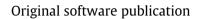
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# MISTIQS: An open-source software for performing quantum dynamics simulations on quantum computers

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#### ARTICLE INFO

Article history: Received 3 December 2020 Received in revised form 2 April 2021 Accepted 6 April 2021

*Keywords:* Quantum dynamics simulation Quantum computing

#### ABSTRACT

We present *MISTIQS*, a Multiplatform Software for Time-dependent Quantum Simulations. *MISTIQS* delivers end-to-end functionality for simulating the quantum many-body dynamics of systems governed by time-dependent Heisenberg Hamiltonians across multiple quantum computing platforms. It provides high-level programming functionality for generating intermediate representations of quantum circuits which can be translated into a variety of industry-standard representations. Furthermore, it offers a selection of circuit compilation and optimization methods and facilitates execution of the quantum circuits on currently available cloud-based quantum computing backends. *MISTIQS* serves as an accessible and highly flexible research and education platform, allowing a broader community of scientists and students to perform quantum many-body dynamics simulations on current quantum computers.

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#### Code metadata

Current Code version	v1.0
Permanent link to code/repository used of this code version	https://github.com/ElsevierSoftwareX/SOFTX-D-20-00090
Legal Code License	MIT License
Code Versioning system used	git
Software Code Language used	python
Compilation requirements, Operating environments & dependencies	Python 3.8, numpy, glob*, matplotlib*, qiskit*, pyquil*, cirq*
	*optional depending on use case
If available Link to developer documentation/manual	https://github.com/USCCACS/MISTIQS/tree/master/docs
Support email for questions	cdpowers@usc.edu

#### Software metadata

Current software version	v1.0
Permanent link to executables of this version	https://github.com/USCCACS/MISTIQS
Legal Software License	MIT License
Computing platform/Operating System	Linux
Installation requirements & dependencies	Python 3.8, numpy, matplotlib*, qiskit*, pyquil*, cirq*
	*optional depending on use case
If available Link to user manual – if formally published include a reference to	https://github.com/USCCACS/MISTIQS/tree/master/docs
the publication in the reference list	
Support email for questions	cdpowers@usc.edu

#### 1. Motivation and significance

\* Corresponding author. *E-mail address:* knomura@usc.edu (Ken-ichi Nomura). With Google's recent experimental realization of quantum supremacy for a proof-of-concept problem [1] and IBM's announced roadmap for scaling quantum computers up to over a

https://doi.org/10.1016/j.softx.2021.100696

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thousand qubits as early as 2023, there is a growing demand for the use of quantum computers for nontrivial scientific applications. A highly anticipated application is a universal simulator of quantum many-body systems, an idea originally conceived of by Richard Feynman in the 1980s [2] and later elaborated by Seth Lloyd [3]. The last decade has witnessed the growing success of quantum computing for simulating *static* properties of quantum systems, *i.e.*, the ground state energy of *small* molecules [4–9]. However, it remains a challenge to simulate quantum many-body *dynamics* on current-to-near-future noisy intermediate-scale quantum (NISQ) computers [10].

To facilitate the adoption of quantum computing for studying quantum dynamics, we have developed open-source software to perform non-trivial many-body quantum dynamics on the publicly available IBM-Q and Rigetti quantum computers. The landscape of quantum computing software has rapidly matured in recent years to include general-purpose platforms, such as Cirq [11] for developing quantum circuits, as well as problemspecific platforms, such as OpenFermion [12] for solving static electronic structure problems on quantum computers. However, no such platform is widely available for studying time-dependent quantum many-body dynamics. Here, we present MISTIQS (Multiplatform Software for Time-dependent Quantum Simulation), an open-source software package for simulating quantum manybody dynamics of systems that can be represented by the Heisenberg model, a ubiquitous model that captures the behavior of a variety of quantum materials and systems. An early prototype of this software was successfully used to simulate ultrafast control of emergent magnetism by terahertz radiation in atomically thin Re-doped MoSe<sub>2</sub> monolayers [13], and has since been expanded to simulate the dynamics of broader material systems that are described by the Heisenberg model.

MISTIQS also includes two quantum circuit compilers optimized for simulating a subgroup of the Heisenberg model known as the transverse field Ising model (TFIM). One is tailored to the native gate sets of IBM quantum computers, and one is tailored to the gate sets used by Rigetti quantum computers, as each gate set provides distinct opportunities for circuit compression in the gate patterns characteristic of TFIM dynamics simulations [14]. Their circuit compression algorithms, detailed in [14], allow these special-purpose compilers to significantly reduce the gate count of the circuits for simulating the many-body dynamics, while also significantly reducing the wall-clock compilation time over backend-native general-purpose compilers. Gate count reduction is particularly important for NISO devices, which suffer from relatively large gate error rates (ranging from 0.01% to 0.1% for singlequbit gates and ranging from 0.1% to 1% for two-qubit gates on superconducting quantum computers). In practice, this means that quantum circuits with larger numbers of gates tend to accumulate more errors. Therefore, quantum circuit compilers that reduce gate counts can enable more accurate simulations on NISQ devices by decreasing the compounding gate error [15]. In total, MISTIQS employs a user-friendly, object-orientated framework for formulating, optimizing, and executing quantum circuits for many-body dynamics simulations on quantum computers with the goal of expanding education and spurring the development of research in this field.

#### 2. Software description

*MISTIQS* is written in Python, with backend-specific libraries only imported as needed per each use case. *MISTIQS* provides a full-stack solution for the direct quantum simulation of spin systems governed by the Heisenberg model Hamiltonian, taking the following form for *N* spins:

$$H(t) = -\sum_{i=1}^{N-1} [J_x \sigma_i^x \sigma_{i+1}^x + J_y \sigma_i^y \sigma_{i+1}^y + J_z \sigma_i^z \sigma_{i+1}^z] - h(t) \sum_{i=1}^N \sigma_i^k \quad (1)$$

Here,  $J_x$ ,  $J_y$ , and  $J_z$  give the exchange interaction strengths between nearest neighbor spins in the *x*-, *y*-, and *z*-directions respectively. Superscript *k*, which can be either *x*, *y*, or *z*, represents the direction of the external magnetic field to which the spins are exposed. The time-dependent magnitude of this field is given by h(t), and  $\sigma_i^k$  is the *k*th Pauli matrix acting on qubit *i*. The dynamics of systems modeled by this class of Hamiltonians can be simulated on digital quantum computers by mapping the states of the spins to those of the qubits, and translating the Hamiltonian-dependent time-evolution operator into a quantum circuit. Execution of the resultant quantum circuits on a quantum computer produces results that can be post-processed to show the temporal evolution of the system.

The workflow for MISTIQS is described by Fig. 1. First, the user must define the coefficients of the Hamiltonian specific to the material system of interest, along with other simulation parameters such as number of time-steps, step-size, and quantum backend. *MISTIQS* then generates quantum circuits that simulate the time-evolution of the system. These circuits can then be executed on the chosen NISQ backend. Finally, the results can be post-processed to reveal the evolution of the spins over the course of the simulation. It is worth emphasizing that *MISTIQS* accepts a user-specified function for the time dependence of the external magnetic field, defined as h(t) in Eq. (1), allowing researchers to more accurately model the specific conditions of their experiments. The specifics of this full-stack functionality are shown in more detail in Fig. 2a.

The user can also choose to only use portions of *MISTIQS*'s functionality. For example, if the user just wants to output a list of quantum circuits compatible on IBM quantum devices, they can choose to skip circuit execution and post-processing. There is also the option to use the domain-specific compilers on externally generated circuits to output compiled circuits for IBM's or Rigetti's platforms.

#### 2.1. Software architecture

Upon downloading the software from https://github.com/USC CACS/MISTIQS, the following directories will be present:

- **src/:** Directory containing *MISTIQS* source code.
- docs/: Directory containing user's manual for MISTIQS.
- **examples**/: Directory containing demonstrative examples covering some different use cases of *MISTIQS*.

Upon running any portion of the software, the following subdirectory will be created:

• **data/:** Directory containing simulation results, graphics (if applicable), and the logfile generated by executing the software.

*MISTIQS* is comprised of three core modules, described below with additional information about their key member functions:

- **quantum\_circuits:** Code defining quantum logic gate and quantum circuit objects native to *MISTIQS* that allow it to operate above the syntax of any one quantum computing platform.
  - **Gate**: Takes as input a quantum gate name, rotation angles (if applicable), and the set of qubits it acts on to create an intermediate quantum gate representation.
  - **Program**: Builds an intermediate quantum circuit representation from a list of **Gate** objects.
- **Heisenberg:** Code that generates, compiles, and executes quantum circuits using user-defined Hamiltonian and simulation as input.

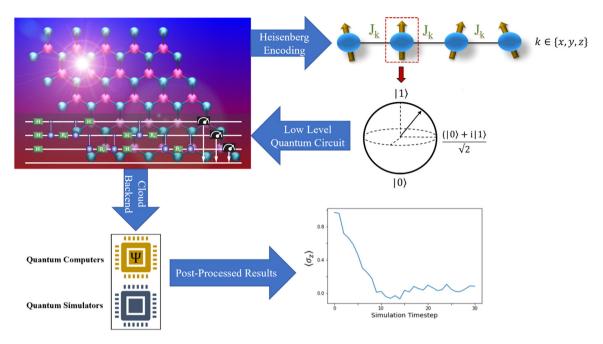


Fig. 1. Process overview of simulating Heisenberg spin Hamiltonians on digital quantum computers and quantum simulators.

- **generate\_circuits**: From the input file, this method uses the user-specified Hamiltonian parameters, as well as user choices regarding backend and compilation. First, it generates intermediate quantum circuits needed to simulate the time-evolution of the system, then it compiles these circuits into the native gate sets and syntax of the user-specified quantum computing backend.
- **connect\_ibm**: For IBM use cases, this method connects to the IBMQ backend (needed for quantum circuit compilation and execution). Takes in IBMQ API key and account overwrite boolean as needed.
- **run\_circuits**: From the input file, this method uses the backend and quantum device choice, as well as user choices regarding post-processing of results. Its functionality is to execute the quantum circuits on the user-specified quantum device and post-process the results to the user's specifications.
- **ds\_compiler:** Code for domain-specific compilation of circuits for the TFIM (which is a special case of the general Hamiltonian in Eq. (1)) into the native gate sets employed by IBM and Rigetti.
  - **ds\_compile\_ibm:** Domain-specific quantum compiler for circuits simulating time-evolution of the TFIM. Takes in a high-level quantum circuit and returns a compiled quantum circuit executable on IBM quantum computers.
  - **ds\_compile\_rigetti:** Domain-specific quantum compiler for circuits simulating time-evolution of the TFIM. Takes in a high-level quantum circuit and returns a compiled quantum circuit executable on Rigetti quantum computers.

The described roles and key member functions of these modules are illustrated in Fig. 2b. In this figure, information inlets and outlet paths are also highlighted, and the optional compiler-only use case is included in the context of the nominal workflow.

This multi-output architecture allows *MISTIQS* to serve a variety of education-facing and research-facing applications; utilizing the full feature stack allows for streamlined visualizations of key observable evolutions under the Hamiltonian of interest, while the ability to output the generated simulation circuits allows for researchers to utilize their own compilers or transform circuits into the syntax appropriate for alternate quantum hardware backends.

#### 2.2. Prerequisites

The *MISTIQS* codebase was intentionally written to minimize the number of required external libraries; it only requires the *numpy* library to be installed. If the user would like to generate plots of the simulation results, then the *matplotlib* library must be installed as well. Otherwise, any additional required libraries are solely dependent on the quantum-computing platform the user would like to produce quantum circuits for; qiskit [16] is required to generate circuits for IBM devices, pyquil [17,18] is required for Rigetti use cases, and cirq [11] is likewise required for Google use cases.

#### 2.3. Generalized workflow

To use *MISTIQS*, the user must first define any parameters that need to be changed from their default values in a simple textbased input file. The customizable parameters are described in the appendix. A Heisenberg object is then created, which stores all of the input system parameters. Note that while attributes of the object are initially set from the input file, they can be changed later in the code as any time. Next, the software transforms the input Hamiltonian and simulation parameters into a series of quantum programs (an intermediate representation of quantum circuits) that will simulate the dynamics of the system of interest via Trotter approximation. This intermediate circuit representation (native to MISTIQS) facilitates the transformation of the quantum circuits into the equivalent native circuits for various quantum computing platforms. This is crucial because quantum computing platforms can vary widely in not only in circuit object syntax, but also the native quantum gate set allowed on their hardware.

*MISTIQS* then compiles the circuits, if desired, using either the compilers native to the specified quantum computing platform

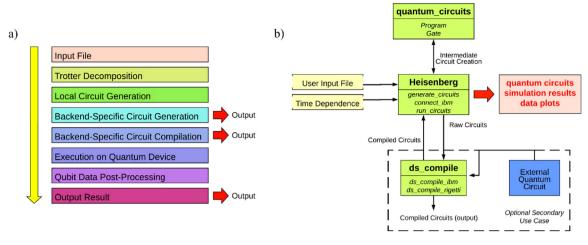


Fig. 2. (a) Full-stack representation of MISTIQS workflow. (b) Key roles and member functions of MISTIQS modules.

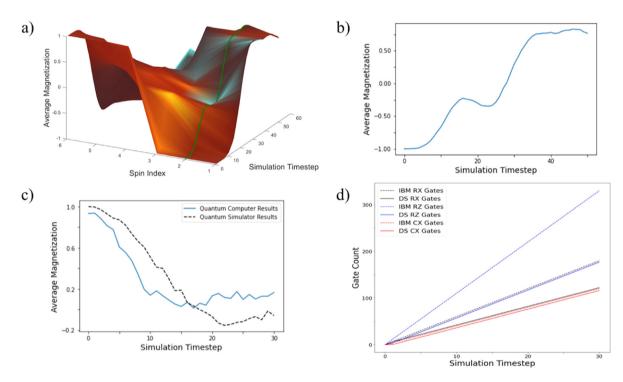


Fig. 3. (a) Average magnetization of the domain wall example spin chain over time. (b) Average magnetization of the second spin over time as output by MISTIQS. (c) Example average magnetization evolution of a TFIM chain spin executed by MISTIQS on both a noiseless quantum simulator and an IBM quantum computer.(d) Comparison of quantum gate counts in a sample TFIM circuit when compiled with the IBM native compiler and the domain-specific compiler integrated into MISTIQS.

or the built-in domain-specific quantum compilers. If execution of the quantum simulation is desired, *MISTIQS* will run the circuits on the specified quantum device. Once successfully run, the software can post-process the results and save the average magnetization data for each qubit over the duration of the simulation in individual output files. It can also generate and save plots of this data. A logfile is kept during each use, and this, along with all generated qubit data and plots, will be saved in a **data** folder.

The memory size of quantum dynamics simulation scales as O(N) on a quantum computer and  $O(2^N)$  on a quantum computer simulator on a classical computer for N spins [19], while the runtime has an additional factor of O(T) for the simulated timespan of T. Mathematical structures can be utilized to reduce the O(T) factor to O(1) for special cases [20,21], while different algorithms trade the spatial and temporal complexities on a classical computer [1].

#### 2.4. Software functionalities

*MISTIQS* can perform quantum dynamics simulations for any variant of the time-dependent Heisenberg model, including the important XX chain model, XXZ chain model, and TFIM [22]. The time-dependent external magnetic field, set to a sinusoidal function of a tunable frequency by default, can also be customized by the user, allowing for greater flexibility in the pulse shapes that can be simulated by this software. Another key functionality of the software is quantum circuit compilation, as its built-in domain-specific compilers are optimized for TFIM simulations on IBM and Rigetti backends.

#### 3. Illustrative examples

#### 3.1. XX chain model domain wall quench simulation

In this example, we use a 16-qubit noiseless quantum simulator to explore the dynamics of a 6-spin XX chain forming a domain wall. We are interested in measuring and plotting the average magnetization of each spin over time. An XX spin chain is a subcase of Eq. (1) where  $J_x = J_y \neq 0$  and  $J_z = h(t) = 0$ , with  $J_x$  set by the material being simulated. While it is one of the simplest subsets of the Heisenberg model, it has shown relevance in entanglement teleportation and low-energy quantum chromodynamics (QCD) [23,24].

For this example, we configure the initial spins of the spin chain by setting the *initial\_spins* parameter so that half of the spins start in a spin-down configuration in order to form a domain wall. To run the simulation, we first initialize the *Heisenberg* object with the relevant input file, then generate the circuits with the *generate\_circuits()* method, then run the simulation with the *run\_simulation()* method. Fig. 3a illustrates the spin states of each spin in this domain wall example over the course of a 50 fs simulation, with the evolution of the second spin highlighted in green, and the corresponding plot of the evolution of the second spin produced by *MISTIQS* is shown in Fig. 3b. The results align with those presented in Fig. 2 of Ref. [22].

## 3.2. Quantum ising model simulation of emergent magnetism in ${\rm MoSe}_2$

In this example, we will explore the emergent magnetism of a Re-doped MoSe<sub>2</sub> monolayer, which we model with the TFIM, by performing a 5-qubit quantum simulation on IBM's 5-qubit "Ourense" quantum computer. TFIM spin chains are governed by Eq. (1) where  $J_x = J_y = 0$ ,  $J_z \neq 0$ , and k = x. Physically, this describes a system with inter-spin coupling only in the zdirection in the presence of an external magnetic field aligned with the x-direction. To run a quantum simulation of such a system with MISTIOS, set the *Iz* parameter to the value matching the system of interest, set the *ext\_dir* parameter to 'X', then set the *h\_ext* to a nonzero value. Then, the *num\_gubits* parameter is set accordingly, and the initial\_spins parameter is set to reflect standard spin-up configuration. Other general simulation parameters, such as simulation length and backend, are also set. A complete example input file, **TFIM input file.txt**, is found in the **examples** directory.

To run the simulation, a *Heisenberg* object is created with the relevant input file, then the user is connected to the IBM Q backend by running the *connect\_IBM()* method. Next, the quantum circuits are generated by running the *generate\_circuits()* method, and the simulation is executed and post-processed by running the *run\_circuits()* method. The resulting plot of average magnetization should resemble Fig. 3c, although differences will inevitably arise due to device noise.

#### 3.3. Standalone compiler for the quantum ising problem

In this example, we will use the domain-specific (DS) compilers built into *MISTIQS* to optimize the quantum circuits of a TFIM simulation. The user need only import the ds\_compiler module, and call the *ds\_compile* method on the circuits, providing the desired backend to compile to as an argument. If running the sample circuits described above, this backend argument would be "ibm". The optimized circuits will be returned as a new list. Input circuits may be generated by initializing a *Heisenberg* object with the TFIM example input file (see Section 3.2), and using the output of the *return\_circuits()* method of the *Heisenberg* object. Alternatively, the user may input externally created circuits.

The **examples** directory contains an example use case that directly implements these steps, then runs the same circuits through IBM's native compiler to directly compare the performances of the two compilers. This will produce a comparison of quantum gate counts between the identical circuits compiled by the domain-specific compiler built into *MISTIQS* and the native IBM compiler resembling Fig. 3d.

#### 4. Impact

The three major impacts of *MISTIQS* are: (1) to provide an open-source platform enabling accessible, end-to-end quantum dynamics simulations across the major quantum computing platforms open to public use; (2) to accelerate quantum dynamics simulation research by wrapping quantum circuit formation, compilation, execution, and basic post-processing into a user-friendly package; and (3) to facilitate quantum computing education, where the accompanying examples and tutorials can be used as self-contained course modules in classroom and workshop settings.

*MISTIQS* aims to bridge the gap between quantum computation and fields such as chemistry, materials science, and condensed matter physics by making quantum dynamics simulations on NISQ-era devices accessible to a wider range of researchers. It is our hope that this high-level programming library can spur new acceleration in exploring the power of current quantum devices across a wide range of applications. Already, beta versions of this software have been successfully used to perform quantum simulations of ultrathin materials under the TFIM exploring emergent magnetism phenomena [13].

#### 5. Conclusions

In summary, *MISTIQS* is an end-to-end software solution for performing quantum simulations of systems governed by any subset of the time-dependent Heisenberg model Hamiltonians on current quantum computers. By simplifying and streamlining the workflow from the material's Hamiltonian to the post-processed quantum computer data, as well as providing effortless crossplatform functionality between IBM, Google, and Rigetti quantum computing platforms, researchers outside of the field of quantum computation can easily leverage the power of quantum computers in their work. *MISTIQS* has already proven its utility in the simulation of quantum materials, and is expected to accelerate quantum simulation research in a wide variety of applications including quantum chemistry, materials science, and condensed matter physics.

#### **Declaration of competing interest**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

#### Acknowledgment

This work was supported as part of the Computational Materials Sciences Program funded by the U.S. Department of Energy, Office of Science, Basic Energy Sciences, under Award Number DE-SC0014607.

#### Appendix

#### List and Descriptions of Customizable Parameters

Parameter name	Description
Jx	Controls inter-spin coupling in the X direction
Ју	Controls inter-spin coupling in the Y direction
Jz	Controls inter-spin coupling in the Z direction
h_ext	Controls amplitude of the Hamiltonian's
	external magnetic field term
ext_dir	Sets the direction of the external magnetic
	field
num_qubits	Specifies the number of qubits of the quantum
	simulation
initial_spins	Sets the initial spins of each qubit
delta_t	Sets the timestep of the quantum simulation
steps	Specifies the number of timesteps in the
	quantum simulation
QCQS	Specifies whether the circuits will be run on a
	quantum computer or a quantum simulator
shots	Sets the number of shots to execute on the
	quantum device
noise_choice	If using a quantum simulator, this sets
	whether a noisy simulator is desired.
device_choice	Specify the quantum device to generate the
	circuits for and\or run the circuits on
plot_flag	Sets whether post-processed results from
	running the quantum simulation should be
	plotted and saved.
time_dep_flag	Specifies whether time dependence is desired
_	in the Hamiltonian external field term
freq	Specifies the frequency of the optional time
	dependent function in the Hamiltonian
	external field term
custom_time_dep	Sets whether the software should look for a
	user-defined time dependence function for the
	Hamiltonian external field term
backend	Sets the choice of quantum computing
aamnila	platform (IBM, Rigetti, Google)
compile	Sets whether the software should compile the
auto amant compile	generated quantum circuits
auto_smart_compile	Sets whether the integrated domain-specific compilers should automatically be applied to
	detected TFIM circuits (IBM and Rigetti
	backends only)
default compiler	Sets whether the software defaults to
default_compiler	compilers native to the backend of choice or
	the integrated domain-specific compilers (IBM
	and Rigetti backends only)
	and Rigetti Dackenus only

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