

# Modified phase estimation algorithm and its application

GEnKO Workshop at Nagoya

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- 2 — Quantum phase estimation algorithm
- 3 — Result: Modified phase estimation
- 4 — Application: HHL algorithm
- 5 — Conclusion

# 1. About Me

# **Yonghae Lee**



**Kyung Hee University(2002~2021)**

- BSc in Math(2002~2009)
- MSc in Math(2009~2011)
- PhD in Math(2012~2019)
- Research Fellow(2019~2021)



**KAIST(2021~2022)**

- Research Fellow

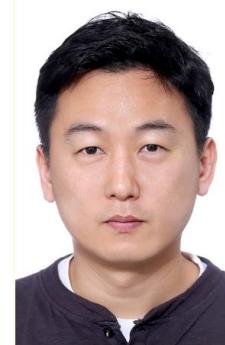
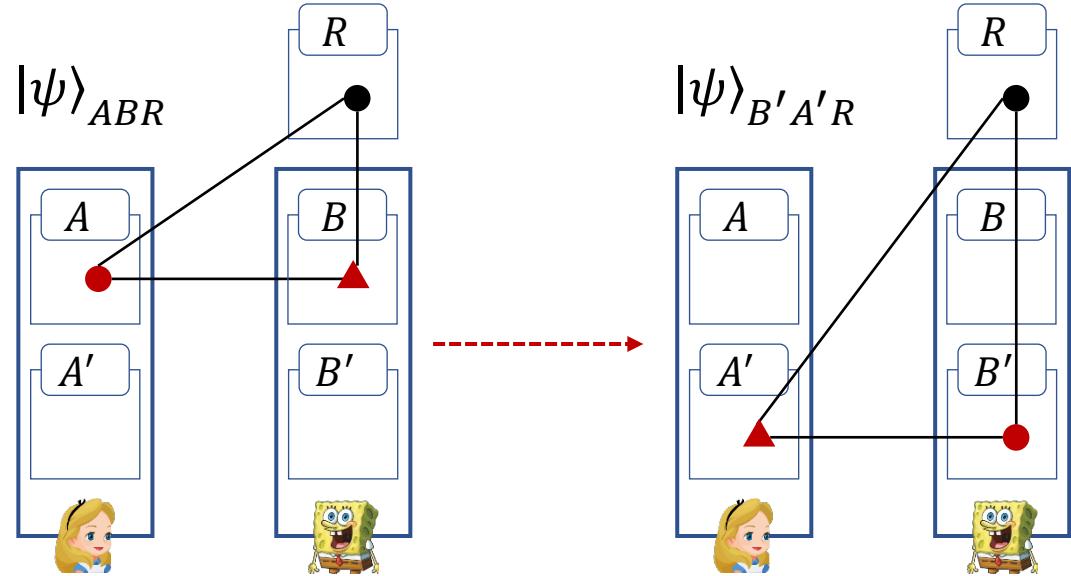


**Kangwon National University(2022~present )**

# Research topic

## Quantum state exchange

- Optimal entanglement cost for quantum state exchange task



[J. Oppenheim and A. Winter, arXiv:quant-ph/0511082 (2005)]

[Y. Lee, R. Takagi, H. Yamasaki, G. Adesso, and S. Lee, PRL 122, 010502 (2019)]

[Y. Lee, H. Yamasaki, G. Adesso, and S. Lee, PRA 100, 042306 (2019)]

[Y. Lee, H. Yamasaki, and S. Lee, PRA 103, 062613 (2021)]

## 2. Quantum phase estimation algorithm

# Estimation

$$\frac{1}{\sqrt{2}} = 0.10110101000001 \dots$$



Estimate!

$$\frac{1}{\sqrt{2}} \approx 0.1011$$

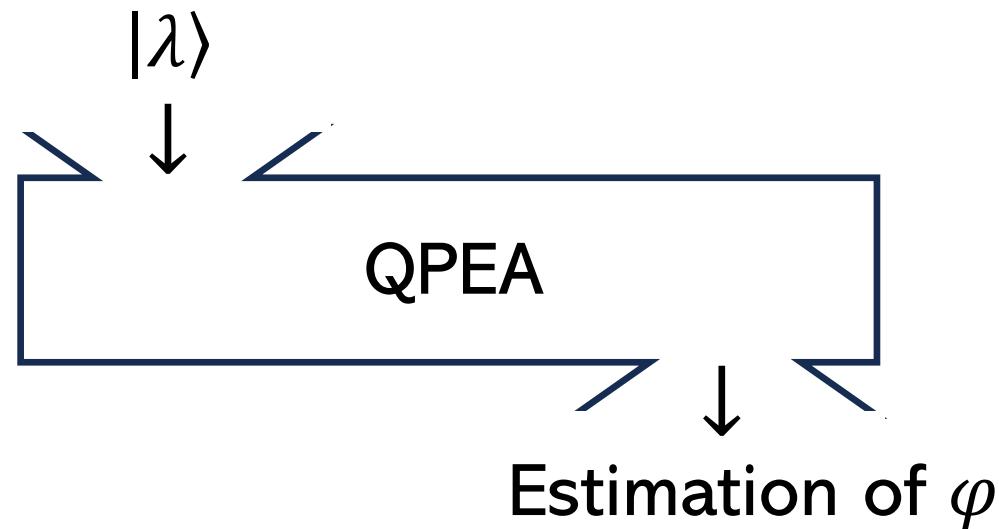
$$\left| \frac{1}{\sqrt{2}} - 0.1011 \right| \leq \frac{1}{2^5}$$

Error!

# Quantum phase estimation algorithm (QPEA)

$$U|\lambda\rangle = e^{2\pi i \varphi} |\lambda\rangle, \quad \varphi \in [0,1]$$

**QPEA estimates the phase corresponding to an eigenvalue of a given unitary operator.**

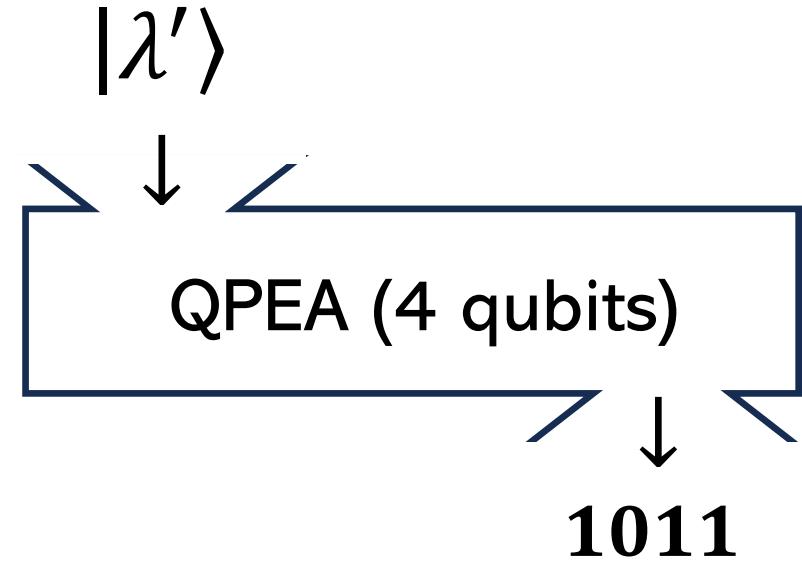


[A. Yu. Kitaev, arXiv:quant-ph/9511026 (1995)]

[Nielsen and Chuang, "Quantum computation and quantum information" (2001)]

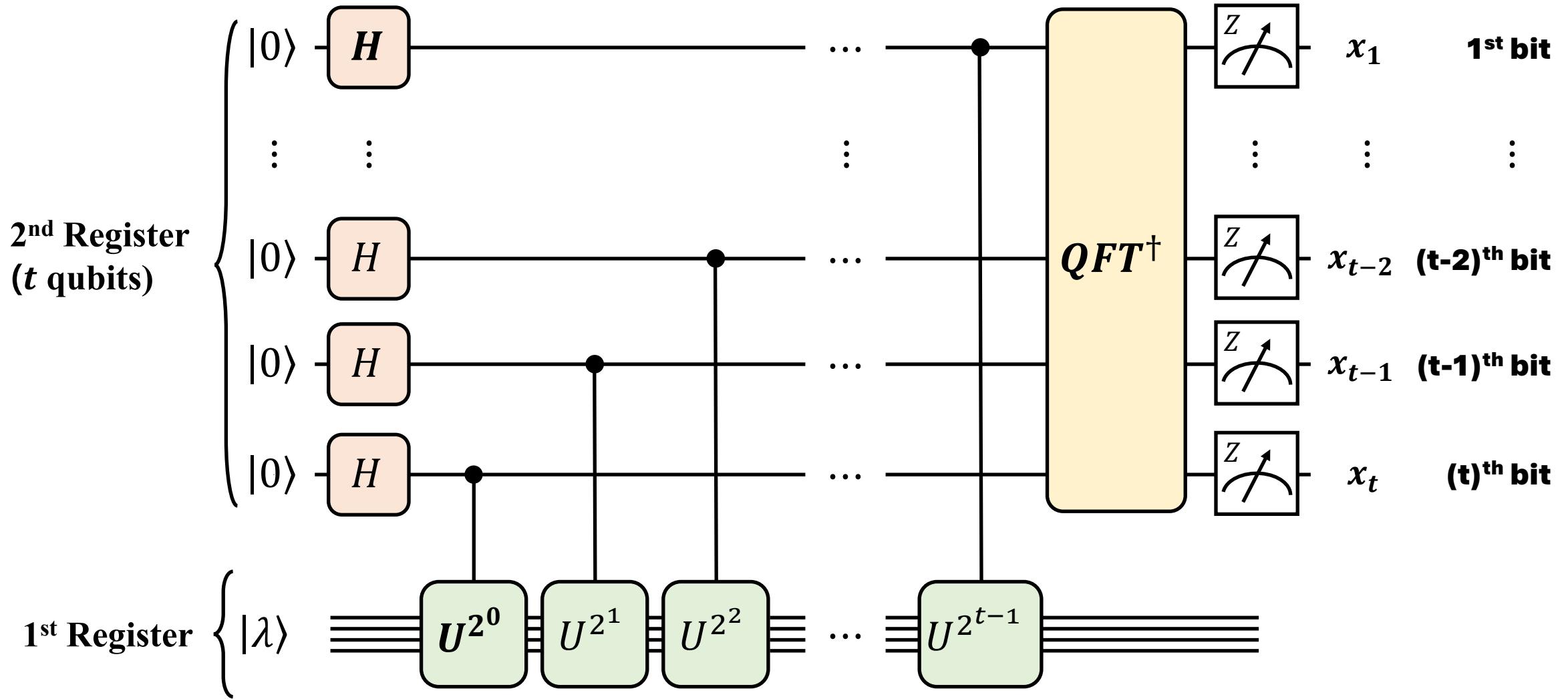
**Example:** Phase  $\frac{1}{\sqrt{2}}=0.10110\dots$

$$V|\lambda'\rangle = e^{2\pi i \left(\frac{1}{\sqrt{2}}\right)} |\lambda'\rangle,$$

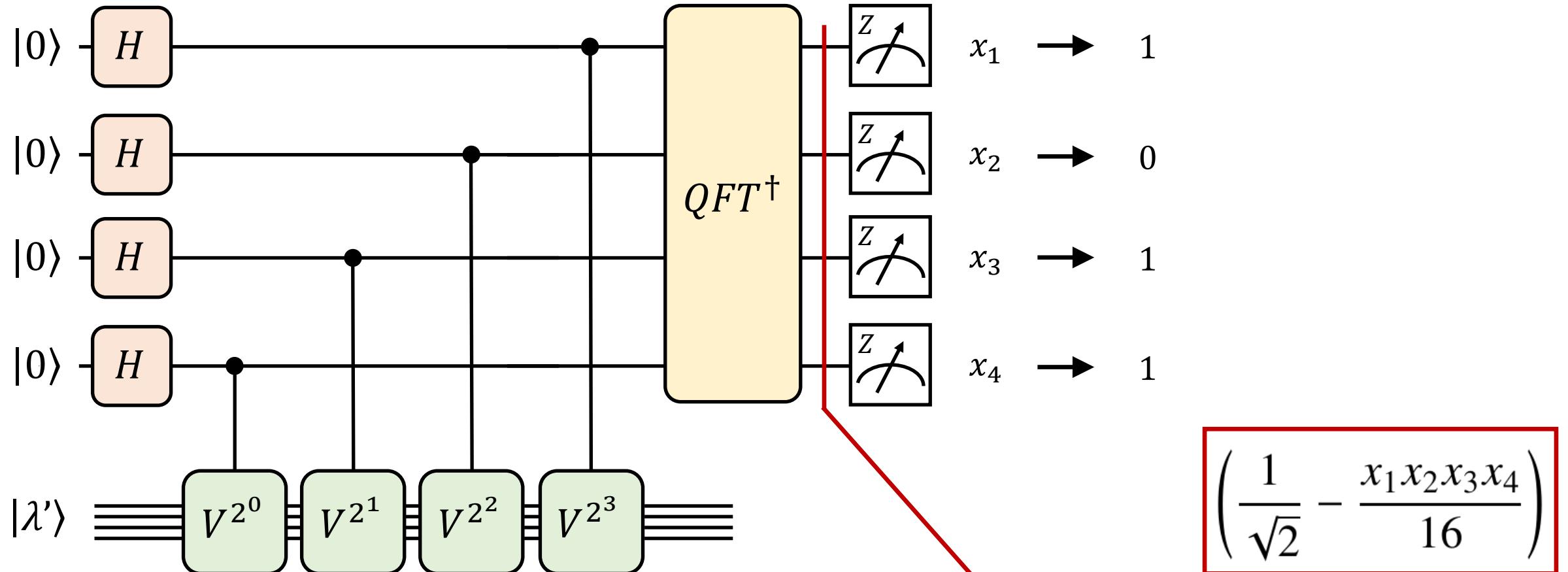


If you use 4 qubits for estimation, QPEA outputs measurement outcomes 1011

# Circuit for QPEA



# Example: Phase $\frac{1}{\sqrt{2}}=0.10110\dots$



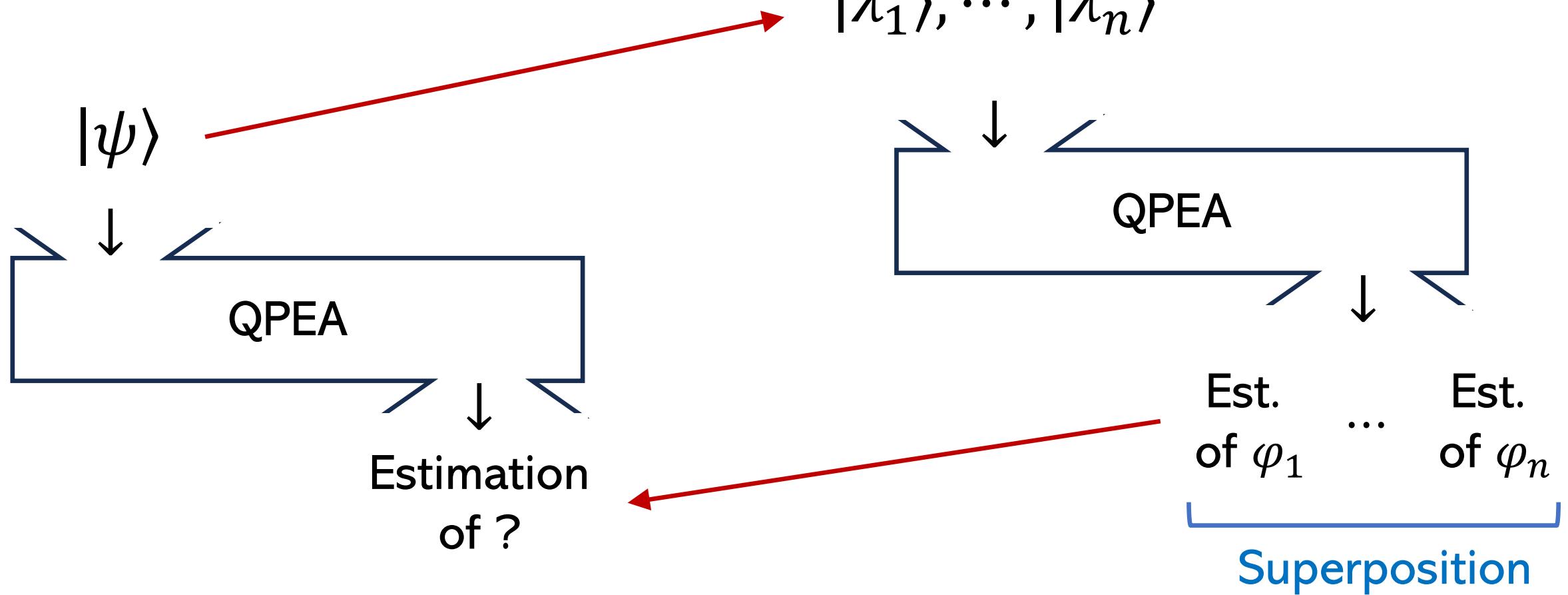
$$V|\lambda'\rangle = e^{2\pi i \left(\frac{1}{\sqrt{2}}\right)} |\lambda'\rangle,$$

$$\frac{1}{16} \sum_{x_1=0}^1 \sum_{x_2=0}^1 \sum_{x_3=0}^1 \sum_{x_4=0}^1 \sum_{y=0}^{15} e^{2\pi i \left( \frac{1}{\sqrt{2}} - \frac{x_1 x_2 x_3 x_4}{16} \right)} |x_1\rangle |x_2\rangle |x_3\rangle |x_4\rangle |\lambda'\rangle$$

$$\left( \frac{1}{\sqrt{2}} - \frac{x_1 x_2 x_3 x_4}{16} \right)$$

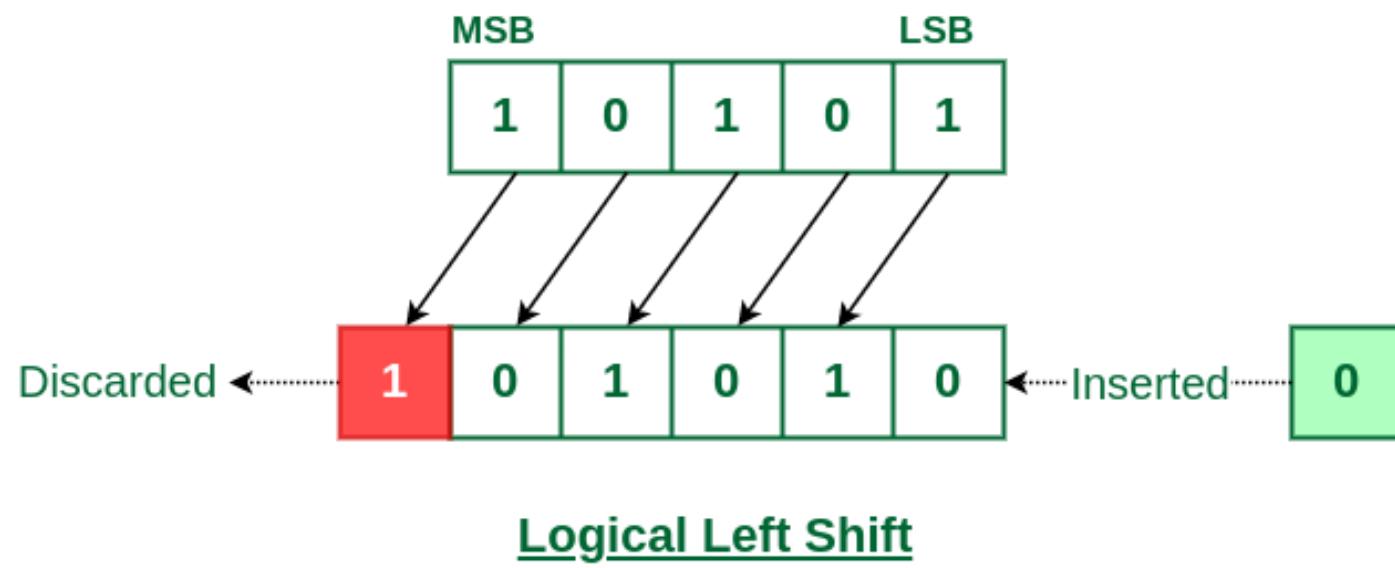
# For any input state?

$$U|\lambda\rangle = e^{2\pi i \varphi} |\lambda\rangle$$



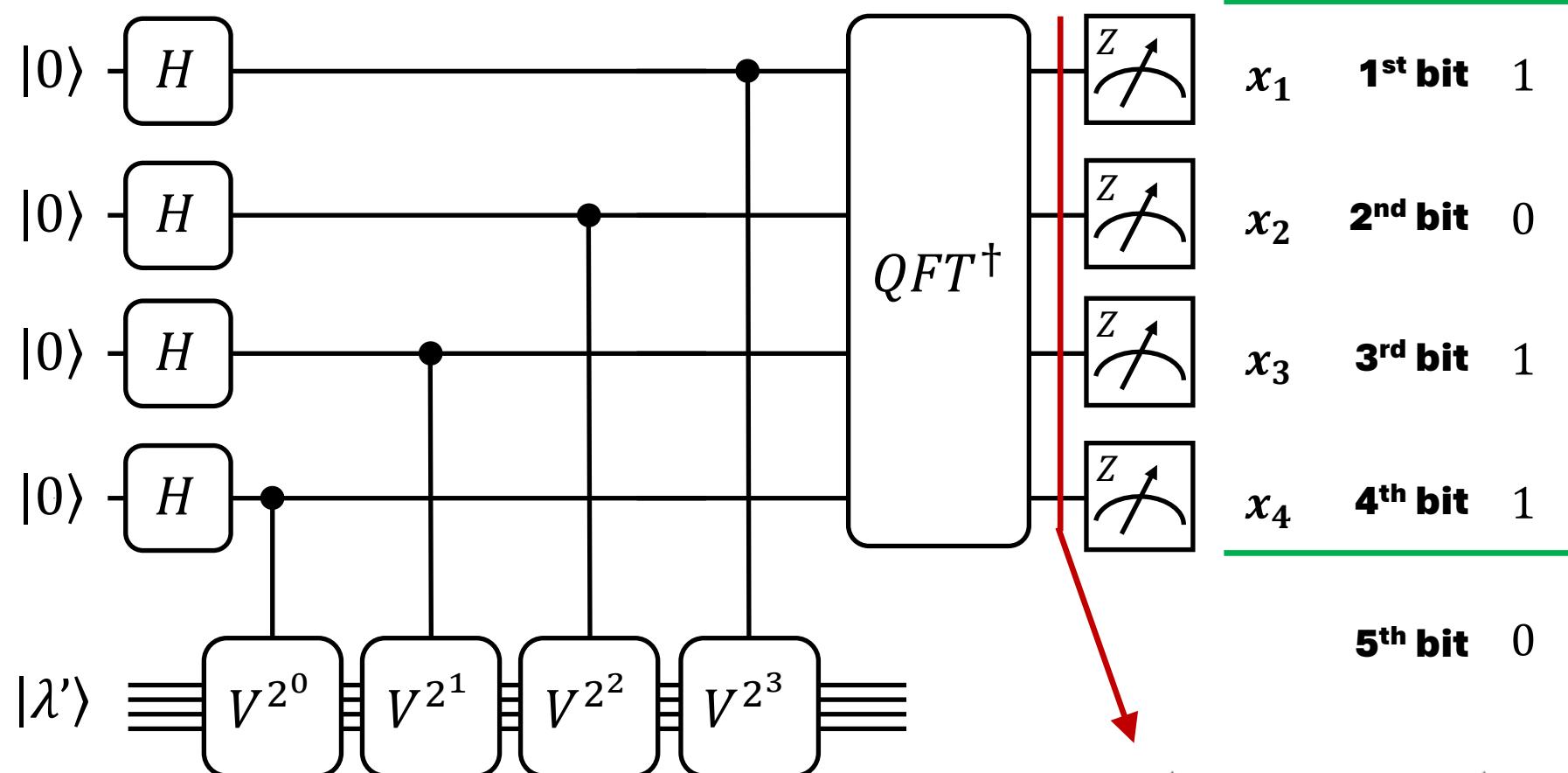
# 3. Modified phase estimation algorithm

## Left shift: Bit operation



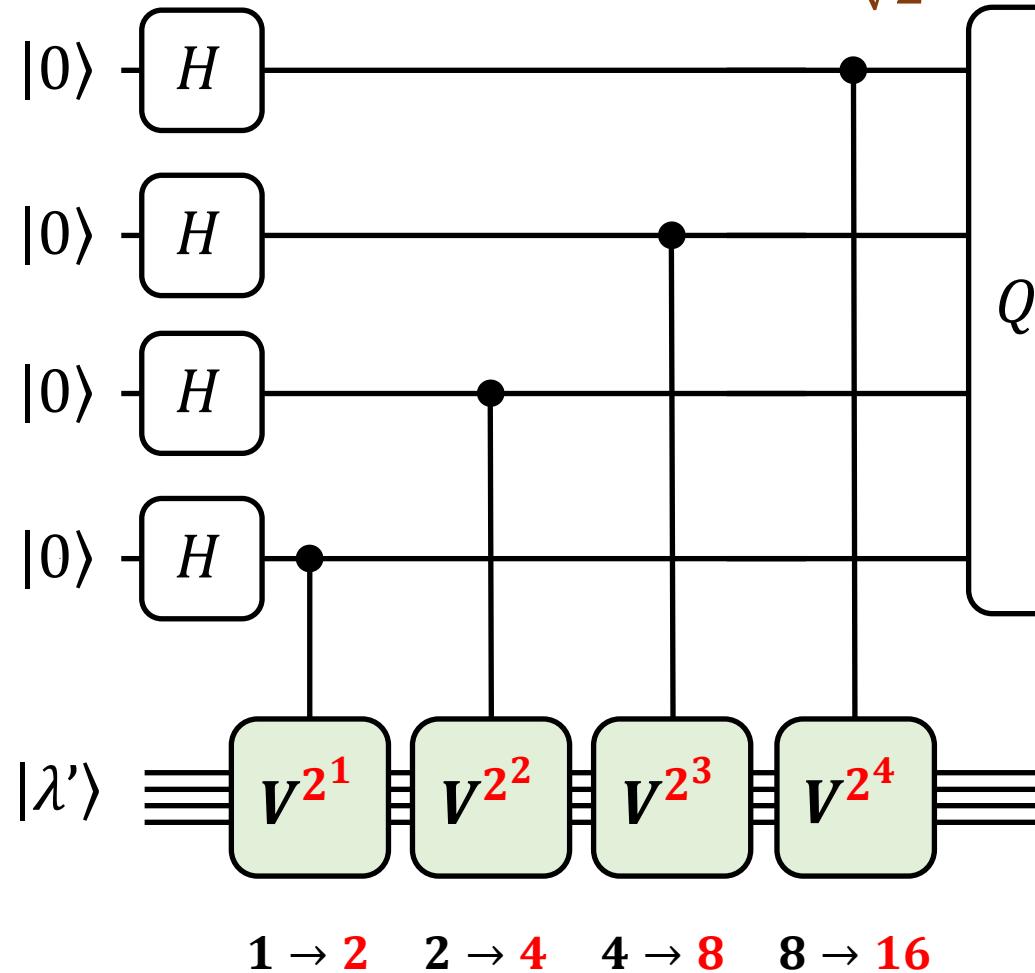
**Observation: Phase**  $\frac{1}{\sqrt{2}}=0.10110\dots$

$$V|\lambda'\rangle = e^{2\pi i \left(\frac{1}{\sqrt{2}}\right)} |\lambda'\rangle,$$

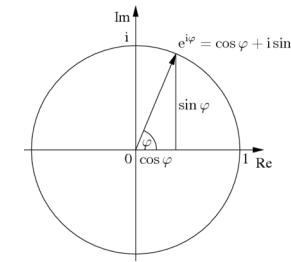


$$e^{2\pi iy\left(\frac{1}{\sqrt{2}} - \frac{x_1 x_2 x_3 x_4}{16}\right)} |x_1\rangle |x_2\rangle |x_3\rangle |x_4\rangle |\lambda'\rangle$$

**Observation: Phase**  $\frac{1}{\sqrt{2}}=0.10110\dots$



$$e^{2\pi i y \left( (0.011010\dots) - \frac{x_1 x_2 x_3 x_4}{16} \right)}$$



$$e^{2\pi i y \left( (1.011010\dots) - \frac{x_1 x_2 x_3 x_4}{16} \right)}$$

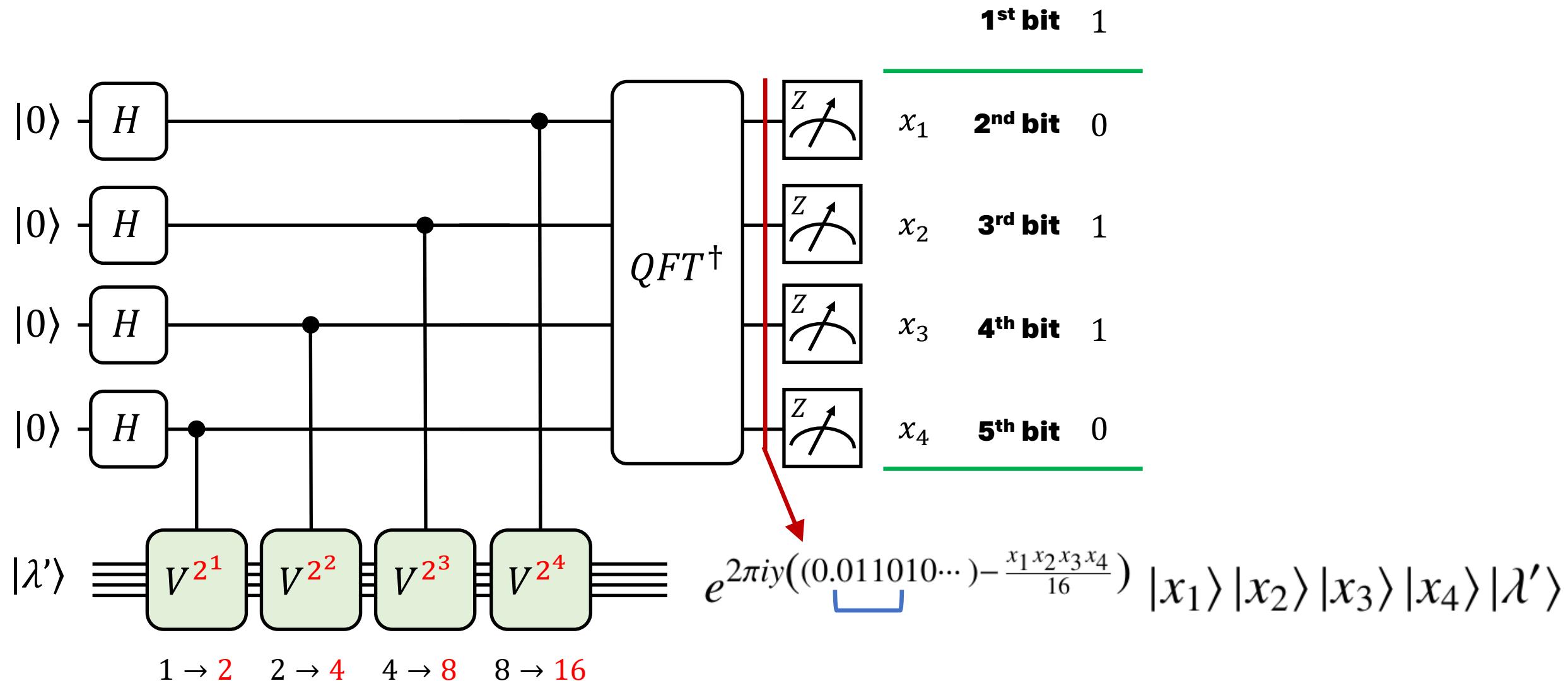
**Left shift**

$$e^{2\pi i y \left( 2(0.1011010\dots) - \frac{x_1 x_2 x_3 x_4}{16} \right)}$$

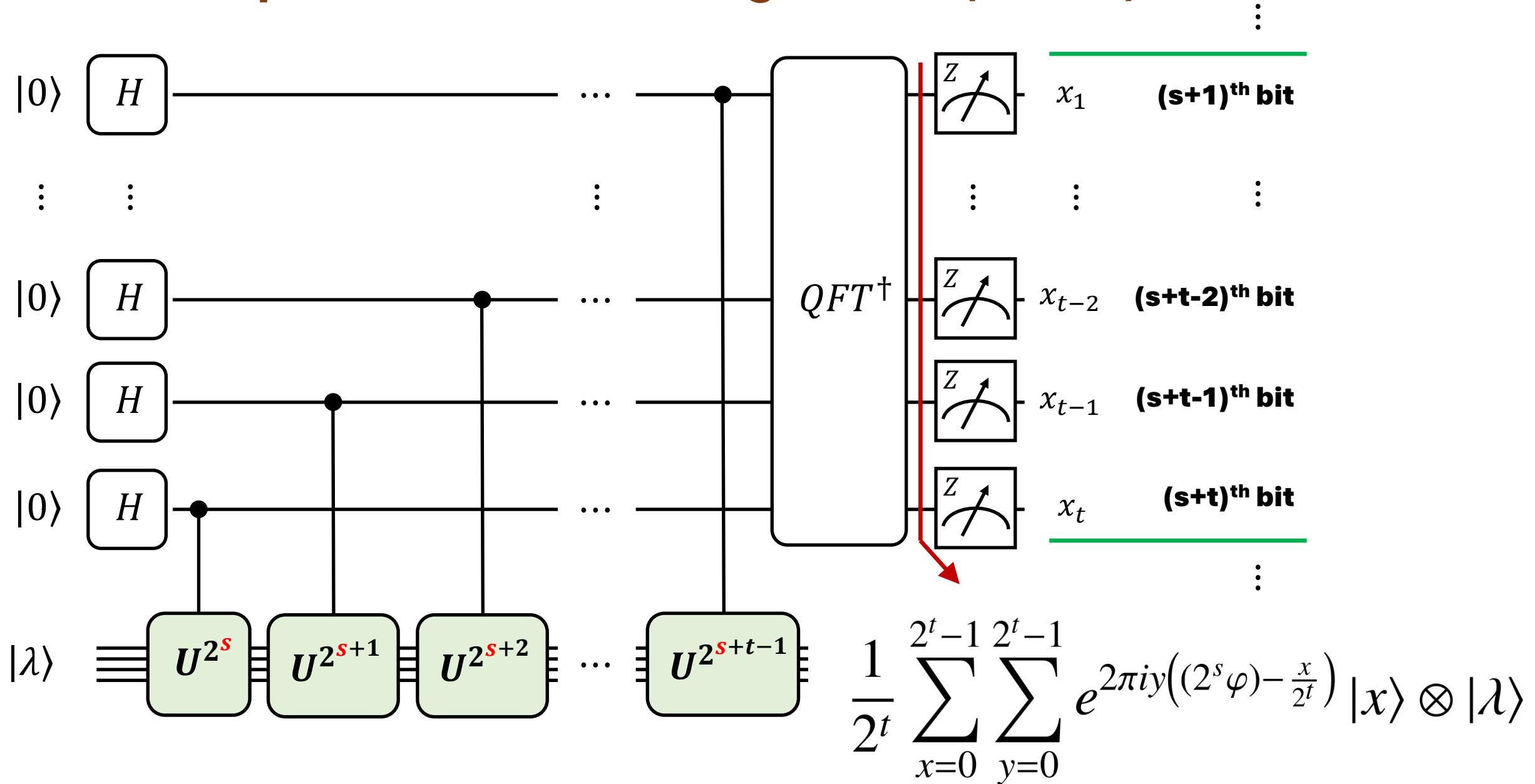
$$e^{2\pi i y \left( 2\left(\frac{1}{\sqrt{2}}\right) - \frac{x_1 x_2 x_3 x_4}{16} \right)} |x_1\rangle |x_2\rangle |x_3\rangle |x_4\rangle |\lambda'\rangle$$

$$e^{2\pi i y \left( \frac{1}{\sqrt{2}} - \frac{x_1 x_2 x_3 x_4}{16} \right)} |x_1\rangle |x_2\rangle |x_3\rangle |x_4\rangle |\lambda'\rangle$$

**Observation: Phase**  $\frac{1}{\sqrt{2}}=0.10110\dots$



# Modified phase estimation algorithm (MPEA)

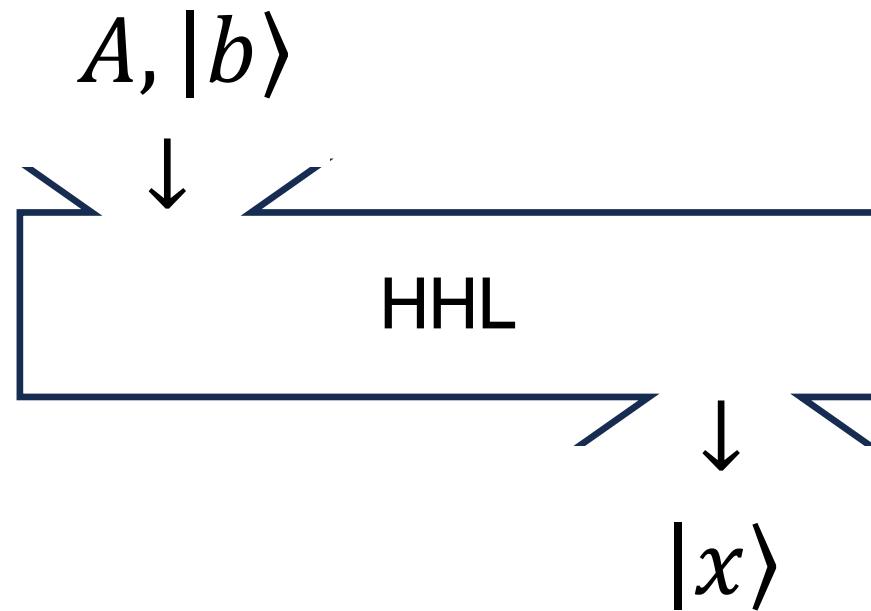


# 4. Application ?

# HHL algorithm

$$A\vec{x} = \vec{b}$$

**HHL algorithm is a quantum algorithm for numerically solving a system of linear equations.**



[Harrow, Hassidim, and Lloyd, PRL 103, 150502 (2009)]

[Scott Aaronson, Nature Physics 11, 291–293 (2015)]

# Solving linear equation

$A$ : Hermitian

$$A|x\rangle = |b\rangle$$
$$A = \sum_i \lambda_i |\lambda_i\rangle\langle\lambda_i|$$
$$|b\rangle = \sum_i \alpha_i |\lambda_i\rangle$$

When  $A$  is invertible,

$$A|x\rangle = |b\rangle$$
$$\Rightarrow A^{-1}A|x\rangle = A^{-1}|b\rangle$$
$$\Rightarrow |x\rangle = A^{-1}|b\rangle = \sum_i \frac{\alpha_i}{\lambda_i} |\lambda_i\rangle$$

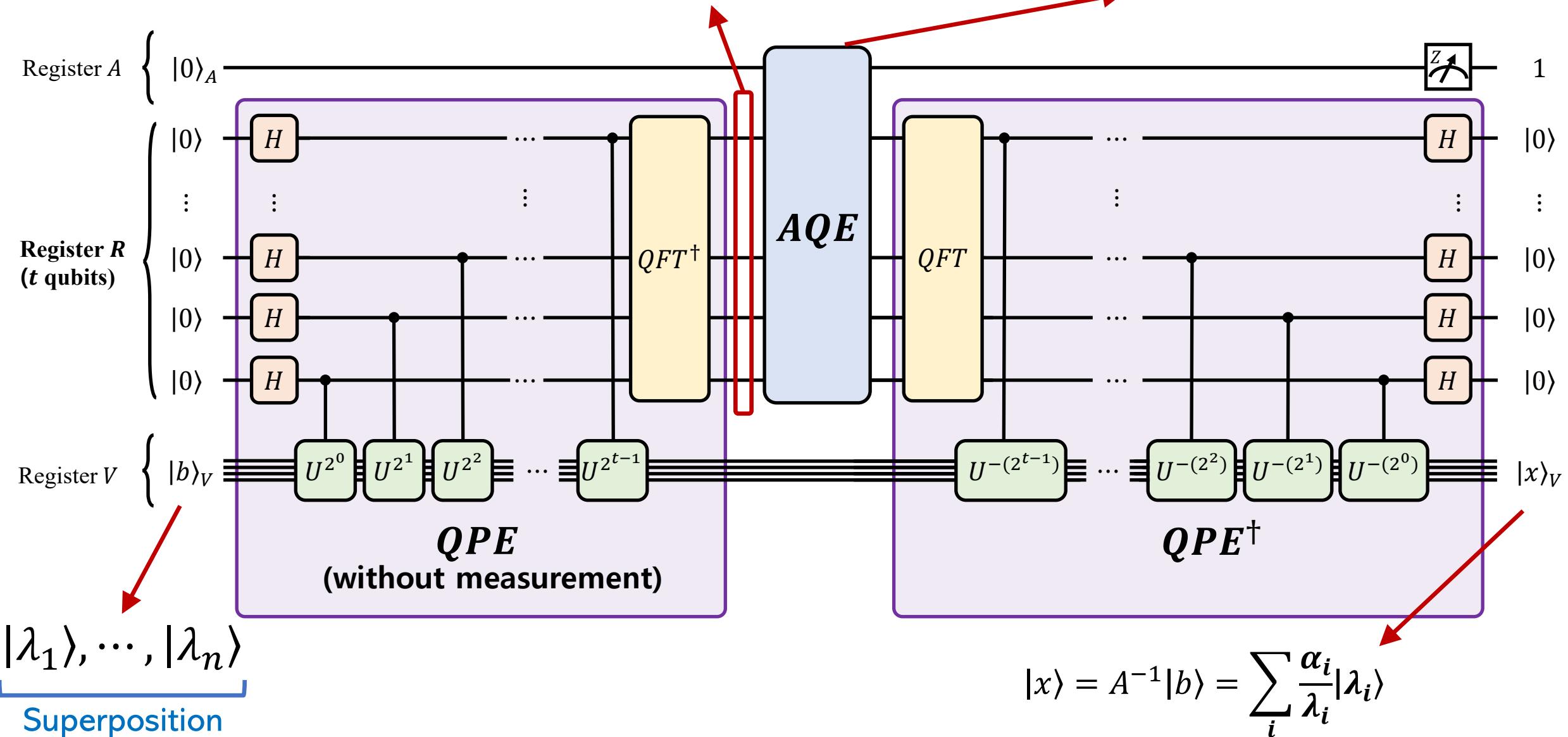
In practice, we don't know eigenvalues and eigenvectors!

HHL also doesn't know them!

# Circuit for HHL

Register  $R$  contains estimation information of each phase

$$|0\rangle_A \otimes |\lambda_i\rangle_R \mapsto \left( \sqrt{1 - \frac{c^2}{\lambda_i^2}} |0\rangle_A + \frac{c}{\lambda_i} |1\rangle_A \right) \otimes |\lambda_i\rangle$$



# Condition for exponential speedup

**HHL provides an exponential speedup over classical counterparts.**

When?



**Small  
condition  
number**

# Condition number

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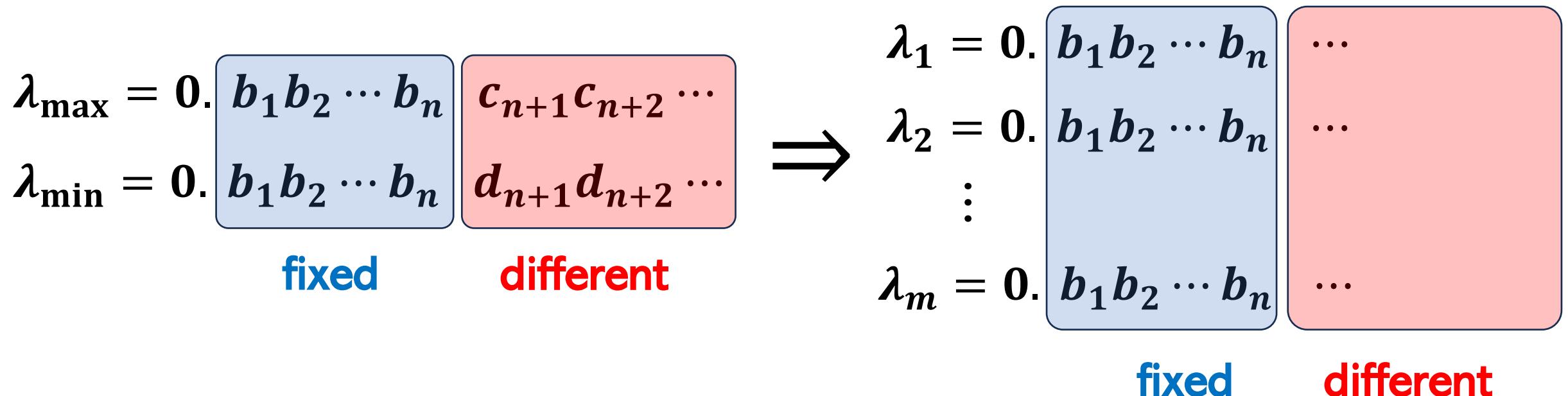
Among the eigenvalues  $\lambda_i$  of a normal matrix  $A$

$$\kappa(A) = \frac{|\lambda_{\max}(A)|}{|\lambda_{\min}(A)|}$$

## Small condition number: Observation

$$|\lambda_{\max} - \lambda_{\min}| \leq \frac{1}{2^n} \quad \Rightarrow \quad |\lambda_i - \lambda_j| \leq \frac{1}{2^n}$$

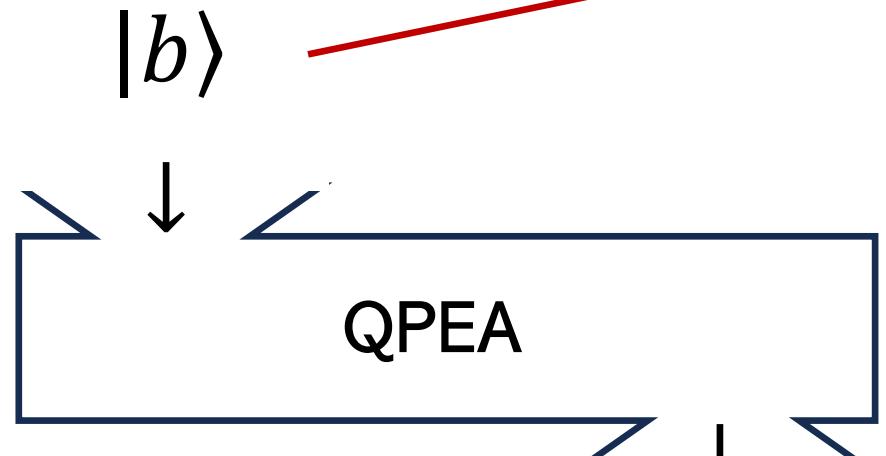
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## Small condition number: Back to QPEA

$$A\vec{x} = \vec{b}$$

$$e^{iA}|\lambda_j\rangle = e^{2\pi i\varphi_j}|\lambda_j\rangle$$



Extract fixed bit  
information of phases

Superposition

$$|\lambda_1\rangle, \dots, |\lambda_m\rangle$$

QPEA

$$\begin{aligned}\varphi_1 &\cong b_1 b_2 \dots b_n \\ \varphi_2 &\cong b_1 b_2 \dots b_n \\ &\dots \\ \varphi_m &\cong b_1 b_2 \dots b_n\end{aligned}$$

Superposition

# Small condition number: QPEA → MPEA

From the prior QPEA...

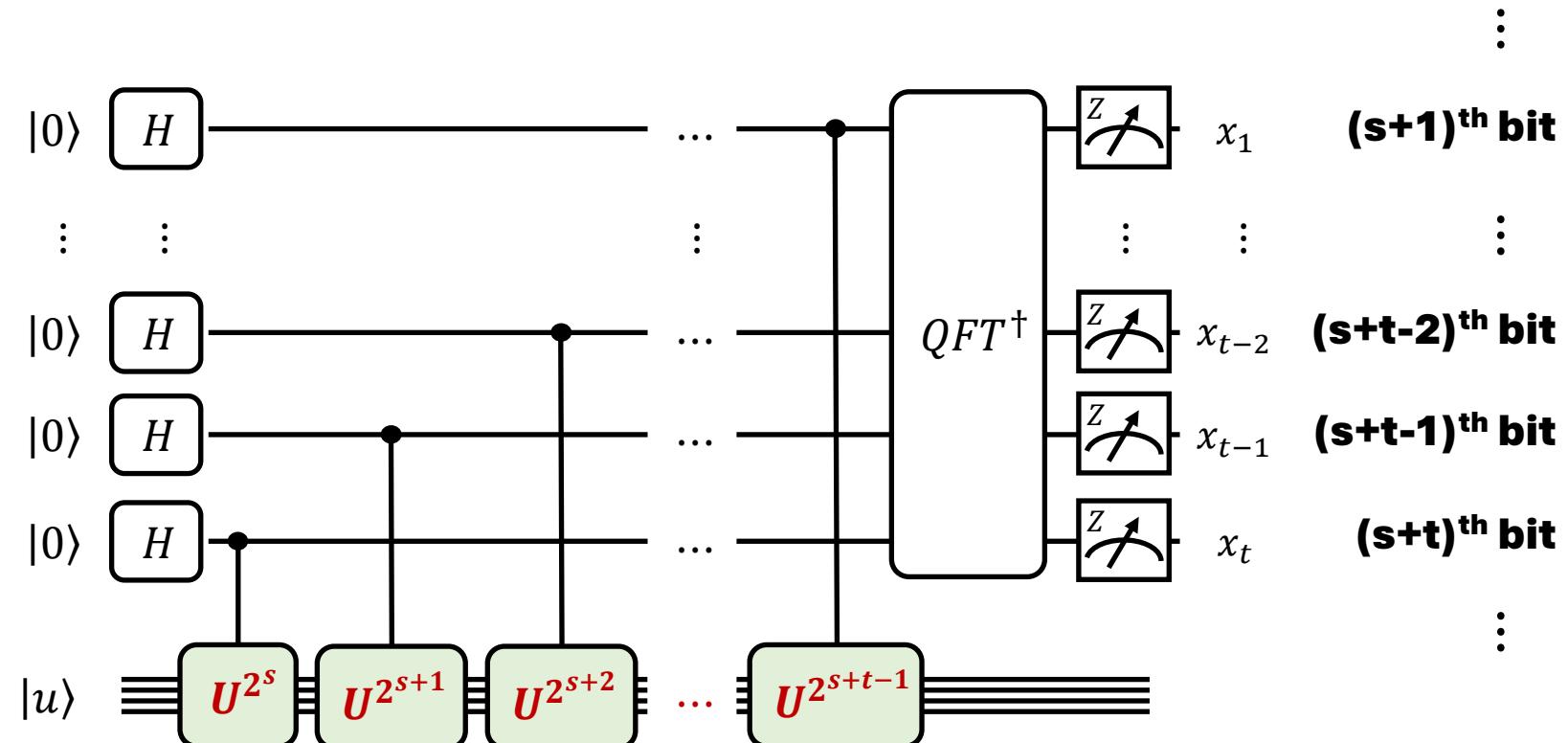
$$\lambda_1 = 0.b_1 b_2 \dots b_s \dots$$

$$\lambda_2 = 0.b_1 b_2 \dots b_s \dots$$

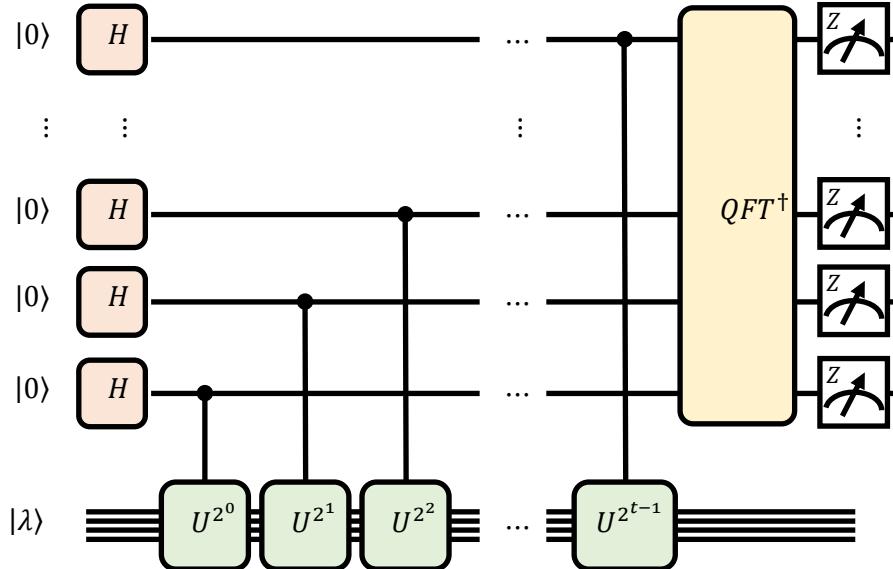
$$\lambda_m = 0.b_1 b_2 \dots b_s \dots$$

Already  
know!

No idea...



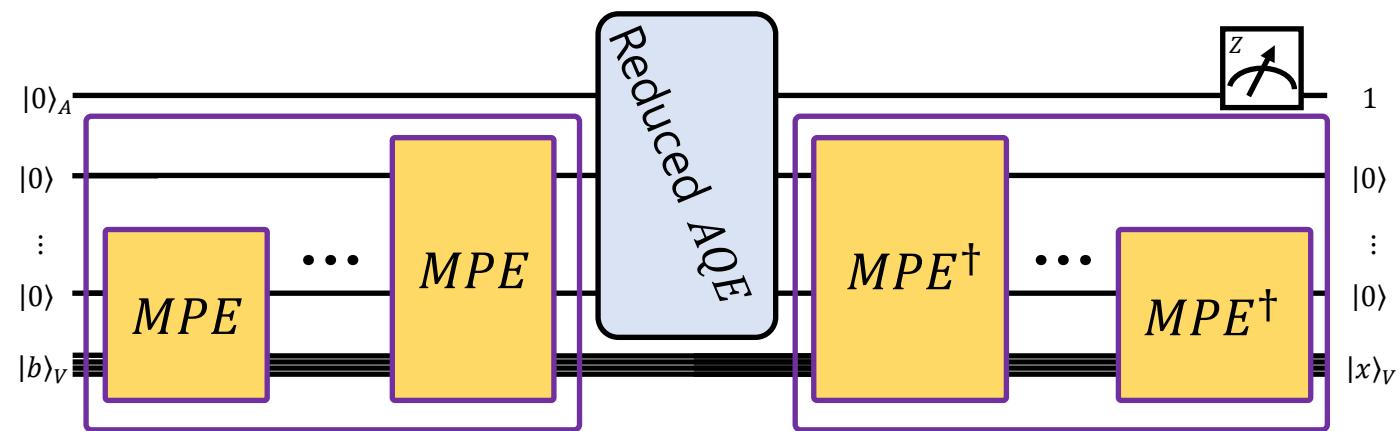
# Our circuit implementation method



#1. Perform QPEA

#2. Analyze  
measurement  
outcomes

#3. Perform simplified HHL



Reduced qubits and reduced gates!  
→ Improved performance under NISQ!

## Example: 10 qubits + small condition number

$$A|x\rangle = |b\rangle$$

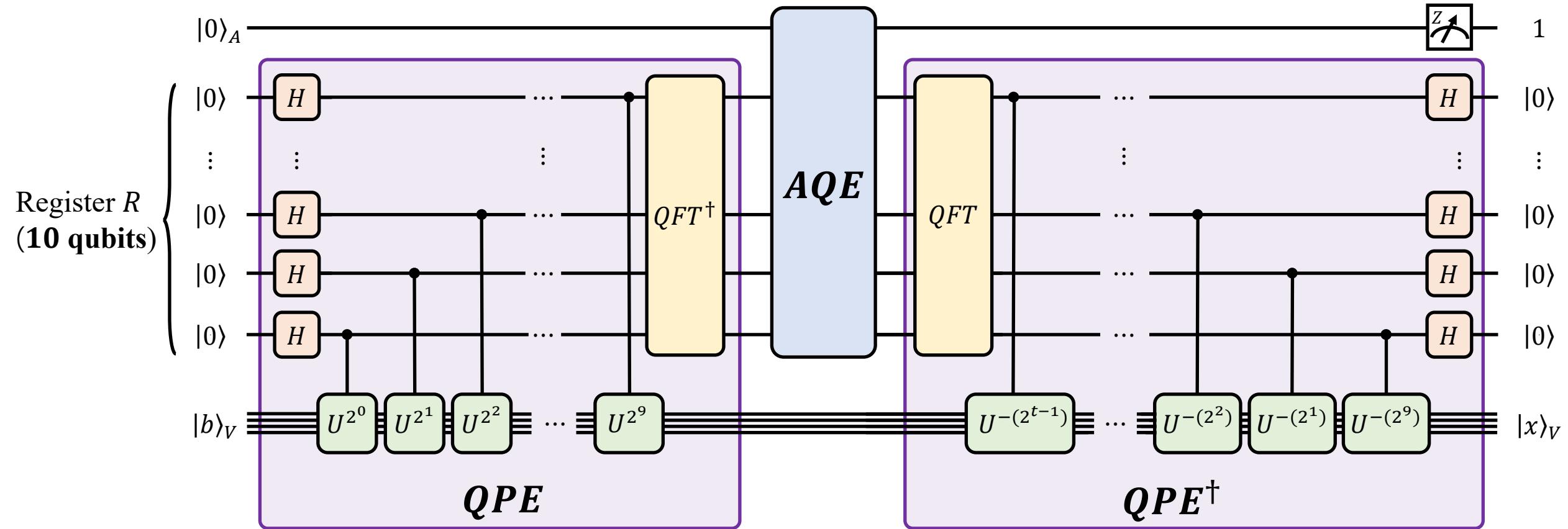
Assume that all eigenvalues of  $A$  have the following binary representation

$$\lambda_i = 0.01\boxed{\phantom{0}}\boxed{\phantom{0}}01\boxed{\phantom{0}}\boxed{\phantom{0}}11$$

Fixed!              Fixed!              Fixed!

Assume that we use 10 bits as the second register  $R$

# Example: 10 qubits, original HHL for $A|x\rangle = |b\rangle$



$H$ : 10

$U$ : 1,023

$QFT^\dagger$ : 60

Example: 10 qubits, our method for  $A|x\rangle = |b\rangle$

## #1. Perform QPEA

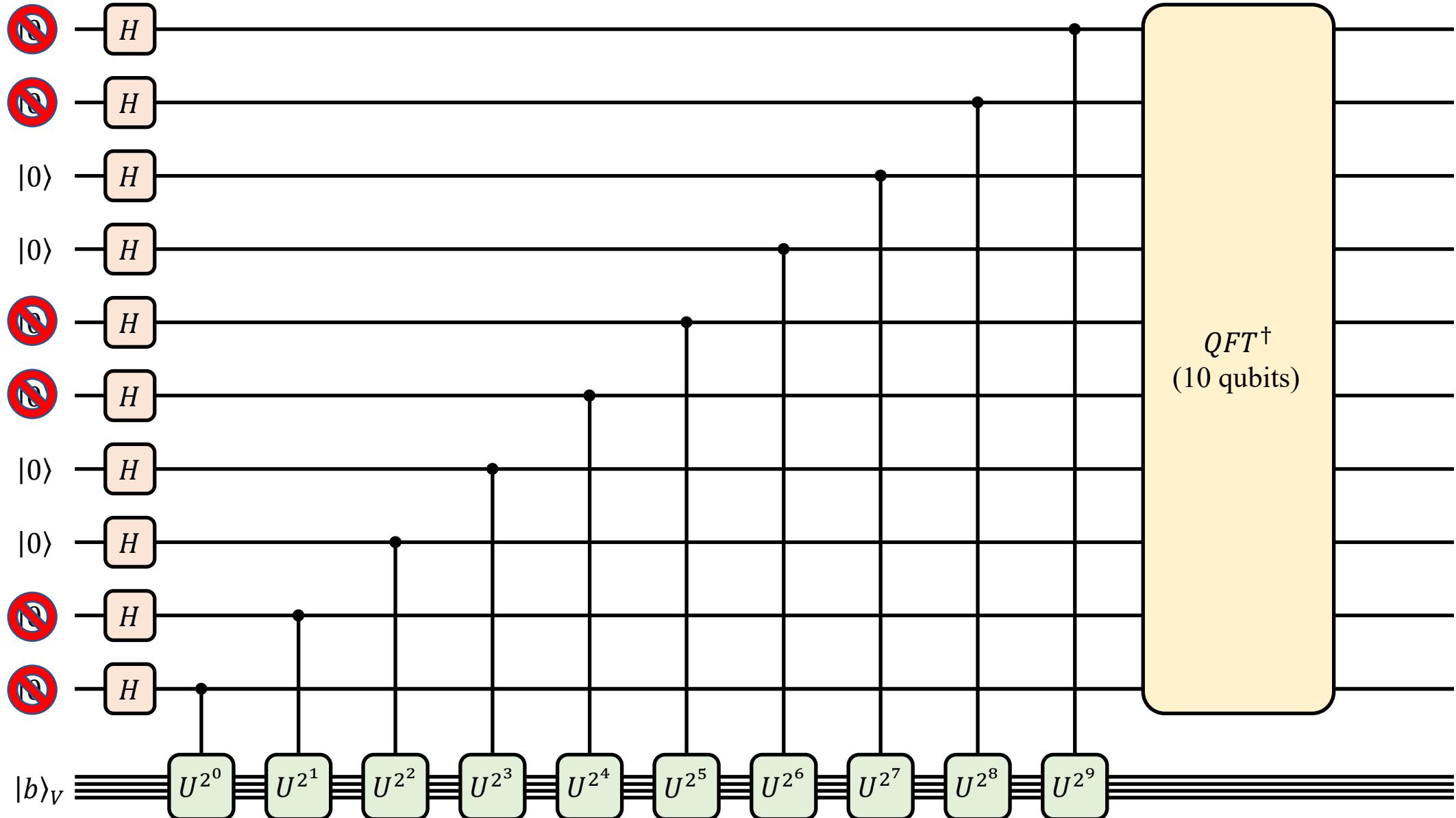
$$\begin{array}{cccccccccccc} \vdots & \vdots \\ m_1 & m_2 & m_3 & m_4 & m_5 & m_6 & m_7 & m_8 & m_9 & m_{10} \\ m_1 & m_2 & m_3 & m_4 & m_5 & m_6 & m_7 & m_8 & m_9 & m_{10} \end{array}$$

## #2. Analyze (compare) measurement outcomes

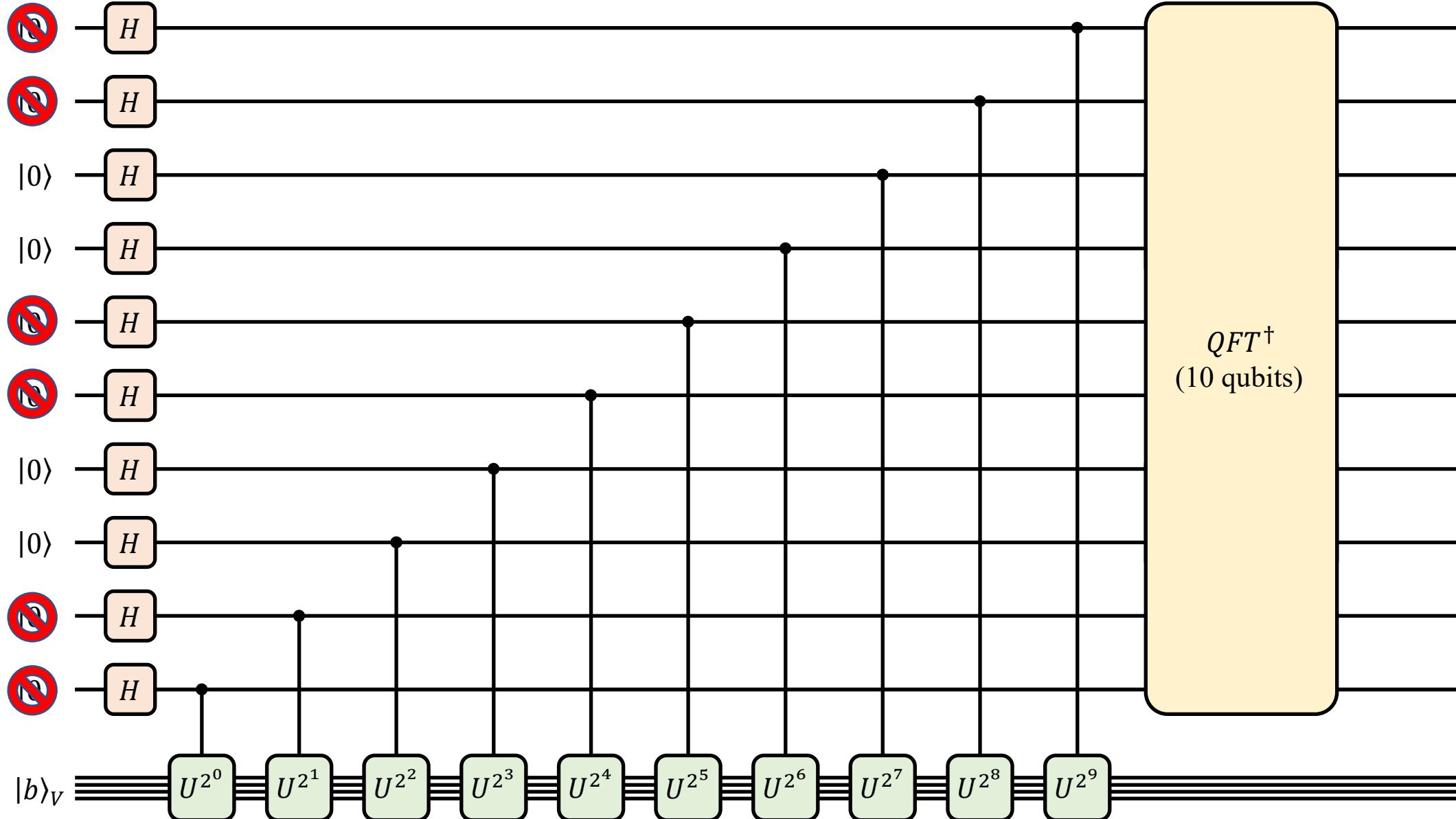
$$\lambda_i = \begin{array}{cc} 0 & 1 \end{array} \quad b_3 \quad b_4 \quad \begin{array}{cc} 0 & 1 \end{array} \quad b_7 \quad b_8 \quad \begin{array}{cc} 1 & 1 \end{array}$$

Fixed!                      Fixed!                      Fixed!

# Example: 10 qubits, 1<sup>st</sup> part of original HHL

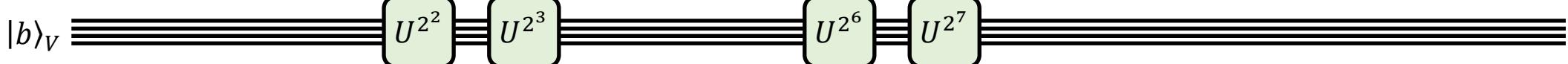
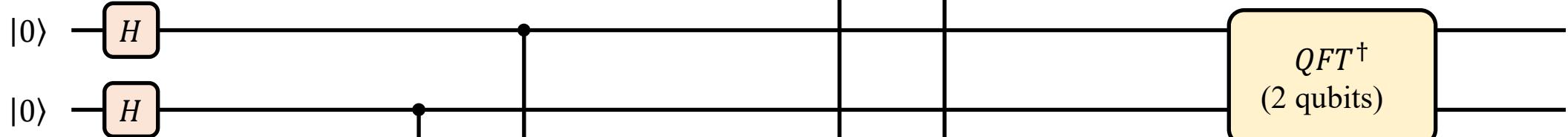
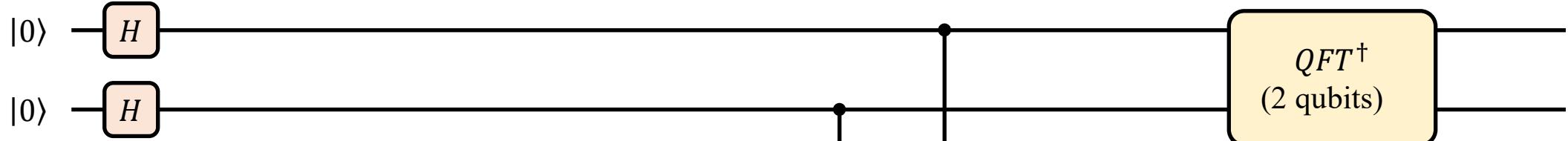


# How does the implementation change?



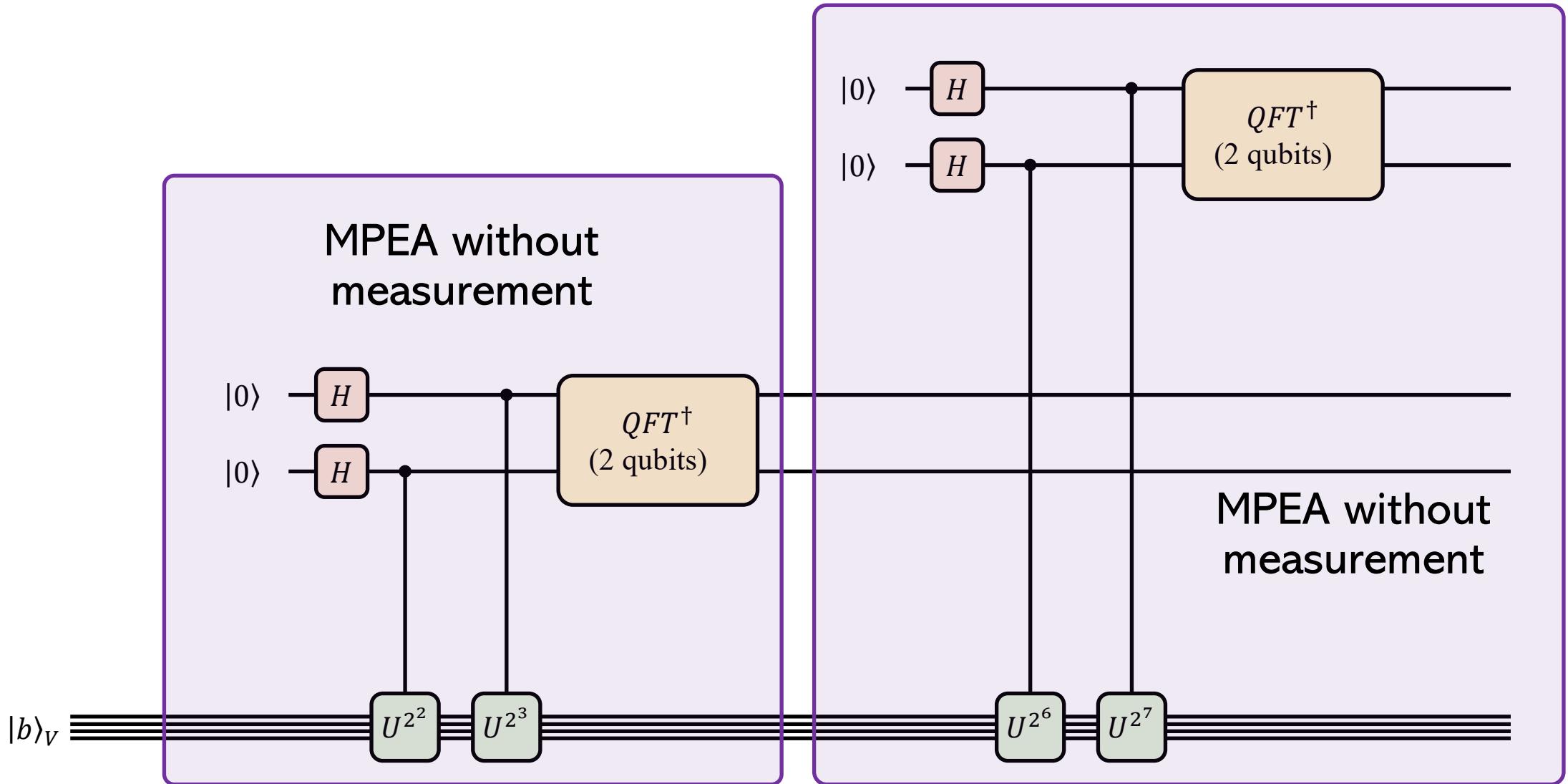
How does the implementation change?

How does it work?

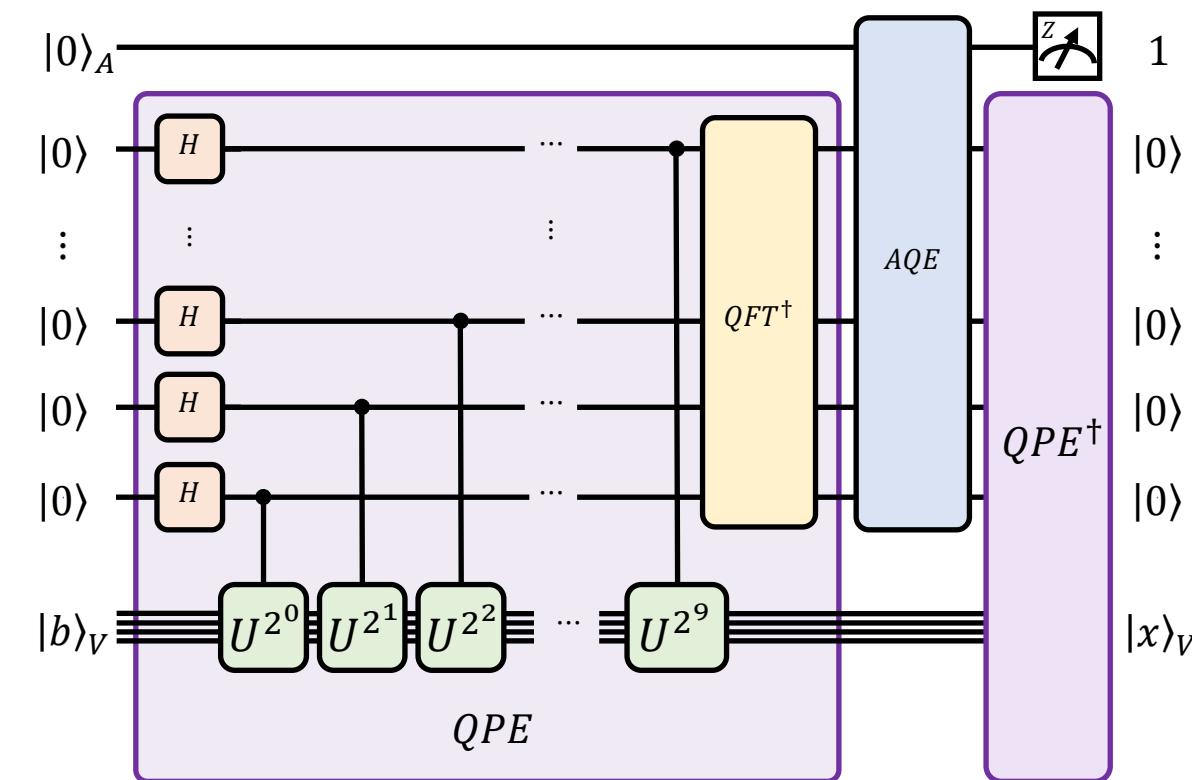


How does the implementation change?

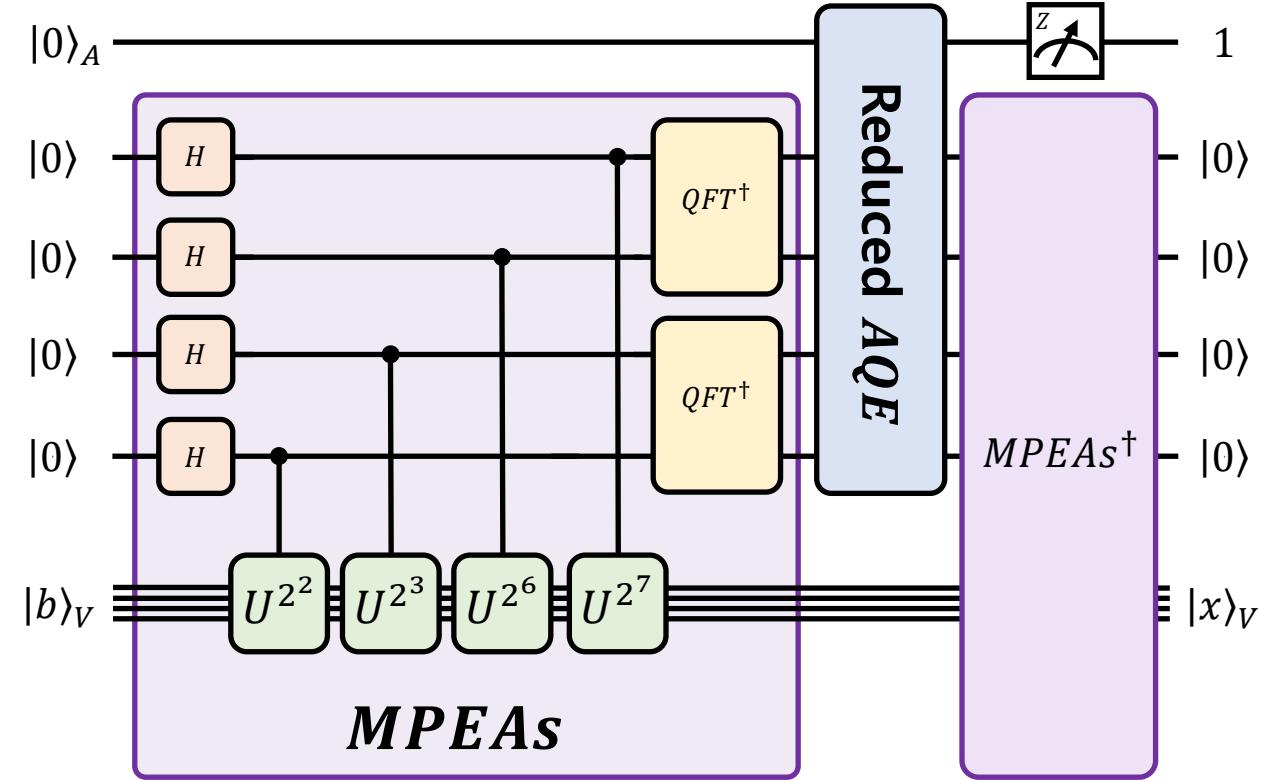
How does it work?



# Example: 10 qubits, original HHL vs. ours



H : 10    U : 1,023    QFT $^\dagger$  : 60



H : 4    U : 204    QFT $^\dagger$  : 10

# Conclusion

# Conclusion

- Bit Shift + QPEA → MPEA
- Simplifying implementation of HHL
- Experimental verification using classical and quantum computers



- Is our implementation method still faster than the conjugate gradient method?

# Thank you!

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## Performance of QPEA

Suppose we wish to approximate  $\varphi$  to an accuracy  $2^{-n}$ , that is, we choose  $e = 2^{t-n} - 1$ . By making use of  $t = n + p$  qubits in the phase estimation algorithm we see from (5.34) that the probability of obtaining an approximation correct to this accuracy is at least  $1 - 1/2(2^p - 2)$ . Thus to successfully obtain  $\varphi$  accurate to  $n$  bits with probability of success at least  $1 - \epsilon$  we choose

$$t = n + \left\lceil \log \left( 2 + \frac{1}{2\epsilon} \right) \right\rceil. \quad (5.35)$$

# Previous result

## Hybrid quantum linear equation algorithm and its experimental test on IBM Quantum Experience

Yonghae Lee<sup>1</sup>, Jaewoo Joo<sup>2,3</sup> & Soojoon Lee<sup>1,2,4</sup>

- MPEA was *not* devised
- Small condition number was *not* mentioned
- # of qubits were *not* reduced

[Lee, Joo, and Lee, SR 9, 4778 (2019)]

