# mitiq Release 0.1.0

**Tech Team @ Unitary Fund** 

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# CHAPTER 1

Change Log

# 1.1 Version 0.1.0 (Date)

• Initial release.

# CHAPTER 2

**Users Guide** 

### 2.1 Overview of mitiq

Welcome to mitiq Users Guide.

Mitiq is an open source toolkit for implementing error mitigation techniques on most current intermediate-scale quantum computers.

The library allows to postprocess results from quantum circuits with both analog and digital techniques, interfacing with a variety of quantum circuit libraries.

### 2.2 Zero Noise Extrapolation

#### 2.2.1 Introduction

Zero noise extrapolation (ZNE) was introduced concurrently in Ref. [1] and [2]. With *mitiq.zne* module it is possible to extrapolate what the expected value would be without noise. This is done by first setting up one of the key objects in *mitiq*, which is a mitiq. Factory object.

#### 2.2.2 Importing Quantum Circuits

mitiq allows one to flexibly import and export quantum circuits from other libraries. Here is an example:

>>> from mitiq import Factory

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API-doc

This is the top level module from which functions and classes of Mitiq can be directly imported.

```
mitiq.version()
```

Returns the Mitiq version number.

#### 3.1 Factories

Contains all the main classes corresponding to different zero-noise extrapolation methods.

```
class mitiq.factories.BatchedFactory(scalars: Iterable[float])
    Abstract class of a non-adaptive Factory.
```

This is initialized with a given batch of scaling factors ("scalars"). The "self.next" method trivially iterates over the elements of "scalars" in a non-adaptive way. Convergence is achieved when all the correpsonding expectation values have been measured.

Specific (non-adaptive) zero-noise extrapolation algorithms can be derived from this class by overriding the "self.reduce" and (if necessary) the "\_\_init\_\_" method.

```
is\_converged() \rightarrow bool
```

Returns True if all needed expectation values have been computed, else False.

```
next() \rightarrow float
```

Returns the next noise level to execute a circuit at.

```
class mitiq.factories.ExpFactory (scalars: Iterable[float], asymptote: Optional[float] = None) Factory object implementing a zero-noise extrapolation algorithm assuming an exponential ansatz y(x) = a + b * \exp(-c * x), with c > 0.
```

If the asymptotic value  $(y(x-\sin f) = a)$  is known, a linear fit with respect to  $z(x) := \log[\sin g(b) (y(x) - a)]$  is used. Otherwise, a non-linear fit of y(x) is performed.

```
\textbf{reduce}\,(\,)\,\rightarrow float
```

Returns the zero-noise limit, assuming an exponential ansatz:  $y(x) = a + b * \exp(-c * x)$ , with c > 0.

#### class mitig.factories.Factory

Abstract class designed to adaptively produce a new noise scaling parameter based on a historical stack of previous noise scale parameters ("self.instack") and previously estimated expectation values ("self.outstack").

Specific zero-noise extrapolation algorithms, adaptive or non-adaptive, are derived from this class. A Factory object is not supposed to directly perform any quantum computation, only the classical results of quantum experiments are processed by it.

#### $is\_converged() \rightarrow bool$

Returns True if all needed expectation values have been computed, else False.

```
next() \rightarrow float
```

Returns the next noise level to execute a circuit at.

```
push(instack\_val: float, outstack\_val: float) \rightarrow None
```

Appends "instack\_val" to "self.instack" and "outstack\_val" to "self.outstack". Each time a new expectation value is computed this method should be used to update the internal state of the Factory.

```
reduce () \rightarrow float
```

Returns the extrapolation to the zero-noise limit.

```
class mitiq.factories.LinearFactory(scalars: Iterable[float])
```

Factory object implementing a zero-noise extrapolation algorithm based on a linear fit.

```
\textbf{reduce}\,(\,)\,\to float
```

Determines, with a least squared method, the line of best fit associated to the data points. The intercept is returned.

```
class mitiq.factories.PolyExpFactory(scalars: Iterable[float], order: int, asymptote: Op-
tional[float] = None)
```

Factory object implementing a zero-noise extrapolation algorithm assuming an (almost) exponential ansatz with a non linear exponent, i.e.:

```
y(x) = a + s * exp(z(x)), where z(x) is a polynomial of a given order.
```

The parameter "s" is a sign variable which can be either 1 or -1, corresponding to decreasing and increasing exponentials, respectively. The parameter "s" is automatically deduced from the data.

If the asymptotic value  $(y(x-\sin f) = a)$  is known, a linear fit with respect to  $z(x) := \log[s(y(x) - a)]$  is used. Otherwise, a non-linear fit of y(x) is performed.

```
reduce () \rightarrow float
```

Returns the zero-noise limit, assuming an exponential ansatz: y(x) = a + s \* exp(z(x)), where z(x) is a polynomial of a given order. The parameter "s" is a sign variable which can be either 1 or -1, corresponding to decreasing and increasing exponentials, respectively. The parameter "s" is automatically deduced from the data. It is also assumed that  $z(x--\sin t)=-\sin t$ , such that  $y(x--\sin t)=-\infty$ .

```
static static_reduce (instack: List[float], outstack: List[float], asymptote: Optional[float], order: int, eps: float = 1e-09) \rightarrow float
```

Determines the zero-noise limit, assuming an exponential ansatz: y(x) = a + s \* exp(z(x)), where z(x) is a polynomial of a given order.

The parameter "s" is a sign variable which can be either 1 or -1, corresponding to decreasing and increasing exponentials, respectively. The parameter "s" is automatically deduced from the data.

It is also assumed that  $z(x--\sin f)=-\inf$ , such that  $y(x--\sin f)-->a$ .

If asymptote is None, the ansatz y(x) is fitted with a non-linear optimization. Otherwise, a linear fit with respect to  $z(x) := \log(\sin^* y(x) - asymptote)$  is performed.

This static method is equivalent to the "self.reduce" method of PolyExpFactory, but can be called also by other factories which are particular cases of PolyExpFactory, e.g., ExpFactory.

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#### **Parameters**

- instack -- x data values.
- outstack -- y data values.
- asymptote -- y(x->inf).
- order -- extrapolation order.
- **eps** -- epsilon to regularize log(sign (instack asymptote)) when the argument is to close to zero or negative.

```
class mitiq.factories.PolyFactory (scalars: Iterable[float], order: int)
```

Factory object implementing a zero-noise extrapolation algorithm based on a polynomial fit. Note: Richard-sonFactory and LinearFactory are special cases of PolyFactory.

```
reduce() \rightarrow float
```

Determines with a least squared method, the polynomial of degree equal to "self.order" which optimally fits the input data. The zero-noise limit is returned.

```
static\_reduce(instack: List[float], outstack: List[float], order: int) \rightarrow float
```

Determines with a least squared method, the polynomial of degree equal to 'order' which optimally fits the input data. The zero-noise limit is returned.

This static method is equivalent to the "self.reduce" method of PolyFactory, but can be called also by other factories which are particular cases of PolyFactory, e.g., LinearFactory and RichardsonFactory.

```
class mitig.factories.RichardsonFactory(scalars: Iterable[float])
```

Factory object implementing Richardson's extrapolation.

```
reduce() \rightarrow float
```

Returns the Richardson's extrapolation to the zero-noise limit.

### 3.2 Zero Noise Extrapolation

Zero-noise extrapolation tools.

```
mitiq.zne.execute_with_zne(qp:
                                                       Union[qiskit.circuit.quantumcircuit.QuantumCircuit,
                                      pyquil.quil.Program], executor: Callable[[Union[qiskit.circuit.quantumcircuit.QuantumCircui
                                      pyquil.quil.Program]],
                                                                     float],
                                                                                    fac:
                                                                                                       mi-
                                      tiq.factories.Factory
                                                                             None,
                                                                                              scale noise:
                                      Callable[[Union[qiskit.circuit.quantumcircuit.QuantumCircuit,
                                      pyquil.quil.Program], float], Union[qiskit.circuit.quantumcircuit.QuantumCircuit,
                                      pyquil.quil.Program]]
                                                                                     None)
                                      Callable[[Union[qiskit.circuit.quantumcircuit.QuantumCircuit,
                                      pyquil.quil.Program]], float]
```

Takes as input a quantum circuit and returns the associated expectation value evaluated with error mitigation.

#### **Parameters**

- qp -- Quantum circuit to execute with error mitigation.
- **executor** -- Function executing a circuit and producing an expectation value (without error mitigation).
- fac -- Factory object determining the zero-noise extrapolation algorithm. If not specified, LinearFactory([1.0, 2.0]) will be used.
- scale\_noise -- Function for scaling the noise of a quantum circuit. If not specified, a
  default method will be used.

pyquil.quil.Program]], float]
Takes as input a generic function ("executor"), difined by the user, which executes a circuit with an arbitrary backend and produces an expectation value.

Returns an error-mitigated version of the input "executor", having the same signature and automatically performing zero-noise extrapolation at each call.

#### **Parameters**

- **executor** -- Function (to be mitigated) executing a circuit and returning an expectation value.
- **fac** -- Factory object determining the zero-noise extrapolation algorithm. If not specified, LinearFactory([1.0, 2.0]) is used.
- scale\_noise -- Function for scaling the noise of a quantum circuit. If not specified, a default method is used.

mitiq.zne.qrun\_factory (fac: mitiq.factories.Factory, qp: Union[qiskit.circuit.quantumcircuit.QuantumCircuit, pyquil.quil.Program], executor: Callable[[Union[qiskit.circuit.quantumcircuit.QuantumCircuit, pyquil.quil.Program]], float], scale\_noise: Callable[[Union[qiskit.circuit.quantumcircuit.QuantumCircuit, pyquil.quil.Program], float], Union[qiskit.circuit.quantumcircuit.QuantumCircuit, pyquil.quil.Program]])  $\rightarrow$  None

Runs the factory until convergence executing quantum circuits with different noise levels.

#### **Parameters**

- fac -- Factory object to run until convergence.
- **qp** -- Circuit to mitigate.
- **executor** -- Function which executes a circuit and returns an expectation value.
- scale\_noise -- Function which scales the noise level of a quantum circuit.

mitiq.zne.run\_factory (fac: mitiq.factories.Factory, noise\_to\_expval: Callable[[float], float],  $max\_iterations: int = 100) \rightarrow None$ 

Runs a factory until convergence (or until the number of iterations reach "max\_iterations").

#### **Parameters**

- fac -- Instance of Factory object to be run.
- noise to expval -- Function mapping noise scale values to expectation vales.
- max iterations -- Maximum number of iterations (optional). Default value is 100.

 $\label{eq:mitiq.zne.zne_decorator} \begin{tabular}{ll} mitiq.zne.zne\_decorator (fac: mitiq.factories.Factory &= None, scale\_noise: \\ Callable[[Union[qiskit.circuit.quantumcircuit.QuantumCircuit, \\ pyquil.quil.Program], float], Union[qiskit.circuit.quantumcircuit.QuantumCircuit, \\ pyquil.quil.Program]] &= None) \end{tabular} \rightarrow \begin{tabular}{ll} Callable[[Union[qiskit.circuit.quantumcircuit.QuantumCircuit, \\ pyquil.quil.Program]], float] \end{tabular}$ 

Decorator which automatically adds error mitigation to any circuit-executor function defined by the user.

It is supposed to be applied to any function which executes a quantum circuit with an arbitrary backend and produces an expectation value.

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#### **Parameters**

- fac -- Factory object determining the zero-noise extrapolation algorithm. If not specified, LinearFactory([1.0, 2.0]) will be used.
- scale\_noise -- Function for scaling the noise of a quantum circuit. If not specified, a default method will be used.

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