

# Variational Quantum Eigensolvers

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[https://github.com/smartiel/tp\\_vqe\\_centrale](https://github.com/smartiel/tp_vqe_centrale)

TP 2 – Quantum Computing  
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# What you should already know

## Quantum Phase Estimation

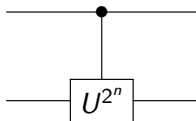
**Input:** Unitary operator  $U = e^{-iHt}$ , and eigenvector  $U|\psi\rangle = e^{i\theta}|\psi\rangle$

**Output:** The first  $k$  bits of  $\theta$

**Runtime:**  $O(2^k)$  (for an arbitrary  $U$ )

This algorithm is:

- a core algorithm in Quantum Computing (Shor, Quantum Chemistry)
- quite costly, because we need to implement:



and a **Quantum Fourier Transform**

# Poor man's QPE: Variational Quantum Eigensolver (VQE)

## Variational Quantum Eigensolver

**Input:** Some Hamiltonian  $H = \sum_i \alpha_i h_i$  (with a small number of terms)

**Output:** An approximation of the lowest eigenvalue  $E_0$  of  $H$

- Pick a family of quantum states  $|\psi(\theta)\rangle$
- Using a quantum computer and a classical optimizer find:

$$\theta^* = \operatorname{argmin}_{\theta} \langle \psi(\theta) | H | \psi(\theta) \rangle$$

- Return  $\langle \psi(\theta^*) | H | \psi(\theta^*) \rangle$

# Ingredients for a VQE

Evaluating  $\langle\psi|H|\psi\rangle$

We will only consider  $H = \sum_i \alpha_i P_i$  where  $P_i$  are Pauli operators

$$\langle\psi|H|\psi\rangle = \sum_i \alpha_i \langle\psi|P_i|\psi\rangle$$

In myQLM:

- $H = \sum_i \alpha_i P_i$  can be described using

```
from qat.core import Observable, Term

my_hamiltonian = Observable(
    10,      # Number of qubits
    pauli_terms=[
        Term(2., "XZY", [0, 2, 4])
    ]
)
```

[See `tp_vqe_bits.ipynb`, first cell]

# Ingredients for a VQE

Evaluating  $\langle\psi|H|\psi\rangle$

In myQLM:

- Given a circuit  $C$  and  $H$ , one can construct a Job
- Sending the Job to a simulator will return  $\langle 0|C^\dagger H C|0\rangle$

```
from qat.qpus import get_default_qpu

job = circuit.to_job(observable=my_hamiltonian)
result = get_default_qpu().submit(job)
print('Energy:', result.value)
```

[See `tp_vqe_bits.ipynb`, second cell]

# Ingredients for a VQE

Finding  $\theta^*$  (classical optimization)

We will need to find  $\theta^*$  that minimize the energy  $\langle \psi(\theta) | H | \psi(\theta) \rangle$

- We will describe  $|\psi(\theta)\rangle = C(\theta)|0\rangle$  using a parametrized circuit  $C(\theta)$   
[See [tp\\_vqe\\_bits.ipynb](#), third cell]
- The energy  $\langle \psi(\theta) | H | \psi(\theta) \rangle$  is evaluated using a quantum processor (in our case, a simulator called PyLinalg)
- We will find  $\theta^*$  using a variational optimizer (a wrapper around `scipy.optimize.minimize`)  
[See [tp\\_vqe\\_bits.ipynb](#), fourth cell]

# Ingredients for a VQE

Choosing the family  $|\psi(\theta)\rangle$

The choice of  $|\psi(\theta)\rangle = C(\theta)|0\rangle$  is crucial:

- it should be rather simple (cheap)
- but capture some symmetries of  $H$

In particular it should have good chances of approximating the ground state of  $H$

This is what we will focus on in this TP!

# This TP

[https://github.com/smartiel/tp\\_vqe\\_centrale](https://github.com/smartiel/tp_vqe_centrale)

We will study Ising Hamiltonian of the form:

$$H = \sum_{i < j} a_{i,j} \sigma_z^i \sigma_z^j$$

We will incrementally complicated circuits  $C(\theta)$ :

- Family 1: simple linear circuits
- Family 2: circuit with the same interactions as  $H$
- Family 3: circuit with the same interaction strengths as  $H$

For each family we will:

- test it on some Hamiltonians, and evaluate their quality
- exhibit quality deficits for some instances



# This TP

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The TP can be found in [tp\_vqe.ipynb]

- questions are inside the notebook
- some questions don't require code, just some text answer (you can write the answer in the notebook, in french if you want)
- some questions have a "test" cell to check that your code works on some simple cases

It will be graded.

Deadline in one week: 14/01/2021 23:59:59!

Refer to [tp\_vqe\_bits.ipynb] for myQLM related stuff.

[MyQLM documentation](#) (use the search tool, top left)