

# **LibKet: Cross-Platform Library for Running Quantum Algorithms on NISQ processors**

## **Variational Quantum Algorithms**

IEEE Quantum Week 2022

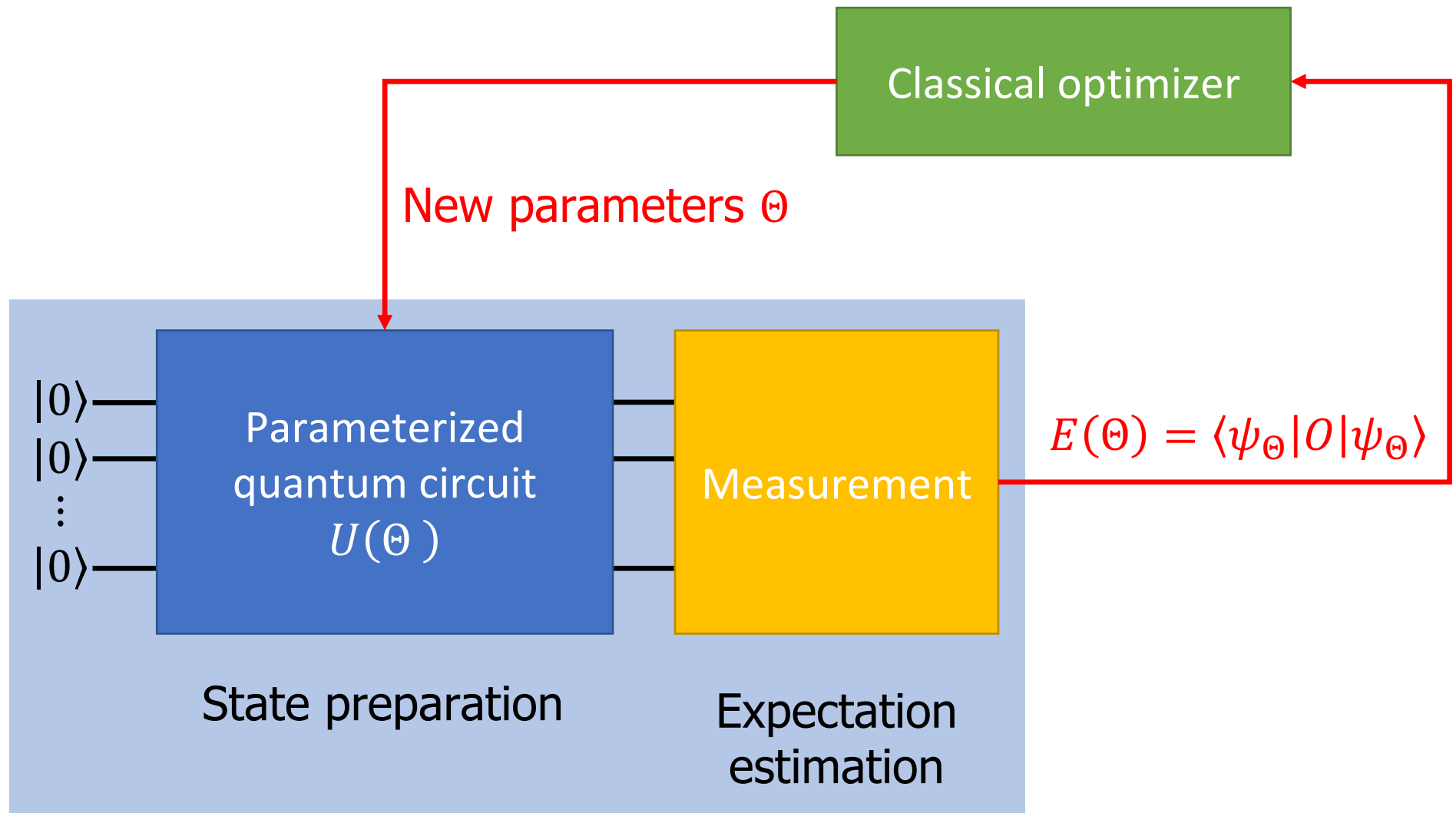
September 18-23, 2022

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# Working principle



# Examples of variational algorithms

- Variational Quantum Eigensolver (VQE)
  - *Peruzzo et al. 2014, McClean et al. 2015*
- Quantum Approximate Optimization Algorithm (QAOA)
  - *Farhi et al. 2014*
- Quantum Alternating Operator Ansatz (QAOA)
  - *Hadfield et al. 2019*
- Variational Quantum Linear Solver (VQLS)
  - *Bravo-Prieto et al. 2019, Xu et al. 2019*
- ...

# Parameterized rotation gates

$$R_x(\theta) = \begin{bmatrix} \cos \frac{\theta}{2} & -i \sin \frac{\theta}{2} \\ -i \sin \frac{\theta}{2} & \cos \frac{\theta}{2} \end{bmatrix}, \quad R_y(\theta) = \begin{bmatrix} \cos \frac{\theta}{2} & -\sin \frac{\theta}{2} \\ \sin \frac{\theta}{2} & \cos \frac{\theta}{2} \end{bmatrix}, \quad R_z(\theta) = \begin{bmatrix} e^{-i\frac{\theta}{2}} & 0 \\ 0 & e^{i\frac{\theta}{2}} \end{bmatrix}$$

Valid substitutions of the Hadamard gate

$$\begin{aligned} H &\mapsto R_x(\pi)R_y(\pi/2), & H &\mapsto R_y(-\pi/2)R_x(\pi) \\ H &\mapsto R_y(\pi/2)R_z(\pi), & H &\mapsto R_z(\pi)R_y(-\pi/2) \end{aligned}$$

## Exercise 1

Check the above substitution rules with the QuEST simulator

## Exercise 2

Try to find the correct rotation angles by grid search



<https://tinyurl.com/3vw4zdc8>



## Tutorial at IEEE QCE22, September 18-23, 2022

LibKet: A Cross-Platform Library for Running Quantum Algorithms on NISQ Processors

Organizers: Carmen G. Almudever, Matthias Möller

### Session 1: Sunday, September 18, 10:00 AM – 11:30 AM MDT (UTC-6)

Time	Content	Lecturer	Slides	Binder
10:00-11:00 am	Hands-on Introduction to Quantum Computing	Carmen	<a href="#">slides</a>	tutorial 01
11:00-11:30 am	Libket - The Basics	Matthias	<a href="#">slides</a>	tutorial 02

### Session 2: Sunday, September 18, 12:00 AM – 1:30 PM MDT (UTC-6)

Time	Content	Lecturer	Slides	Binder
1:00-1:45 pm	LibKet - Advanced Features	Matthias	<a href="#">slides</a>	tutorial 03
1:45-2:30 pm	Variational Quantum Algorithms	Carmen/Matthias	<a href="#">slides</a>	tutorial 04

# Reference solution

```
QVar_t<0> var0(0.0); QVar_t<1> var1(0.0);  
auto expr = rx(var0, ry(var1, init()));  
QDevice<QDeviceType::quest, 1> device; device(expr);  
  
for (int i = 0; i < 11; i++) {  
    for (int j = 0; j < 11; j++) {  
        var0 = 3.14159265358979323846/10*i;  
        var1 = 1.57079632679489661923/10*j;  
        device.eval(1);  
        std::cout << "i=" << i << " j=" << j << "\n"  
                    << device.reg() << std::endl;  
    }  
}
```

# The eigenvalue problem

Given the Hamiltonian

$$H = c_0 X \otimes I + c_1 I \otimes X, \quad c_0, c_1 \in \mathbb{R}$$

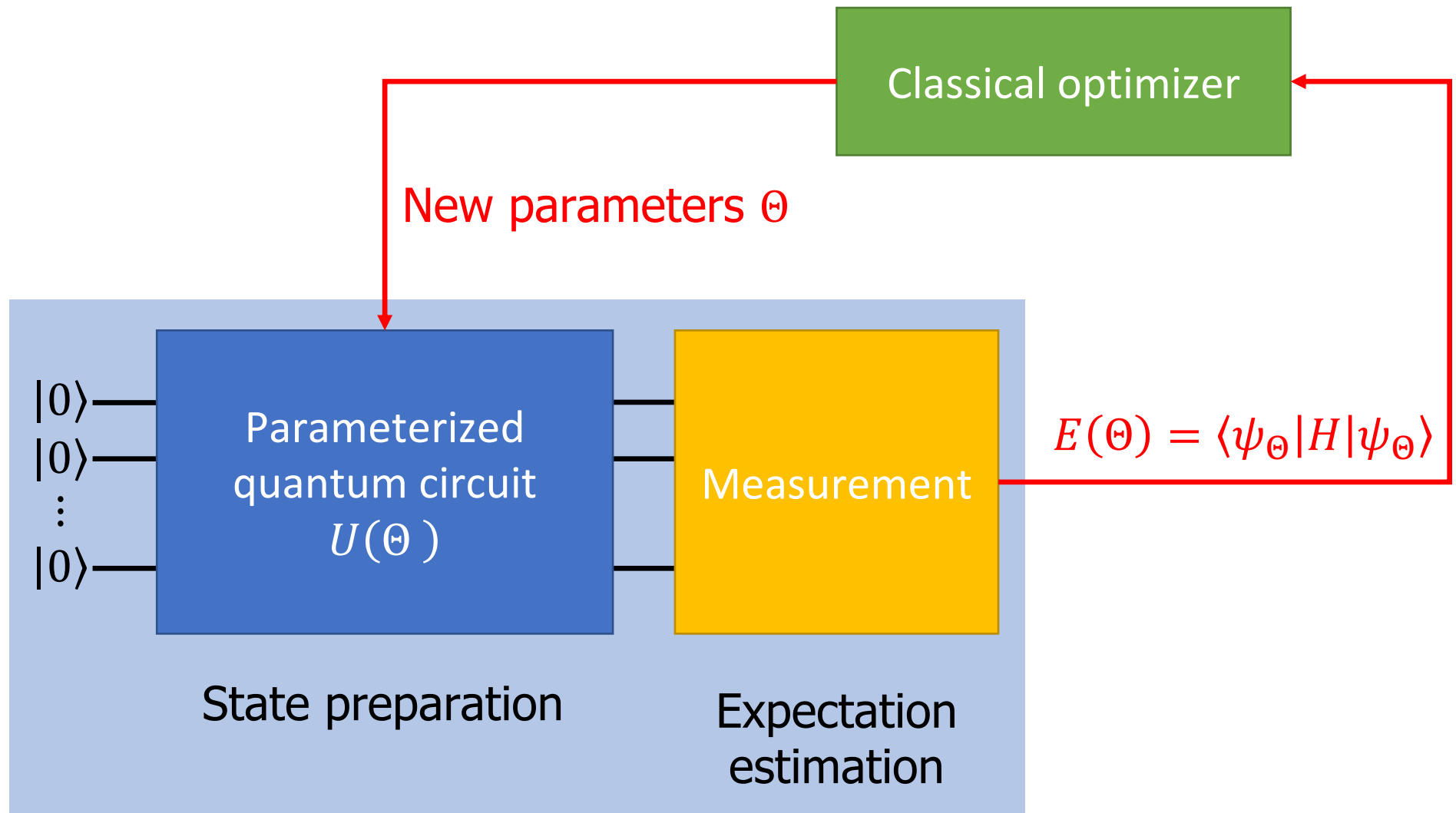
find the *smallest* eigenvalue of  $H$ , that is

$$H\psi_{\min} = \lambda_{\min}\psi_{\min}$$

**Example**

$$\begin{aligned} H &= 0.5 \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix} \otimes \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} + 0.6 \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} \otimes \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix} \\ &= \begin{bmatrix} 0 & 0.6 & 0.5 & 0 \\ 0.6 & 0 & 0 & 0.5 \\ 0.5 & 0 & 0 & 0.6 \\ 0 & 0.5 & 0.6 & 0 \end{bmatrix} \Rightarrow \lambda_i \in \{-1.1, -0.1, 0.1, 1.1\} \end{aligned}$$

# Variational Quantum Eigensolver





# VQE – state preparation

All possible 1-qubit states can be created from  $|0\rangle$  with the **U3 ansatz**

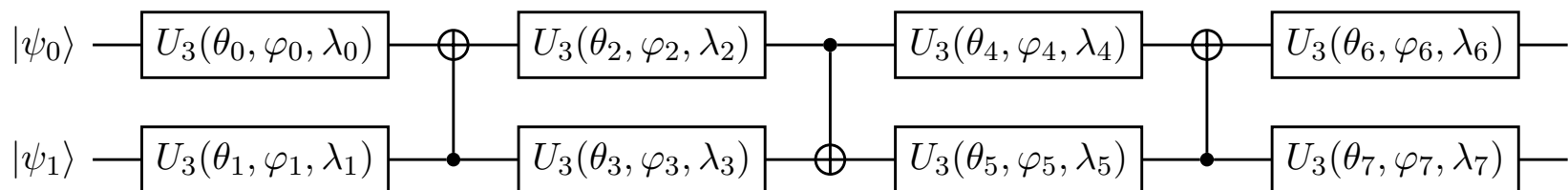
$$\begin{aligned} U_3(\theta, \varphi, \lambda)|0\rangle &= \begin{bmatrix} \cos(\theta/2) & -e^{i\lambda} \sin(\theta/2) \\ e^{i\varphi} \sin(\theta/2) & e^{i(\varphi+\lambda)} \cos(\theta/2) \end{bmatrix} \cdot \begin{bmatrix} 1 \\ 0 \end{bmatrix} \\ &= \cos(\theta/2) |0\rangle + e^{i\varphi} \sin(\theta/2) |1\rangle \end{aligned}$$

The U3 ansatz can be represented as **parameterized quantum circuit**

$$U_3(\theta, \varphi, \lambda) = R_z(\varphi)R_x(-\pi/2)R_z(\theta)R_x(\pi/2)R_z(\lambda)$$

# VQE – state preparation

Shende et al. 2003 has extended the U3 ansatz to two qubits



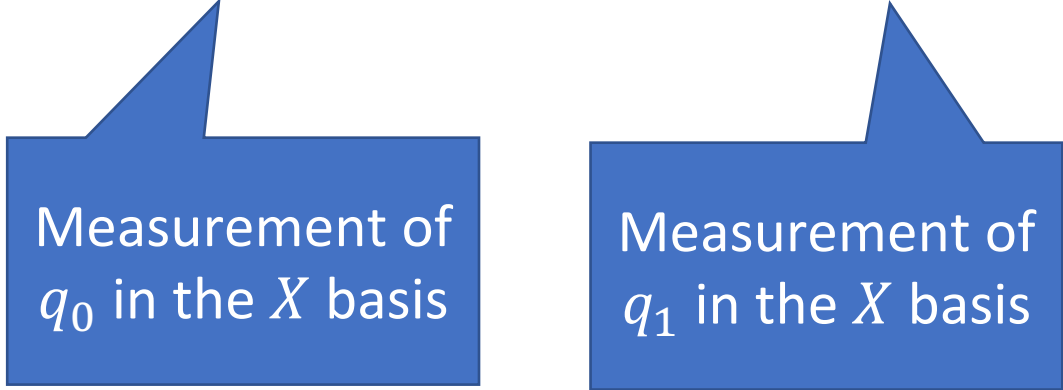
So we need to find the optimal value of 24 parameters.

# VQE – expectation estimation

$$\langle \psi_{\Theta} | H | \psi_{\Theta} \rangle = \langle \psi_{\Theta} | c_0 X \otimes I + c_1 I \otimes X | \psi_{\Theta} \rangle$$

Due to the properties of the inner product this can be decomposed into

$$\langle \psi_{\Theta} | H | \psi_{\Theta} \rangle = c_0 \langle \psi_{\Theta} | X \otimes I | \psi_{\Theta} \rangle + c_1 \langle \psi_{\Theta} | I \otimes X | \psi_{\Theta} \rangle$$



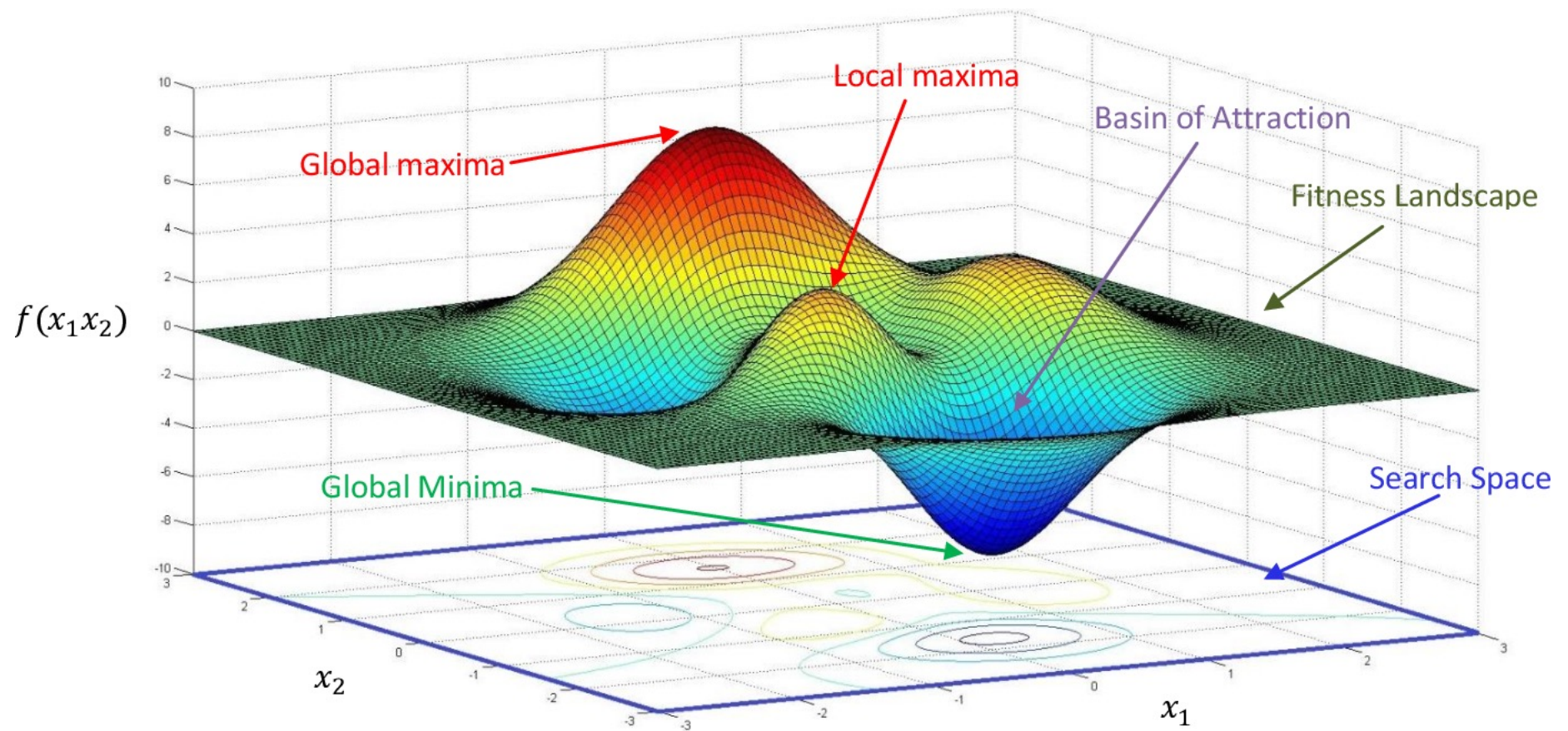
Measurement of  
 $q_0$  in the  $X$  basis

Measurement of  
 $q_1$  in the  $X$  basis

Can be mimicked by

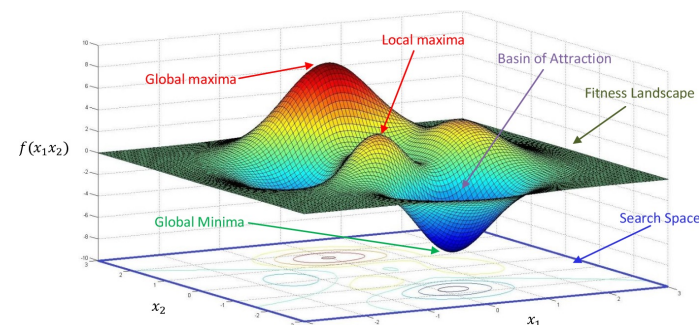
$$\text{meas}_z(H | \psi_{\Theta})$$

# VQE – classical optimizer



# VQE – classical optimizer

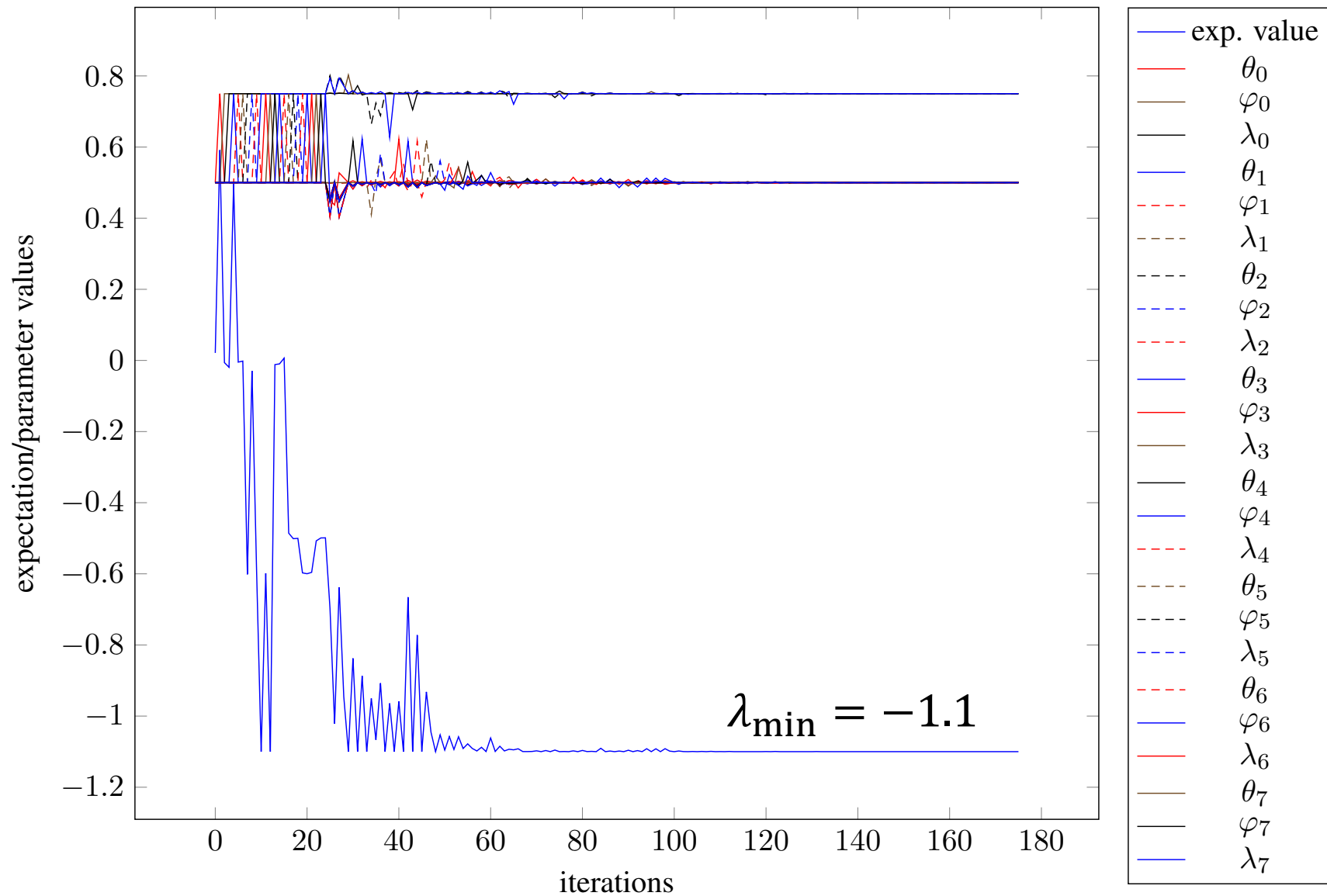
- Global optimizer
  - Genetic algorithm
  - Particle swarm optimization
  - ...



- Local optimizer
  - Gradient-free
    - Nelder-Mead Simplex
    - COBYLA
    - ...
  - Gradient-based
    - Stochastic gradient descent
    - BFGS / L-BFGS
    - Newton-type
    - ...

LibKet integrates the NLOpt package <https://nlopt.readthedocs.io>

# Parameters and expectation value



# At the end of the tutorial

- Hands-on introduction into quantum computing
- LibKet – The basics and some of the advanced features
- Variational quantum algorithms – VQE as an example



Feedback, bug reports, and feature requests are welcome.

Thank you very much!