

# Quantum phase estimation

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## An example from chemistry

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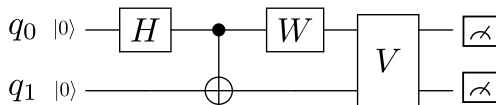
# Program

1. Some context with these slides.
2. Installation problems ?
3. Your turn. Fill the “quantum\_tp\_pea.ipynb” according to “TP\_instructions.pdf”. You will find them in Teams: Files → TP\_programmation → TP\_kit\_phase\_estimation
4. Finish it and send it<sup>1</sup> by **Thursday 14 January**.
5. Two important keyboard short-cuts to know: Shift+Enter and Ctrl+Enter.

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<sup>1</sup>the .ipynb file. Don't forget to save from time to time.

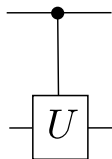
## Prerequisite: quantum circuits



- ▶ qubit: 2-level quantum system ( $|0\rangle, |1\rangle$ ).  
quantum computer =  $n$  qubits.
- ▶ quantum circuit  $\simeq$  quantum program = list of quantum instructions/gates.
- ▶ The circuit above computes:  

$$|\psi\rangle = V \cdot (W \otimes I) \cdot CNOT_{0 \rightarrow 1} \cdot (H \otimes I)|00\rangle$$

**Note:** “controlled-gates” means:



$=$

$$\begin{array}{c}
 \begin{array}{cc}
 q_0 = 0 & q_0 = 1 \\
 q_1, 0 & q_1, 1
 \end{array} \\
 \left( \begin{array}{c|c}
 \begin{array}{cc}
 1 & 0 \\
 0 & 1
 \end{array} & (0) \\
 \hline
 (0) & U
 \end{array} \right)
 \end{array}$$

# Quantum simulation: general motivation

- ▶ Efficient numerical simulation quantum phenomena on classical machines seems hard [1].
- ▶ Therefore quantum machines might be able to perform classically-intractable computation<sup>2</sup>
- ▶ And in particular they should be good at simulating quantum phenomena (e.g simulating QCD, solving condensed-matter problems, computing molecular energies etc.)

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→ But in practice, how would that work ? What **quantum circuits** would I run on my hypothetical quantum computers to solve these problems ?

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<sup>2</sup>basic motivation behind quantum computing research

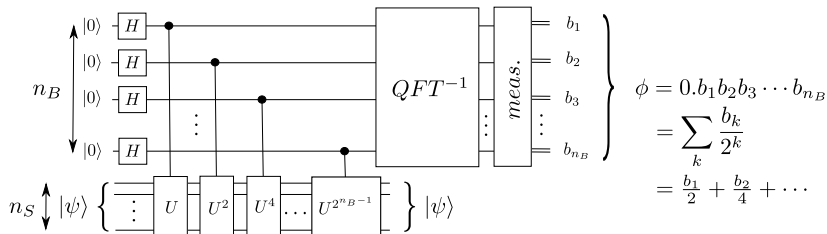
## Quantum simulation: more precisely

Most of the time in the potential applications I mentioned (particle physics, condensed matter, chemistry), the computation consists in **diagonalizing Hamiltonians** and in particular find their **ground state energy**.

You will see in these practical quantum programming sessions the two main frameworks for doing so on a quantum computer:

- ▶ **phase estimation** (this week) → the “classic guaranteed-speedup quantum algorithmics approach”.
- ▶ **variational quantum algorithms** [2] (next week, in a slightly more “combinatorial optimization”-oriented context) → the “more recent, empirical, practical approach”.

## This week's answer: quantum phase estimation



With  $|\psi\rangle$  **eigenvector** of  $U$  with **eigenvalue**  $e^{-2i\pi\phi}$ ,  
 ( $U|\psi\rangle = e^{-2i\pi\phi}|\psi\rangle$ ,  $0 \leq \phi < 1$ )

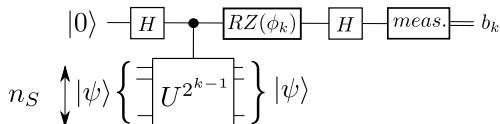
The circuit above allows to compute the  $n_B$  most significant bits of  $\phi$  in a **binary decomposition**.

**Template** for *all* quantum algorithms with **exponential speedup**, both in quantum simulation and other application contexts.

# Iterative quantum phase estimation: what we will use

for  $k$  in **range**( $n_B$ , 0, -1)<sup>3</sup>:

1. compute  $\phi_k = 2\pi \cdot \sum_{l=k+1}^{n_B} \frac{b_l}{2^{l-k+1}}$
2. produce and execute the following circuit:

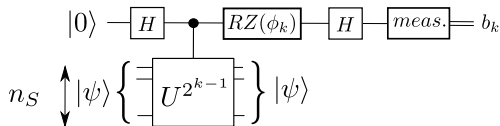


which yields  $b_k$ .

With  $H = \frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 1 \\ 1 & -1 \end{pmatrix}$  and  $RZ(\phi_k) = \begin{pmatrix} 1 & 0 \\ 0 & e^{i\phi_k} \end{pmatrix}$

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<sup>3</sup>Python style



Recall that  $\phi = 0.b_1 \cdots b_{n_B}$  in binary decomposition,  
 $\phi_k = 2\pi \cdot \sum_{l=k+1}^{n_B} \frac{b_l}{2^{l-k+1}} = 0.0b_{k+1} \cdots b_{n_B}$  and  $U|\psi\rangle = e^{-2i\pi\phi}|\psi\rangle$ .

### Evolution of the system:

$$\begin{aligned}
 |0\rangle|\psi\rangle &\xrightarrow{H} \left( \frac{|0\rangle+|1\rangle}{\sqrt{2}} \right) |\psi\rangle = \left( \frac{|0\rangle|\psi\rangle+|1\rangle|\psi\rangle}{\sqrt{2}} \right) \\
 &\xrightarrow{U} \left( \frac{|0\rangle|\psi\rangle+e^{-2i\pi \cdot 2^{k-1}\phi}|1\rangle|\psi\rangle}{\sqrt{2}} \right) = \left( \frac{|0\rangle+e^{-2i\pi \cdot 0.b_k \cdots b_{n_B}}|1\rangle}{\sqrt{2}} \right) |\psi\rangle \\
 &\xrightarrow{RZ(\phi_k)} \left( \frac{|0\rangle+e^{-2i\pi \cdot 0.b_k}|1\rangle}{\sqrt{2}} \right) |\psi\rangle = \left( \frac{|0\rangle+(-1)^{b_k}|1\rangle}{\sqrt{2}} \right) |\psi\rangle \xrightarrow{H} |b_k\rangle|\psi\rangle
 \end{aligned}$$



# Our example: molecular ground state energy calculation

**General problem:** Given  $\mathcal{H}$ , electronic structure Hamiltonian of a molecule, we want to compute its ground state energy.

Actually, usually  $\mathcal{H}$  depends on some structural/geometric parameters. The purpose is then to compute a *ground state energy landscape* as a function of these parameters. May provide insight on reaction mechanisms <sup>4</sup>.

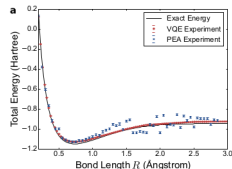
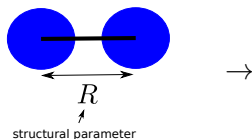
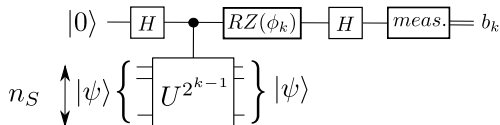


FIG. 3. Computed  $H_2$  energy curve and errors. (a) Ent

**Our instance:**  $H_2$  and its dissociation curve. We will use data from [4], where they solve it on an actual small quantum chip.

<sup>4</sup>Potential futuristic applications:  $CO_2$  capture [3],  $H_2O$  cracking...



We will therefore work with:

- ▶  $U = e^{-i\mathcal{H}dt}$ , for some value of  $dt$  to be chosen.
- ▶  $|\psi\rangle$  the ground state of  $H$ , whose energy  $E$  we want to compute.
- ▶ we then have  $U|\psi\rangle = e^{-iEdt}|\psi\rangle = e^{-2i\pi \frac{Edt}{2\pi}}$

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**Problem 1:** the algorithm only allows us to compute

$$\phi = \frac{Edt}{2\pi} \bmod [1] \ (\in [0, 1])$$

Following [5], we will use an *interval guess*  $[E_{min}, E_{max}]$  for  $E$ .

Then  $\mathcal{H} \leftarrow \mathcal{H} - E_{min} \cdot I$  ensures  $E > 0$  and choosing  $dt = \frac{2\pi}{E_{max}}$

ensures  $\frac{Edt}{2\pi} < 1$

## Other problems

**Problem 2** In general we do not have access to the ground state.

→ use an **ansatz**<sup>5</sup> with theoretical good overlap with ground state. As suggested in [4], we will use here the Hartree-Fock approximation to our problem, namely  $|10\rangle = X \otimes I|00\rangle$

**Problem 3** How do we implement  $U^{2^k} = e^{-i\mathcal{H}2^k dt}$  ?

→ usually  $\mathcal{H}$  comes as a sum of simpler terms  $\sum_I \mathcal{H}_I$  (e.g Pauli products) for which  $e^{-i\mathcal{H}_I dt}$  is simple to implement.

→ and use **Trotter's formula** [5]

$$e^{-i(\sum_I \mathcal{H}_I)dt} \simeq \left( \prod_I e^{-\frac{i\mathcal{H}_I dt}{p}} \right)^p$$

with  $p$  integer, as large as possible.

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<sup>5</sup>easy-to-prepare approximation

- ▶ We will reproduce the curves from [4].
- ▶ In this example:
  - ▶  $n_S = 2$
  - ▶  $H(R) = g_0 I + g_1 ZI + g_2 IZ + g_3 ZZ + g_4 YY + g_5 XX^6$
  - ▶ The coefficients are stored in hamiltonian\_data.json
- ▶ The purpose is to reproduce

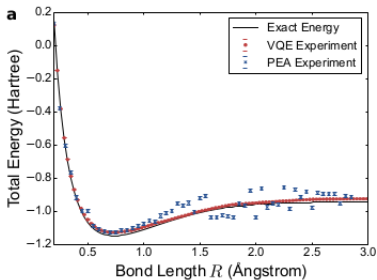


FIG. 3. Computed  $H_2$  energy curve and errors. (a) Enc

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<sup>6</sup>This Hamiltonian is the output of (1) a conversion from an *electronic structure Hamiltonian* to a *spin Hamiltonian* expressed with Pauli matrices and (2) simplifications leveraging theoretical chemistry knowledge

# The programming framework we will use: myqlm

What you need to know:

- ▶ quantum circuits are first written as **Program** and then exported as **circuit**.
- ▶ A **job** is created from a circuit and sent to a **qpu** (a simulator)
- ▶ **AbstractGates** allow to define custom parameterized gates. They will come handy in programming Hamiltonian simulation.
- ▶ **QRoutines** allow to program arbitrary parametrized sub-circuits, which are then pluggable anywhere into a larger circuit.
- ▶ see the minimal notebook and <https://myqlm.github.io/> for more details



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Simulating physics with computers.

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