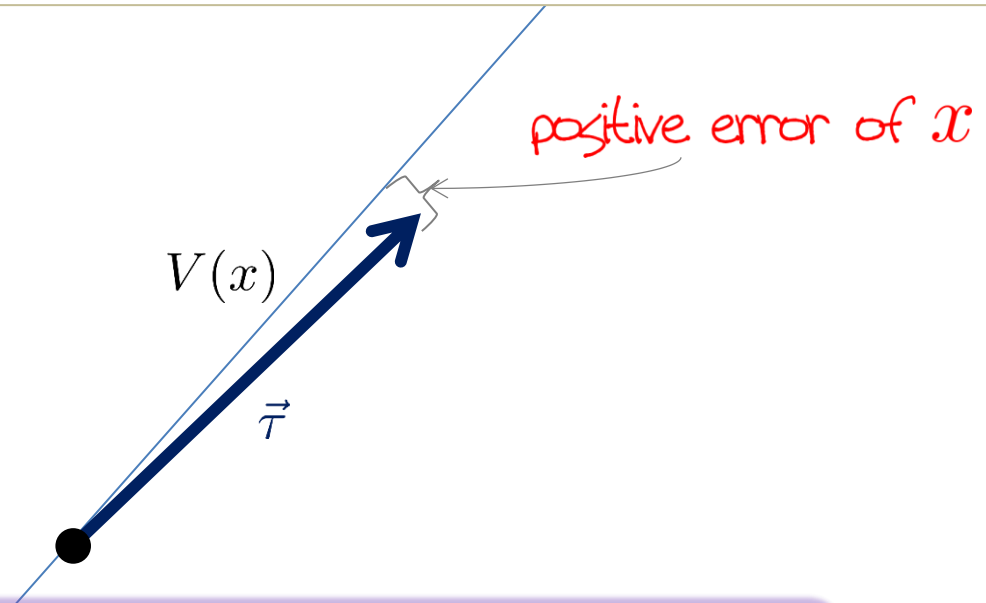


APPROXIMATE SPAN PROGRAMS

APPROXIMATE SPAN PROGRAMS

Regime 1: span program **accepts** x if $V(x)$ is **close** to the target
i.e., accept if x has **small positive error**

Regime 2: span program **rejects** x if x has **small negative error**



When should we say that a span program accepts an input?

APPROXIMATE SPAN PROGRAMS

Regime 1: span program **accepts** x if $V(x)$ is **close** to the target

i.e., accept if x has **small positive error**

\Leftrightarrow Only reject if x has a small negative witness

Regime 2: span program **rejects** x if x has **small negative error**

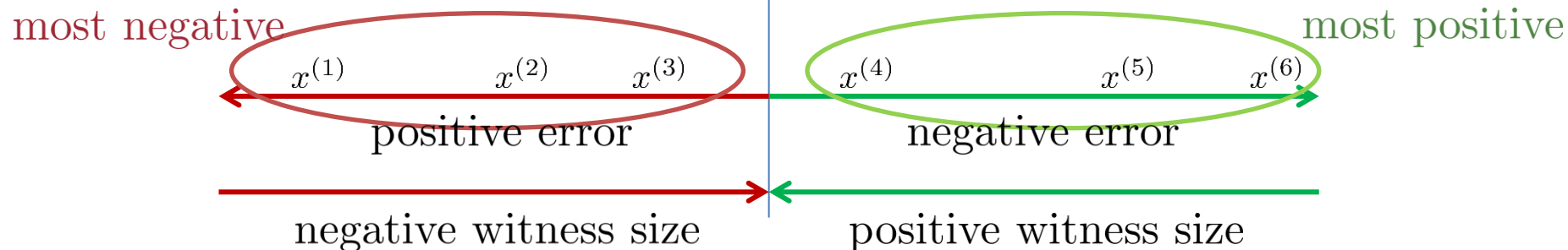
\Leftrightarrow Only accept if x has a small positive witness

Theorem: positive **error** of $x = \frac{1}{w_-(x) = \text{negative witness size of } x}$

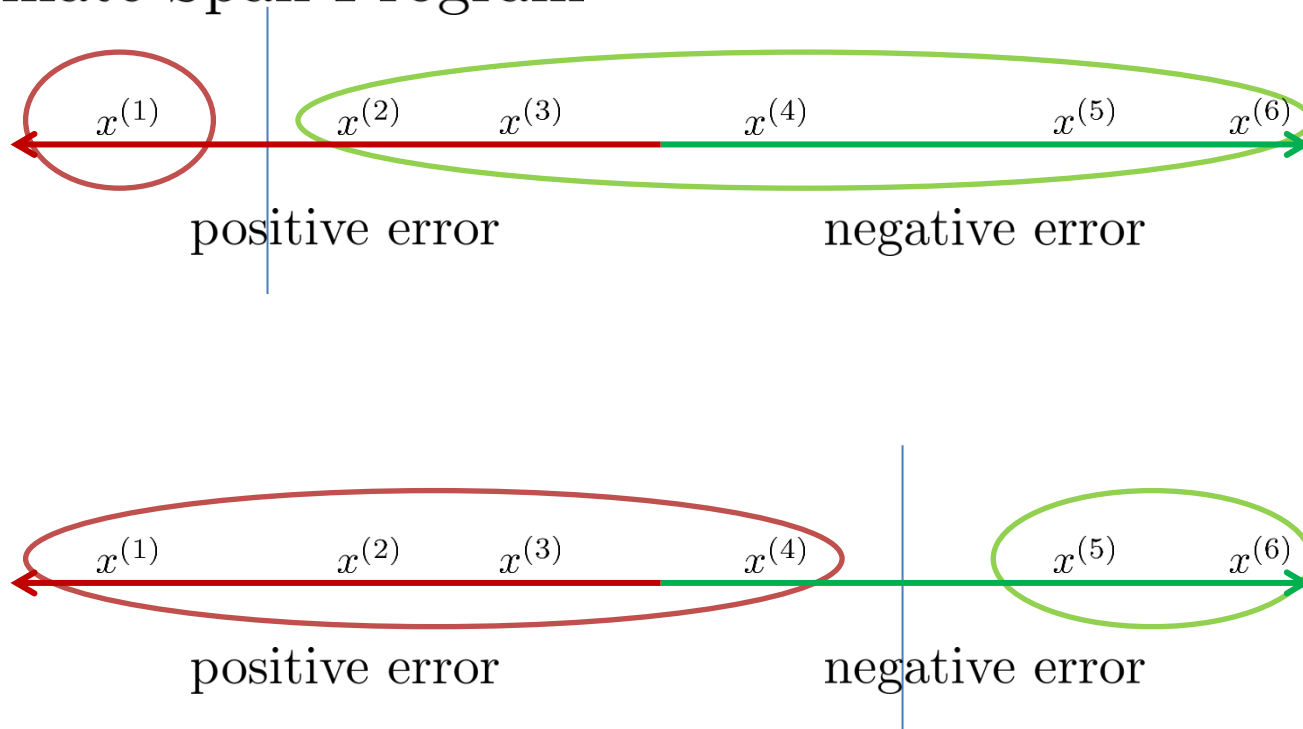
negative **error** of $x = \frac{1}{w_+(x) = \text{positive witness size of } x}$

APPROXIMATE SPAN PROGRAMS

Exact Span Program



Approximate Span Program



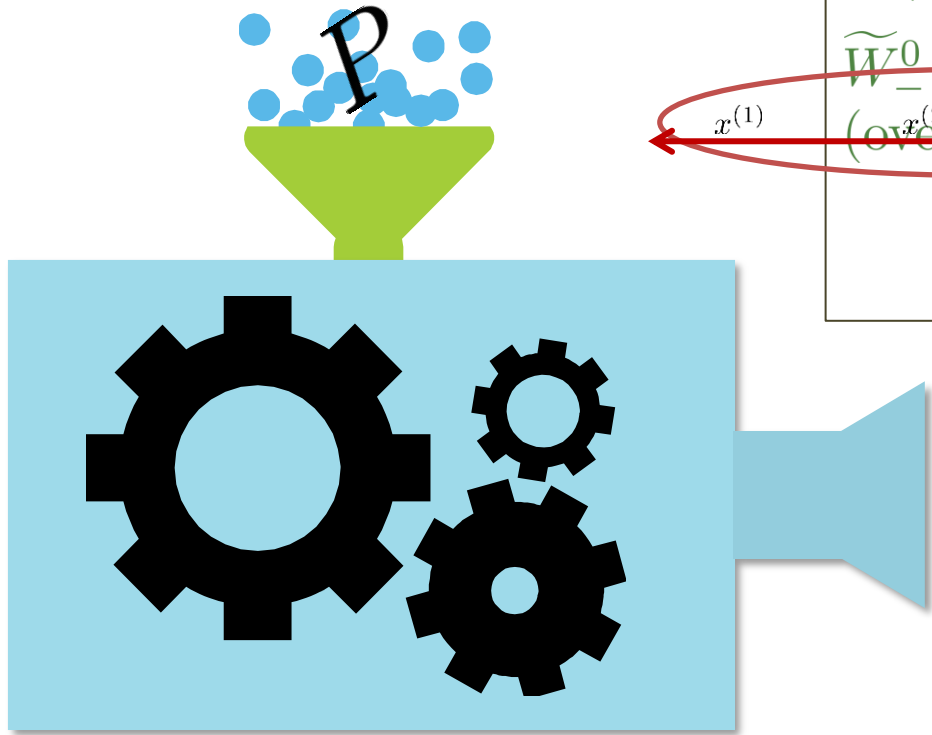
APPROXIMATE SPAN PROGRAM ALGORITHM

A span program **approximates** f if $\frac{\max_{x:f(x)=1} w_+(x)}{\min_{x:f(x)=0} w_+(x)} < \lambda$ for constant $\lambda < 1$.

Span program that approximates f with complexity C_f



Quantum algorithm for f with query complexity C_f



$$W_+^1 = \max_{x:f(x)=1} w_+(x)$$

$$\widetilde{W}_-^0 = \max_{x:f(x)=0} \tilde{w}_-(x)$$

(over min error negative witnesses)

$$C_f = \sqrt{W_+^1 \frac{1/w_+(x)}{W_-^0} \frac{1}{(1-\lambda)^{3/2}}}$$



A quantum algorithm for f with query complexity C_f

EXAMPLE: GAPPED t -THRESHOLD

$$f(x) = \begin{cases} 1 & \text{if } |x| \geq t \\ 0 & \text{if } |x| \leq t/2 \end{cases}$$

Recall from the span program for OR: $w_+(x) = \frac{1}{|x|}$ $w_-(x) = n$

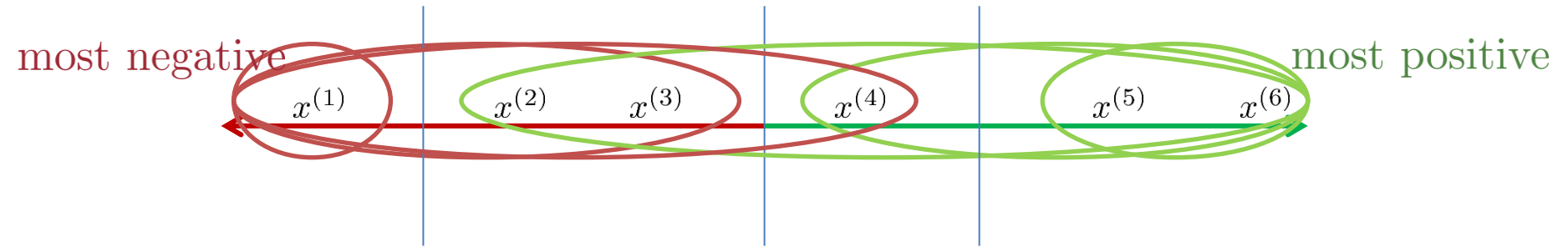
$$\frac{\max_{x:f(x)=1} w_+(x)}{\min_{x:f(x)=0} w_+(x)} = \frac{\max_{x:|x|\geq t} w_+(x)}{\min_{x:|x|\leq t/2} w_+(x)} = \frac{1}{2}$$

$$W_+^1 := \max_{x:f(x)=1} w_+(x) = \max_{x:|x|\geq t} \frac{1}{|x|} = \frac{1}{t}$$

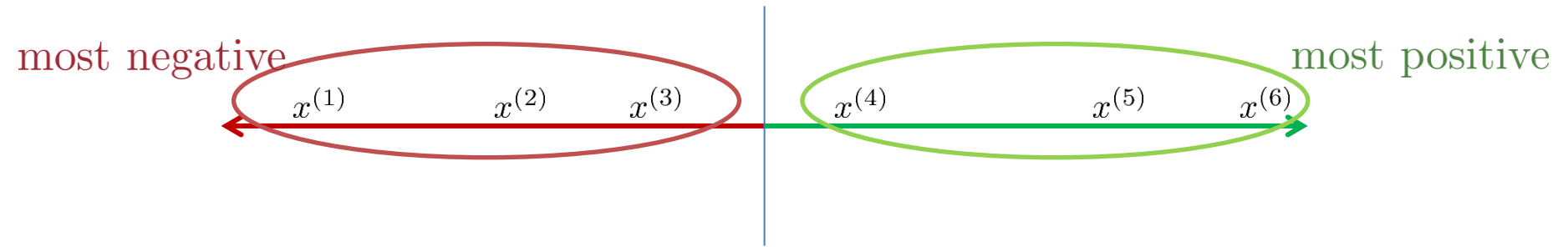
$$\widetilde{W}_-^0 := \max_{x:f(x)=0} \widetilde{w}_-(x) = n$$

$$C_f = \sqrt{W_+^1 \widetilde{W}_-^0} = \sqrt{n/t}$$

APPROXIMATE SPAN PROGRAMS

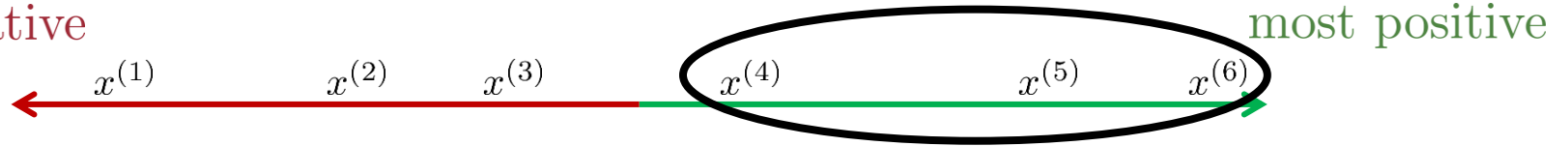


APPROXIMATE SPAN PROGRAMS

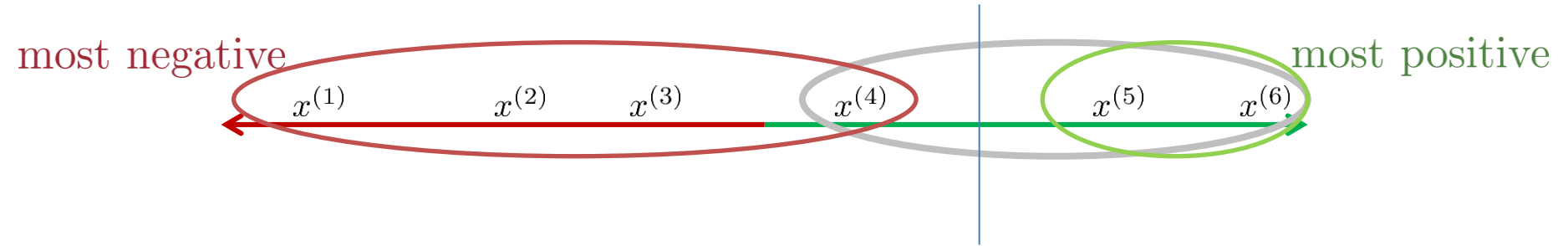


APPROXIMATE SPAN PROGRAMS

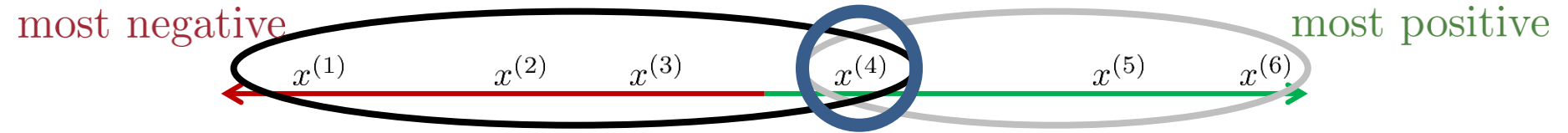
most negative



APPROXIMATE SPAN PROGRAMS



APPROXIMATE SPAN PROGRAMS



ESTIMATING THE WITNESS SIZE

Span program



Quantum algorithm for estimating $w_+(x)$ with query complexity $O\left(\frac{1}{\varepsilon^{3/2}} \sqrt{w_+(x) \widetilde{W}_-}\right)$



Est quantum algorithm for estimating $w_+(x)$

EXAMPLE: ESTIMATING $|x|$

Recall from the span program for OR: $w_+(x) = \frac{1}{|x|}$ $\widetilde{W}_-^0 = n$

Quantum query complexity of estimating $|x|$:

$$\frac{1}{\varepsilon^{3/2}} \sqrt{w_+(x) \widetilde{W}_-} = \frac{1}{\varepsilon^{3/2}} \sqrt{\frac{n}{|x|}}$$

not optimal

NEW APPLICATION: EFFECTIVE RESISTANCE

Input: G , a graph on $[n]$; $s, t \in [n]$

Effective resistance between s and t in G : $R_{s,t}(G) = \min_{\theta} \sum_{e \in E(G)} \theta(e)^2$
over unit flows with source s and sink t

Quantum query complexity of estimating $R_{s,t}$: $O\left(\frac{1}{\varepsilon^{3/2}} n \sqrt{R_{s,t}(G)}\right)$

Quantum query complexity est. $R_{s,t}$ when $\lambda_2(G) \geq \mu$: $O\left(\frac{1}{\varepsilon} n \sqrt{\frac{R_{s,t}(G)}{\mu}}\right)$

SUMMARY

- Span programs have been used to design quantum algorithms
- Span programs can be used to design quantum algorithms in two new ways:
 - 1) Larger class of decision problems for each span program
 - 2) Estimation problems
 - No longer restricted to decision problems
 - New applications to estimating effective resistance
- Further applications?

THANKS!