WNTR Documentation

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Contents

1	Disclaimer	2
2	Abbreviations	5
3	Acknowledgements	6
4	Overview	1
5	Installation	4
6	Software framework and limitations	8
7	Units	11
8	Getting started	13
9	Water network model	15
10	Water network controls	16
11	NetworkX graph	19
12	Hydraulic simulation	21
13	Water quality simulation	25
14	Simulation results	27
15	Disaster scenarios	30
16	Resilience metrics	33
17	Stochastic simulation	39
18	Copyright and license	41
19	Software quality assurance	42
20	References	44

References 44

1 Disclaimer

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List of Tables

6.1	WNTR Subpackages
6.2	Classes in the <i>network</i> Subpackage
6.3	Classes in the <i>sim</i> Subpackage
7.1	EPANET Hydraulic Unit Conventions
7.2	EPANET Water Quality Unit Conventions
7.3	EPANET Energy Unit Conventions
8.1	Description of WNTR Example Files
10.1	Condition Classes
16.1	Topographic Resilience Metrics
16.2	Hydraulic Resilience Metrics
16.3	Water Quality Resilience Metrics
16.4	Water Security Resilience Metrics
16.5	Economic Resilience Metrics

List of Figures

4.1	WNTR code repository on GitHub, integrated development environment using Spyder, and sample
	graphics generated by WNTR
4.2	Flowchart illustrating four example use cases
5.1	Opening a Python console from a command prompt.
5.2	Opening a Python console using Spyder
11.1	Example directed multigraph
12.1	Example relationship between pressure (p) and demand (d) using both the demand-driven and pressure
	dependent demand simulations
12.2	Example relationship between leak demand (d) and pressure (p)
14.1	Conceptual representation of Panels used to store simulation results
14.2	Example time-series graphic
14.3	Example network graphic
16.1	Example state transition plot and network graphic used to visualize resilience
17.1	

2 Abbreviations

API: Application programming interface

EPA: Environmental Protection Agency

IDE: Integrated development environment

SI: International System of Units

US: United States

WNTR: Water Network Tool for Resilience

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4 Overview

Drinking water systems face multiple challenges, including aging infrastructure, water quality concerns, uncertainty in supply and demand, natural disasters, environmental emergencies, and cyber and terrorist attacks. All of these have the potential to disrupt a large portion of a water system causing damage to infrastructure and outages to customers. Increasing resilience to these types of hazards is essential to improving water security.

As one of the United States (US) sixteen critical infrastructure sectors, drinking water is a national priority. The National Infrastructure Advisory Council defined infrastructure resilience as "the ability to reduce the magnitude and/or duration of disruptive events. The effectiveness of a resilient infrastructure or enterprise depends upon its ability to anticipate, absorb, adapt to, and/or rapidly recover from a potentially disruptive event" [NIACO9].

Being able to predict how drinking water systems will perform during disruptive incidents and understanding how to best absorb, recover from, and more successfully adapt to such incidents can help enhance resilience. Simulation and analysis tools can help water utilities to explore the capacity of their systems to handle disruptive incidents and guide the planning necessary to make systems more resilient over time [USEPA14].

The Water Network Tool for Resilience (WNTR, pronounced *winter*) is a Python package designed to simulate and analyze resilience of water distribution networks. Here, a network refers to the collection of pipes, pumps, nodes, and valves that make up a water distribution system. WNTR has an application programming interface (API) that is flexible and allows for changes to the network structure and operations, along with simulation of disruptive incidents and recovery actions. WNTR can be installed through the United States Environmental Protection Agency (US EPA) GitHub organization at https://github.com/USEPA/WNTR. An integrated development environment (IDE), like Spyder, is recommended for users and developers. Figure 4.1 shows the GitHub webpage, Spyder IDE, and sample graphics generated by WNTR.

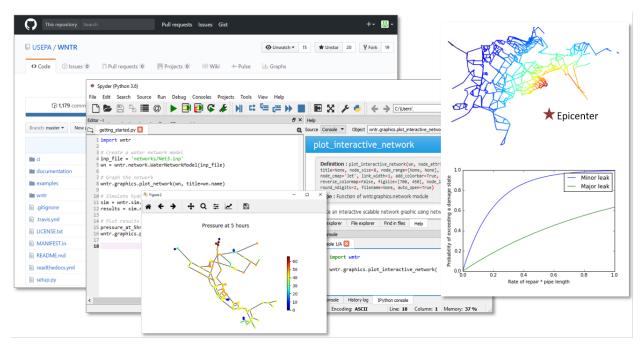


Figure 4.1: WNTR code repository on GitHub, integrated development environment using Spyder, and sample graphics generated by WNTR.

WNTR includes capabilities to:

- **Generate water network models** from scratch or from existing EPANET-formatted water network model input (EPANET INP) files [Ross00]
- · Modify network structure by adding/removing components and changing component characteristics

- Modify network operation by changing initial conditions, component settings, and time-based and conditional controls
- Add disruptive incidents including damage to tanks, valves, and pumps, pipe leaks, power outages, contaminant injection, and changes to supply and demand
- Add response/repair/mitigation strategies including leak repair, retrofitted pipes, power restoration, and backup generation
- Simulate network hydraulics and water quality using pressure dependent demand or demand-driven hydraulic simulation, and the ability to pause and restart simulations
- Run probabilistic simulations using fragility curves for component failure
- Compute resilience using topographic, hydraulic, water quality/security, and economic metrics
- Analyze results and generate graphics including state transition plots, network graphics, and network animation

These capabilities can be linked together in many different ways. Figure 4.2 illustrates four example use cases, from simple to complex.

While EPANET includes some features to model and analyze water distribution system resilience, WNTR was developed to greatly extend these capabilities. WNTR provides a flexible platform for modeling a wide range of disruptive incidents and repair strategies, and pressure dependent demand hydraulic simulation is included to model the system during low pressure conditions. Furthermore, WNTR is compatible with widely used scientific computing packages for Python, including NetworkX [HaSS08], Pandas [Mcki13], Numpy [VaCV11], Scipy [VaCV11], and Matplotlib [Hunt07]. These packages allow the user to build custom analysis directly in Python, and gain access to tools that analyze the structure of complex water distribution networks, analyze time-series data from simulation results, run simulations efficiently, and create high-quality graphics and animations.

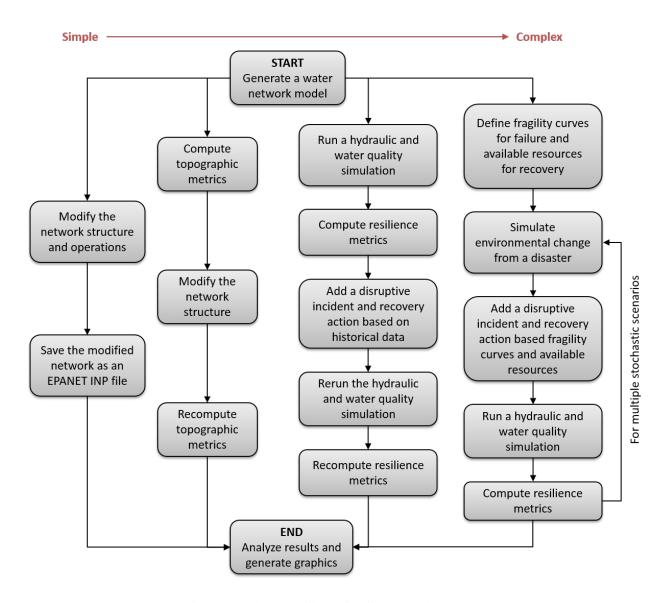


Figure 4.2: Flowchart illustrating four example use cases.

5 Installation

WNTR can be installed as a Python package using standard open source software tools.

Step 1: Setup your Python environment

Python can be installed on Windows, Linux, and Mac OS X operating systems. WNTR requires Python (versions 2.7, 3.4, 3.5, or 3.6) along with several Python package dependencies. Python distributions, such as Anaconda, are recommended to manage the Python environment. Anaconda can be downloaded from https://www.continuum.io/downloads. General information on Python can be found at https://www.python.org/.

Anaconda includes the Python packages needed for WNTR, including Numpy, Scipy, NetworkX, Pandas, and Matplotlib. For more information on Python package dependencies, see *Requirements*.

Anaconda also comes with Spyder, an IDE, that includes enhanced editing and debug features along with a graphical user interface. Debugging options are available from the toolbar. Code documentation is displayed in the object inspection window. Pop-up information on class structure and functions is displayed in the editor and console windows.

To open a Python console, open a command prompt (cmd.exe on Windows, terminal window on Linux and Mac OS X) and run 'python', as shown in Figure 5.1, or open a Python console using an IDE, like Spyder, as shown in Figure 5.2.

```
C:\Users>python — \( \times\) X

C:\Users>python

Python 3.6.0 |Anaconda 4.3.1 (64-bit)| (default, Dec 23 2016, 11:57:41) [MSC v.1900 64 bit (AMD64)] on win32

Type "help", "copyright", "credits" or "license" for more information.

>>>
```

Figure 5.1: Opening a Python console from a command prompt.

Step 2: Install WNTR

The installation process differs for users and developers. Installation instructions for both types are described below.

For users: Users can install WNTR using pip, which is a command line software tool used to install and manage Python packages. It can be downloaded from https://pypi.python.org/pypi/pip.

To install WNTR using pip, open a command prompt and run:

```
pip install wntr
```

This will install the latest stable version of WNTR from https://pypi.python.org/pypi/wntr.

Note: A WNTR installation using pip will not include the examples folder, which is referenced throughout this manual.

Users can also download a zip file that includes source files and the examples folder from the US EPA GitHub organization. To download the master (development) branch, go to https://github.com/USEPA/WNTR, select the "Clone or download" button and then select "Download ZIP." This downloads a zip file called WNTR-master.zip. To download a specific release, go to https://github.com/USEPA/WNTR/releases and select a zip file. The software can then be installed by running a Python script, called setup.py, that is included in the zip file.

To build WNTR from the source files in the zip file, open a command prompt and run:

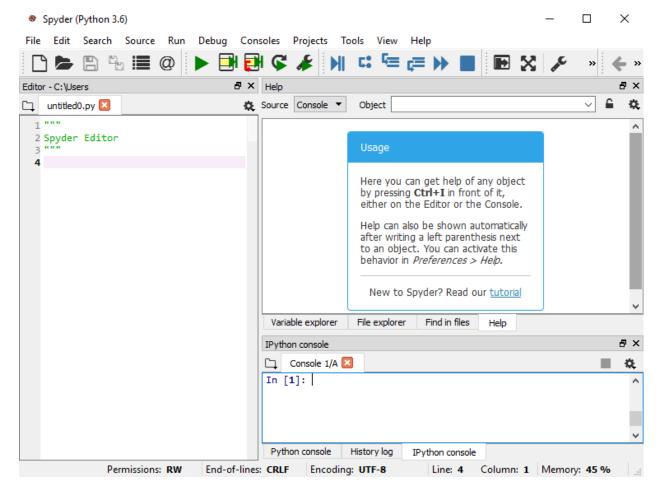


Figure 5.2: Opening a Python console using Spyder.

```
unzip WNTR-master.zip
cd WNTR-master
python setup.py install
```

For developers: Developers can install and build WNTR from source using git, which is a command line software tool for version control and software development. It can be downloaded from http://git-scm.com.

To build WNTR from source using git, open a command prompt and run:

```
git clone https://github.com/USEPA/WNTR
cd wntr
python setup.py develop
```

This will install the master (development) branch of WNTR from https://github.com/USEPA/WNTR. More information for developers can be found in the *Software quality assurance* section.

Step 3: Test installation

To test that WNTR is installed, open a Python console and run:

```
import wntr
```

If WNTR is installed properly, Python proceeds to the next line. No other output is printed to the screen.

If WNTR is **not** installed properly, the user will see the following ImportError:

```
ImportError: No module named wntr
```

5.1 Requirements

Requirements for WNTR include Python (2.7, 3.4, 3.5, or 3.6) along with several Python packages. The following Python packages are required:

- Numpy [VaCV11]: used to support large, multi-dimensional arrays and matrices, http://www.numpy.org/
- Scipy [VaCV11]: used to support efficient routines for numerical integration, http://www.scipy.org/
- NetworkX [HaSS08]: used to create and analyze complex networks, https://networkx.github.io/
- Pandas [Mcki13]: used to analyze and store time series data, http://pandas.pydata.org/
- enum34 (for Python 2.7): used to add enumerated type support for Python 2.7, https://pypi.python.org/pypi/enum34

These packages are included in the Anaconda Python distribution.

5.2 Optional dependencies

The following Python packages are optional:

- Matplotlib [Hunt07]: used to produce figures, http://matplotlib.org/
- Plotly [SPHC16]: used to produce interactive scalable figures, https://plot.ly/
- xlwt [Xlwt16]: used to read/write to Microsoft® Excel® spreadsheets, http://xlwt.readthedocs.io
- Numpydoc [VaCV11]: used to build the user manual, https://github.com/numpy/numpydoc
- nose: used to run software tests, http://nose.readthedocs.io



6 Software framework and limitations

Before using WNTR, it is helpful to understand the software framework. WNTR is a Python package, which contains several object-oriented subpackages, listed in Table 6.1. Each subpackage contains modules which contain classes, methods, and functions. See api_documentation for more information on the code structure. The classes used to generate water network models and run simulations are described in more detail below, followed by a list of software limitations.

Table 6.1: WNTR Subpackages

Sub-	Description
pack-	
age	
epanet	Contains EPANET 2 compatibility functions for WNTR.
metric	sContains methods to compute resilience, including hydraulic, water quality, water security, and economic
	metrics. Methods to compute topographic metrics are included in the wntr.network.graph module.
networ	kContains methods to define a water network model, network controls, and graph representation of the
	network.
scenar	iGontains methods to define disaster scenarios and fragility/survival curves.
sim	Contains methods to run hydraulic and water quality simulations using the water network model.
graphi	Sontains methods to generate graphics.
utils	Contains helper functions.

6.1 Water network model

The network subpackage contains classes to define the water network model, network controls, and graph representation of the network. These classes are listed in Table 6.2. Water network models can be built from scratch or built directly from EPANET INP files. Additionally, EPANET INP files can be generated from water network models.

Table 6.2: Classes in the *network* Subpackage

Class	Description	
WaterNet wood with the work models, including methods to read and write EPANET		
	INP files, and access/add/remove/modify network components. This class links to additional model	
	classes (below) which define network components, controls, and model options.	
Junction	Contains methods to define junctions. Junctions are nodes where links connect. Water can enter or	
	leave the network at a junction.	
Reservoi	rContains methods to define reservoirs. Reservoirs are nodes with an infinite external source or sink.	
Tank	Contains methods to define tanks. Tanks are nodes with storage capacity.	
Pipe	Contains methods to define pipes. Pipes are links that transport water.	
Pump	Contains methods to define pumps. Pumps are links that increase hydraulic head.	
Energy	Contains attributes for specifying global energy prices and global pump efficiencies.	
Valve	Contains methods to define valves. Valves are links that limit pressure or flow.	
Curve	Contains methods to define curves. Curves are data pairs representing a relationship between two	
	quantities. Curves are used to define pump curves.	
Source	Contains methods to define sources. Sources define the location and characteristics of a substance	
	injected directly into the network.	
Demands	Contains methods to define multiple demands per junction. Demands are the rate of withdrawal from	
	the network.	
Pattern	Contains methods to define patterns. Demands, reservoir heads, pump schedules, and water quality	
	sources can have patterns associated with them.	
TimeCont	r6dntains methods to define time controls. Time controls define actions that start or stop at a particular	
	time.	
Conditio	nethods to define conditional controls. Conditional controls define actions that start or stop	
	based on a particular condition in the network.	
WaterNet	we contrains invented to define model options, including the simulation duration and time step.	

6.2 Simulators

The sim subpackage contains classes to run hydraulic and water quality simulations using the water network model. WNTR contains two simulators: the EpanetSimulator and the WNTRSimulator. These classes are listed in Table 6.3.

Table 6.3: Classes in the sim Subpackage

Class	Description
Epane	t Then Eplanet Simulator uses the EPANET 2 Programmer's Toolkit [Ross00] to run demand-driven hydraulic
	simulations and water quality simulations. When using the EpanetSimulator, the water network model
	is written to an EPANET INP file which is used to run an EPANET simulation. This allows the user to
	read in EPANET INP files, modify the model, run an EPANET simulation, and analyze results all within
	WNTR.
WNTRS	i The WNFR Simulator uses custom Python solvers to run demand-driven and pressure dependent demand
	hydraulic simulation and includes models to simulate pipe leaks. The WNTRSimulator does not perform
	water quality simulations.

6.3 Limitations

Current software limitations are noted:

- Certain EPANET INP model options are not supported in WNTR, as outlined below.
- Pressure dependent demand hydraulic simulation and leak models are only available using the WNTRSimulator.

• Water quality simulations are only available using the EpanetSimulator.

WNTR reads in and writes all sections of EPANET INP files. This includes the following sections: [BACKDROP], [CONTROLS], [COORDINATES], [CURVES], [DEMANDS], [EMITTERS], [ENERGY], [JUNCTIONS], [LABELS], [MIXING], [OPTIONS], [PATTERNS], [PIPES], [PUMPS], [QUALITY], [REACTIONS], [REPORT], [RESERVOIRS], [RULES], [SOURCES], [TAGS], [TANKS], [TIMES], [TITLE], [VALVES], and [VERTICES].

However, the following model options cannot be modified/created in WNTR:

- [EMITTERS] section
- [LABELS] section
- [MIXING] section
- [VERTICES] section

While the EpanetSimulator uses all EPANET model options, several model options are not used by the WNTRSimulator. Of the EPANET model options that directly apply to hydraulic simulations, **the following options are not supported by the WNTRSimulator**:

- [EMITTERS] section
- D-W and C-M headloss options in the [OPTIONS] section (H-W option is used)
- · Accuracy, unbalanced, demand multiplier, and emitter exponent from the [OPTIONS] section
- Multipoint curves in the [CURVES] section (3-point curves are supported)
- Pump speed in the [PUMPS] section
- Volume curves in the [TANKS] section
- Rule timestep, pattern start, report start, start clocktime, and statistics in the [TIMES] section
- PSV, PBV, and GPV values in the [VALVES] section

Future development of WNTR will address these limitations.

7 Units

All data in WNTR is stored in SI (International System) units:

- Length = m
- Diameter = m
- Water pressure = m (this assumes a fluid density of $1000 \ kg/m^3$)
- Elevation = m
- Mass = kq
- Time = s
- Concentration = kg/m^3
- Demand = m^3/s
- Velocity = m/s
- Acceleration = $g (1 \ g = 9.81 \ m/s^2)$
- Energy = J
- Power = W
- Pressure = Pa
- Mass injection = kg/s
- Volume = m^3

WNTR is compatible with all EPANET unit conventions. When using an EPANET INP file to generate a water network model, WNTR converts model parameters using the units defined in the **Units** and **Quality** options of the EPANET INP file. These options define the mass and flow units for the model. Some units also depend on the equation used for pipe roughness headloss and on the reaction order specified. Table 7.1, Table 7.2, and Table 7.3 provide information on EPANET unit conventions (modified from [Ross00]).

Table 7.1: EPANET Hydraulic Unit Conventions

Hydraulic parameter	US customary units	SI-based units
Flow	flow can be defined as: • CFS: ft ³ /s	flow can be defined as: • LPS: L/s
	• GPM: gal/min	• LPM: L/min
	MGD: million gal/day	MLD: million L/day
	• IMGD: million imperial	• CMH: m ³ /hr
	gal/day	• CMD: m ³ /day
	AFD: acre-feet/day	
Demand	flow	flow
Diameter: pipes	in	mm
Diameter: tanks	ft	m
Elevation	ft	m
Hydraulic head	ft	m
Length	ft	m
Emitter coefficient	flow / sqrt(psi)	flow / sqrt(m)
Friction factor	unitless	unitless
Minor loss coefficient	unitless	unitless
Pressure	psi	m or kPa
Roughness coeff: D-W	10 ⁻³ ft	mm
Roughness coeff: H-W, C-M	unitless	unitless
Velocity	ft/s	m/s
Volume	ft ³	m ³

Table 7.2: EPANET Water Quality Unit Conventions

Water quality parameter	US customary units	SI-based units
Concentration	mass /L where mass can be defined as	mass /L where mass can be defined as
	mg or ug	mg or ug
Bulk reaction coefficient:	1/day	1/day
order-1		
Wall reaction coefficient:	mass /ft ² /day	mass /m ² /day
order-0		
Wall reaction coefficient:	ft/day	m/day
order-1		
Reaction rate	mass /L/day	mass /L/day
Source mass injection rate	mass/min	mass/min
Water age	hours	hours

Table 7.3: EPANET Energy Unit Conventions

Energy parameter	US customary units	SI-based units
Energy	kW-hours	kW-hours
Efficiency (pumps)	percent	percent
Power	hp (horse-power)	kW

When running analysis in WNTR, all input values (i.e., time, pressure threshold, node demand) should be specified in SI units. All simulation results are also stored in SI units and can be converted to other units if desired. The SymPy Python package can be used to convert between units [JCMG11].

8 Getting started

To start using WNTR, open a Python console and import the package:

```
import wntr
```

A simple script, **getting_started.py**, is included in the examples folder. This example demonstrates how to:

- Import WNTR
- · Generate a water network model
- Simulate hydraulics
- Plot simulation results on the network

Additional examples, listed in Table 8.1, are included in the examples folder.

Table 8.1: Description of WNTR Example Files

Example file	Description
wa-	Generate and modify water network models
ter_network_model.py	
networkx_graph.py	Generate a NetworkX graph from a water network model
hy-	Simulate hydraulics using the EPANET and WNTR simulators
draulic_simulation.py	
wa-	Simulate water quality using EPANET
ter_quality_simulation.p	y
simulation_results.py	Extract information from simulation results
disaster_scenarios.py	Define disaster scenarios, including power outage, pipe leak, and changes to supply and
	demand
resilience_metrics.py	Compute resilience metrics, including topographic, hydraulic, water quality, water secu-
	rity, and economic metrics
stochas-	Run a stochastic simulation
tic_simulation.py	
fragility_curves.py	Define fragility curves
interac-	Create interactive network and time series graphics
tive_graphics.py	
animation.py	Animate network graphics

Several EPANET INP files are included in the examples/network folder. Example networks range from a simple 9 node network to a 3,000 node network. Additional network models can be downloaded from the University of Kentucky Water Distribution System Research Database at http://www.uky.edu/WDST/database.html.

9 Water network model

The water network model includes junctions, tanks, reservoirs, pipes, pumps, valves, demand patterns, pump curves, controls, sources, simulation options, and node coordinates. Water network models can be built from scratch or built directly from an EPANET INP file. Sections of EPANET INP file that are not compatible with WNTR are described in *Limitations*. The example **water_network_model.py** can be used to generate, save, and modify water network models.

A water network model can be created by adding components to an empty model:

A water network model can also be created directly from an EPANET INP file:

```
wn = wntr.network.WaterNetworkModel(inp_file)
```

The water network model can be written to a file in EPANET INP format. By default, files are written in LPS units. The EPANET INP file will not include features not supported by EPANET (i.e., pressure dependent demand simulation options).:

```
wn.write_inpfile('filename.inp')
```

For more information on the water network model, see WaterNetworkModel in the API documentation.

10 Water network controls

One of the key features of water network models is the ability to control pipes, pumps, and valves using simple and complex conditions. EPANET uses "controls" and "rules" to define conditions [Ross00]. A control is a single action (i.e., closing/opening a link or changing the setting) based on a single condition (i.e., time based or tank level based). A rule is more complex; rules take an IF-THEN-ELSE form and can have multiple conditions and multiple actions in each of the logical blocks. WNTR supports EPANET's rules and controls when generating a water network model from an EPANET INP file and simulating hydraulics using either the EpanetSimulator or the WNTRSimulator. WNTR includes additional options to define controls that can be used by the WNTRSimulator.

The basic steps to define a control for a water network model are:

- 1. Define the control action(s)
- 2. Define condition(s) (i.e., define what should cause the action to occur)
- 3. Define the control or rule using the control action(s) and condition(s)
- 4. Add the control or rule to the network

These steps are defined below. Examples use the "Net3.inp" EPANET INP file to generate the water network model object, called *wn*.

10.1 Control actions

Control actions tell the simulator what to do when a condition becomes "true." Control actions are created using the ControlAction class. A control action is defined by a target link, the property to change, and the value to change it to. The following example creates a control action that opens pipe 330:

```
>>> import wntr.network.controls as controls
>>> l1 = wn.get_link('330')
>>> act1 = controls.ControlAction(l1, 'status', 1)
>>> print(act1)
set Pipe('330').status to Open
```

10.2 Conditions

Conditions define when a control action should occur. The condition classes are listed in Table 10.1.

Condition class Description TimeOfDayCondition Time-of-day or "clocktime" based condition statement SimTimeCondition Condition based on time since start of the simulation ValueCondition Compare a network element attribute to a set value Compare the level in a tank to a set value. TankLevelCondition RelativeCondition Compare attributes of two different objects (e.g., levels from tanks 1 and 2) Combine two WNTR Conditions with an OR OrCondition Combine two WNTR Conditions with an AND AndCondition

Table 10.1: Condition Classes

All of the above conditions are valid EPANET conditions except RelativeCondition.

10.3 General Controls and Rules

All controls and rules may be created in WNTR with the Control class, which takes an instance of any of the above conditions, an iterable of ControlAction instances that should occur when the condition is true, and an optional iterable of ControlAction instances that should occur when the condition is false. The Control class also takes optional priority and name arguments. If multiple controls with conflicting actions should occur at the same time, the control with the highest priority will override all others. The priority argument should be an element of the ControlPriority enum. The default priority is medium (3). The name argument should be a string.

The following examples illustrate the creation of controls/rules in WNTR:

```
>>> n1 = wn.get_node('1')
>>> cond1 = controls. ValueCondition(n1, 'level', '>', 46.0248)
>>> print (cond1)
Tank('1').level > 46.0248
>>> rule1 = controls.Control(cond1, [act1], name='control1')
>>> print (rule1)
rule control1 := if Tank('1').level > 46.0248 then set Pipe('330').status to Open_
⇒with priority 3
>>> cond2 = controls.SimTimeCondition(wn, '=', '121:00:00')
>>> print (cond2)
sim\_time = 435600 sec
>>> pump2 = wn.get_link('10')
>>> act2 = controls.ControlAction(pump2, 'status', 1)
>>> rule2 = controls.Control(cond2, [act2], name='control2')
>>> print (rule2)
rule control2 := if sim_time = 435600 sec then set HeadPump('10').status to Open with.
⇒priority 3
```

More complex controls/rules can be written using one of the Boolean logic condition classes. The following example creates a new rule that will open pipe 330 if both conditions are true, and otherwise it will open pipe 10. This rule will behave very differently from the rules above:

Actions can also be combined, as shown in the following example:

```
>>> cond4 = controls.OrCondition(cond1, cond2)
>>> rule4 = controls.Control(cond4, [act1, act2])
>>> print(rule4)
rule := if ( Tank('1').level > 46.0248 || sim_time = 435600 sec ) then set Pipe('330 \( \to ') \).status to Open and set HeadPump('10').status to Open with priority 3
```

The flexibility of the Control class combined with the different ControlCondition classes and ControlAction instances provides an extremely powerful tool for defining complex network operations.

10.4 Simple controls

Simple controls (contols that emulate EPANET's [CONTROLS] section) may be defined more simply and concisely using the class methods of Control: time_control and conditional_control.

Conditional controls: Control objects created with the conditional_control class method define tank level and junction pressure based controls. Conditional controls require a source, attribute, operation, threshold, and a control action. The source is a water network model component and the attribute is any valid attribute for that object. The operation is defined using NumPy functions such as *np.greater* and *np.less* or elements of the Comparison enum. The threshold is the value that triggers the condition to be true. The control action is defined above.

In the following example, a conditional control is defined that opens pipe 330 if the level of tank 1 goes above 46.0248 m. The source is the tank n1 and the attribute is the *level*. To specify that the condition should be true when the level is greater than the threshold, the operation is set to np.greater and the threshold is set to 46.0248. The control action act1 from above is used in the conditional control:

Time-based controls: Control objects created with the time_control class method define time-based controls. Time-based controls require a water network model object, a time at which the action should occur, a control action, and additional flags to specify the time reference point and recurrence. The time flag is either *SIM_TIME* or *SHIFTED_TIME*; these indicate simulation or clock time, respectively. The daily flag is either True or False and indicates if the control should be repeated every 24 hours.

In the following example, a time-based control is defined that opens Pump 10 at hour 121. The time flag is set to SIM_TIME and the daily flag is set to False. A new control action is defined that opens the pump:

Note that the EpanetSimulator is limited to use the following pairs: time_flag='SIM_TIME' with daily_flag=False, and time_flag='SHIFTED_TIME' with daily_flag=True. The WNTRSimulator can use any combination of time flag and daily flag.

10.5 Adding controls to a network

Once a control is created, they can be added to the network. This is accomplished using the add_control method of the water network model object. The control should be named so that it can be retrieved and modified if desired:

11 NetworkX graph

WNTR can generate a NetworkX data object that stores network connectivity as a graph. A **graph** is a collection of nodes that are connected by links. For water networks, nodes represent junctions, tanks, and reservoirs while links represent pipes, pumps, and valves. The NetworkX graph can be used to analyze network structure.

The type of NetworkX graph generated by WNTR is a directed multigraph. A **directed multigraph** is a graph with direction associated with links and the graph can have multiple links with the same start and end node. A simple example is shown in Figure 11.1. For water networks, the link direction is from the start node to the end node. The link direction is used as a reference to track flow direction in the network. For example, positive flow indicates that the flow direction is from the start node to the end node while negative flow indicates that the flow direction is from the end node to the start node. Multiple links with the same start and end node can be used to represent redundant pipes or backup pumps. A NetworkX graph generated from a water network model stores the start and end node of each link, node coordinates, and node and link types (i.e., Tank, Reservoir, Valve).

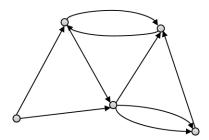


Figure 11.1: Example directed multigraph.

NetworkX includes numerous methods to analyze the structure of complex networks. For more information on NetworkX, see https://networkx.github.io/. WNTR includes a custom Graph Class, WntrMultiDiGraph. This class inherits from NetworkX MultiDigraph and includes additional methods that are specific to WNTR. The example **networkx graph.py** can be used to generate a graph from a water network model.

A NetworkX graph can an be obtained using the following function:

```
G = wn.get_graph()
```

The graph is stored as a nested dictionary. The nodes and links (note that links are called *edges* in NetworkX) can be accessed using the following:

```
node_name = '123'
print(G.node[node_name])
print(G.adj[node_name])
```

The graph can be used to access NetworkX methods, for example:

Some methods in NetworkX require that networks are undirected. An **undirected graph** is a graph with no direction associated with links. The following NetworkX method can be used to convert a directed graph to an undirected graph:

```
uG = G.to_undirected()
```

Some methods in NetworkX require that networks are connected. A **connected graph** is a graph where a path exists between every node in the network (i.e., no node is disconnected). The following NetworkX method can be used to check if a graph is connected:

```
print(nx.is_connected(uG))
```

Some methods in NetworkX can use weighted graphs. A **weighted graph** is a graph in which each link is given a weight. The WNTR method weight_graph can be used to weight the graph by any attribute. In the following example, the graph is weighted by length. This graph can then be used to compute path lengths:

```
length = wn.query_link_attribute('length')
G.weight_graph(link_attribute = length)
```

12 Hydraulic simulation

WNTR contains two simulators: the **WNTRSimulator** and the **EpanetSimulator**. See *Software framework and limitations* for more information on features and limitations of these simulators.

The EpanetSimulator can be used to run demand-driven hydraulic simulations using the EPANET 2 Programmer's Toolkit. The simulator can also be used to run water quality simulations, as described in *Water quality simulation*. A hydraulic simulation using the EpanetSimulator is run using the following code:

```
epanet_sim = wntr.sim.EpanetSimulator(wn)
epanet_sim_results = epanet_sim.run_sim()
```

The WNTRSimulator is a pure Python hydraulics simulation engine based on the same equations as EPANET. The WNTRSimulator does not include equations to run water quality simulations. The WNTRSimulator includes the option to simulate leaks, and run hydraulic simulations in either demand-driven or pressure dependent demand mode. A hydraulic simulation using the WNTRSimulator is run using the following code:

```
wntr_sim = wntr.sim.WNTRSimulator(wn)
wntr_sim_results = wntr_sim.run_sim()
```

The example **hydraulic simulation.py** can be used to run both simulators.

More information on the simulators can be found in the API documentation, under EpanetSimulator and WNTRSimulator.

12.1 Options

Hydraulic simulation options are defined in the WaterNetworkOptions class. These options include duration, hydraulic timestep, rule timestep, pattern timestep, pattern start, default pattern, report timestep, report start, start clocktime, headloss, trials, accuracy, unbalanced, demand multiplier, and emitter exponent. All options are used with the EpanetSimulator. Options that are not used with the WNTRSimulator are described in *Limitations*.

12.2 Mass balance at nodes

Both simulators use the mass balance equations from EPANET [Ross00]:

$$\sum_{n \in P_n} q_{p,n} - D_n^{act} = 0 \qquad \forall n \in \mathbb{N}$$

where P_n is the set of pipes connected to node n, $q_{p,n}$ is the flow rate of water into node n from pipe p (m³/s), D_n^{act} is the actual demand out of node n (m³/s), and N is the set of all nodes. If water is flowing out of node n and into pipe p, then $q_{p,n}$ is negative. Otherwise, it is positive.

12.3 Headloss in pipes

Both simulators use the Hazen-Williams headloss formula from EPANET [Ross00]:

$$H_{n_i} - H_{n_i} = h_L = 10.667C^{-1.852}d^{-4.871}Lq^{1.852}$$

where h_L is the headloss in the pipe (m), C is the Hazen-Williams roughness coefficient (unitless), d is the pipe diameter (m), L is the pipe length (m), q is the flow rate of water in the pipe (m³/s), H_{n_j} is the head at the starting node (m), and H_{n_i} is the head at the ending node (m).

The flow rate in a pipe is positive if water is flowing from the starting node to the ending node and negative if water is flowing from the ending node to the starting node.

The WNTRSimulator solves for pressures and flows throughout the network as a set of linear equations. However, the Hazen-Williams headloss formula is not valid for negative flow rates. Therefore, the WNTRSimulator uses a reformulation of this constraint.

For q < 0:

$$h_L = -10.667C^{-1.852}d^{-4.871}L|q|^{1.852}$$

For $q \geq 0$:

$$h_L = 10.667C^{-1.852}d^{-4.871}L|q|^{1.852}$$

These equations are symmetric across the origin and valid for any q. Thus, this equation can be used for flow in either direction. However, the derivative with respect to q at q=0 is 0. In certain scenarios, this can cause the Jacobian of the set of hydraulic equations to become singular (when q=0). To overcome this limitation, the WNTRSimulator splits the domain of q into six segments to create a piecewise smooth function.

12.4 Demand-driven simulation

In demand-driven simulation, the pressure in the system depends on the node demands. The mass balance and headloss equations described above are solved assuming that node demands are known and satisfied. This assumption is reasonable under normal operating conditions and for use in network design. Both simulators can run hydraulics using demand-driven simulation.

12.5 Pressure dependent demand simulation

In situations that lead to low pressure conditions (i.e., fire fighting, power outages, pipe leaks), consumers do not always receive their requested demand and a pressure dependent demand simulation is recommended. In a pressure dependent demand simulation, the delivered demand depends on the pressure. The mass balance and headloss equations described above are solved by simultaneously determining demand along with the network pressures and flow rates.

The WNTRSimulator can run hydraulics using a pressure dependent demand simulation according to the following pressure-demand relationship [WaSM88]:

$$d = \begin{cases} 0 & p \le P_0 \\ D_f(\frac{p - P_0}{P_f - P_0})^{\frac{1}{2}} & P_0 \le p \le P_f \\ D^f & p \ge P_f \end{cases}$$

where d is the actual demand (m³/s), D_f is the desired demand (m³/s), p is the pressure (Pa), P_f is the pressure above which the consumer should receive the desired demand (Pa), and P_0 is the pressure below which the consumer cannot receive any water (Pa). The set of nonlinear equations comprising the hydraulic model and the pressure-demand relationship is solved directly using a Newton-Raphson algorithm.

Figure 12.1 illustrates the pressure-demand relationship using both the demand-driven and pressure dependent demand simulations. In the example, D_f is 0.0025 m³/s (39.6 GPM), P_f is 30 psi, and P_0 is 5 psi. Using the demand-driven simulation, the demand is equal to D_f regardless of pressure. Using the pressure dependent demand simulation, the demand starts to decrease when the pressure is below P_f and goes to 0 when pressure is below P_0 .

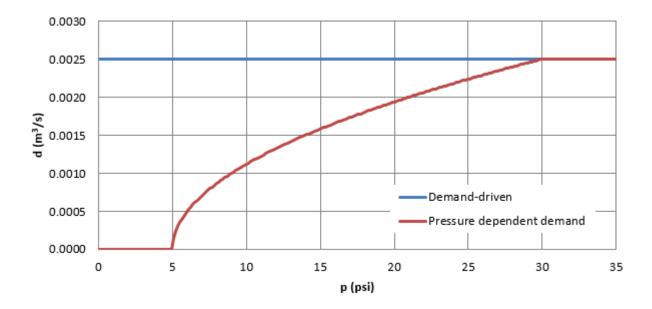


Figure 12.1: Example relationship between pressure (p) and demand (d) using both the demand-driven and pressure dependent demand simulations.

12.6 Leak model

The WNTRSimulator includes the ability to add leaks to the network. The leak is modeled with a general form of the equation proposed by Crowl and Louvar [CrLo02] where the mass flow rate of fluid through the hole is expressed as:

$$d_{leak} = C_d A p^{\alpha} \sqrt{\frac{2}{\rho}}$$

where d_{leak} is the leak demand (m³/s), C_d is the discharge coefficient (unitless), A is the area of the hole (m²), p is the gauge pressure inside the pipe (Pa), α is the discharge coefficient, and ρ is the density of the fluid. The default discharge coefficient is 0.75 (assuming turbulent flow), but the user can specify other values if needed. The value of α is set to 0.5 (assuming large leaks out of steel pipes). Leaks can be added to junctions and tanks. A pipe break is modeled using a leak area large enough to drain the pipe. WNTR includes methods to add leaks to any location along a pipe by splitting the pipe into two sections and adding a node.

Figure 12.2 illustrates leak demand. In the example, the diameter of the leak is set to 0.5 cm, 1.0 cm, and 1.5 cm.

12.7 Pause and restart

The WNTRSimulator includes the ability to

- Reset initial values and re-simulate using the same water network model. Initial values include tank head, reservoir head, pipe status, pump status, and valve status.
- Pause a hydraulic simulation, change network operations, and then restart the simulation
- Save the water network model and results to files and reload for future analysis

These features are helpful when evaluating various response action plans or when simulating long periods of time where the time resolution might vary. The file **hydraulic_simulation.py** includes examples of these features.

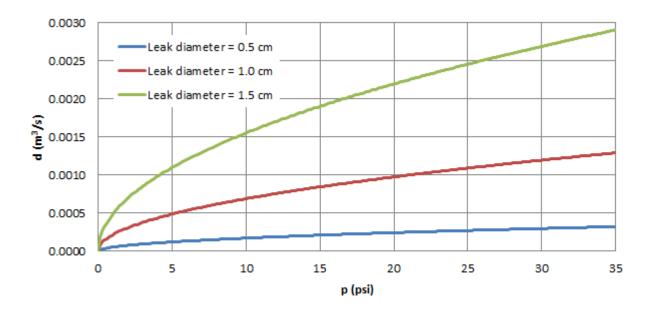


Figure 12.2: Example relationship between leak demand (d) and pressure (p).

13 Water quality simulation

Water quality simulations can only be run using the **EpanetSimulator**. As listed in the *Software framework and limitations* section, this means that the hydraulic simulation must use demand-driven simulation. Note that the WNTRSimulator can be used to compute demands under pressure dependent demand conditions and those demands can be used in the EpanetSimulator. The following code illustrates how to reset demands in a water network model using a pressure dependent demand simulation:

```
sim = wntr.sim.WNTRSimulator(wn)
results = sim.run_sim()
wn.assign_demand(results.node['demand'], 'PDD')
sim = wntr.sim.EpanetSimulator(wn)
results_withPDdemands = sim.run_sim()
```

After defining water quality options and sources (described in the *Options* and *Sources* sections below), a hydraulic and water quality simulation using the EpanetSimualtor is run using the following code:

```
sim = wntr.sim.EpanetSimulator(wn)
results = sim.run_sim()
```

The example water_quality_simulation.py can be used to run water quality simulations and plot results.

13.1 Options

Water quality simulation options are defined in the WaterNetworkOptions class. Three types of water quality analysis are supported. These options include water age, tracer, and chemical concentration.

• Water age: Water quality simulation can be used to compute water age at every node. To compute water age, set the 'quality' option as follows:

```
wn.options.quality.mode = 'AGE'
```

• Tracer: Water quality simulation can be used to compute the percent of flow originating from a specific location. The results include tracer percent values at each node. For example, to track a tracer from node '111', set the 'quality' and 'tracer_node' options as follows:

```
wn.options.quality.mode = 'TRACE'
wn.options.quality.trace_node = '111'
```

• Chemical concentration: Water quality simulation can be used to compute chemical concentration given a set of source injections. The results include chemical concentration values at each node. To compute chemical concentration, define sources (described in the *Sources* section below) and set the 'quality' options as follows:

```
wn.options.quality.mode = 'CHEMICAL'
```

• To skip the water quality simulation, set the 'quality' options as follows:

```
wn.options.quality.mode = 'NONE'
```

Additional water quality options include viscosity, diffusivity, specific gravity, tolerance, bulk reaction order, wall reaction order, tank reaction order, bulk reaction coefficient, wall reaction coefficient, limiting potential, and roughness correlation. These parameters are defined in the WaterNetworkOptions API documentation.

When creating a water network model from an EPANET INP file, water quality options are populated from the [OPTIONS] and [REACTIONS] sections of EPANET INP file. All of these options can be modified in WNTR and then written to an EPANET INP file.

13.2 Sources

Sources are required for CHEMICAL water quality analysis. Sources can still be defined, but *will not* be used if AGE, TRACE, or NONE water quality analysis is selected. Sources are added to the water network model using the add_source method. Sources include the following information:

- Source name: A unique source name used to reference the source in the water network model.
- Node name: The injection node.
- Source type: Options include 'CONCEN,' 'MASS,' 'FLOWPACED,' or 'SETPOINT.'
 - CONCEN source represents injection of a specific concentration.
 - MASS source represents a booster source with a fixed mass flow rate.
 - FLOWPACED source represents a booster source with a fixed concentration at the inflow of the node.
 - SETPOINT source represents a booster source with a fixed concentration at the outflow of the node.
- **Strength**: Baseline source strength (in mass/time for MASS and mass/volume for CONCEN, FLOWPACED, and SETPOINT).
- Pattern: The pattern name associated with the injection.

For example, the following code can be used to add a source, and associated pattern, to the water network model:

In the above example, the pattern is given a value of 1 between 2 and 15 hours, and 0 otherwise. The method remove_source can be used to remove sources from the water network model.

When creating a water network model from an EPANET INP file, the sources that are defined in the [SOURCES] section are added to the water network model. These sources are given the name 'INP#' where # is an integer related to the number of sources in the INP file.

14 Simulation results

WNTR uses Pandas data objects to store simulation results. The use of Pandas facilitates a comprehensive set of time series analysis options that can be used to evaluate results. For more information on Pandas, see http://pandas.pydata.org/.

Results are stored in Pandas Panels. A Panel is a 3-dimensional database. One Panel is used to store nodes results and one Panel is used to store link results. The Panels are indexed by:

- Node or link attribute
- Time in seconds from the start of the simulation
- · Node or link name

Conceptually, Panels can be visualized as blocks of data with 3 axis, as shown in Figure 14.1.

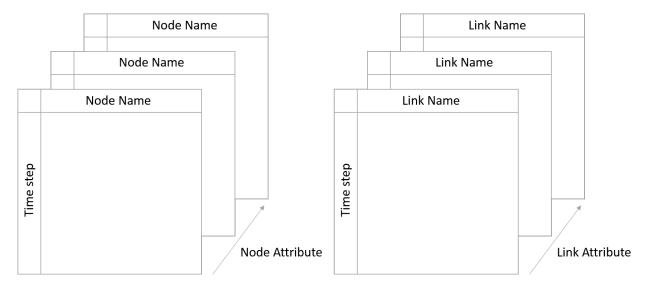


Figure 14.1: Conceptual representation of Panels used to store simulation results.

Node attributes include:

- Demand
- Expected demand (only when the WNTRSimulator is used)
- Leak demand (only when the WNTRSimulator is used)
- Pressure
- Head
- Quality (only when the EpanetSimulator is used. Water age, tracer percent, or chemical concentration is stored, depending on the mode of water quality analysis)
- Type (junction, tank, or reservoir)

Link attributes include:

- Velocity
- Flowrate
- Status (0 indicates closed, 1 indicates open)

• Type (pipe, pump, or valve)

The example **simulation_results.py** demonstrates use cases of simulation results. Node and link results are accessed using:

```
print (results.node)
print (results.link)
```

The indices can be used to extract specific information from the Panels. For example, to access the pressure and demand at node '123' at 1 hour:

```
print(results.node.loc['pressure',3600,'123'], results.node.loc['demand',3600,'123'])
```

To access the pressure for all nodes and times (the ":" notation returns all variables along the specified axis):

```
print(results.node.loc['pressure',:,:].head())
```

Attributes can be plotted as a time-series, as shown in Figure 14.2:

```
pressure_at_node123 = results.node.loc['pressure',:,'123']
pressure_at_node123.plot()
```

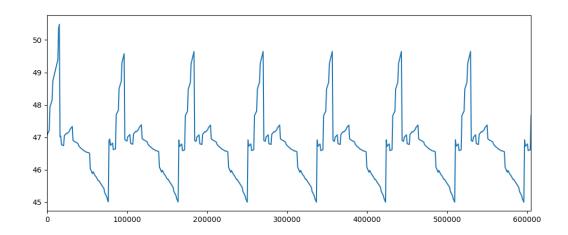


Figure 14.2: Example time-series graphic.

Attributes can be plotted on the water network model, as shown in Figure 14.3. In this figure, the node pressure at 1 hr and link flowrate at 1 hour are plotted on the network. A colorbar is included for both node and link attributes:

Network and time-series graphics can be customized to add titles, legends, axis labels, etc.

Panels can be saved to Excel files using:

```
results.node.to_excel('node_results.xls')
results.link.to_excel('link_results.xls')
```

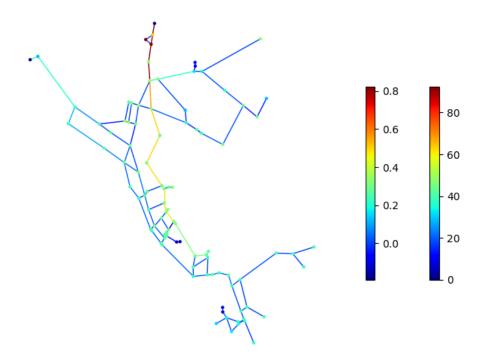


Figure 14.3: Example network graphic.

15 Disaster scenarios

Drinking water utilities might be interested in examining many different disaster scenarios. They could be acute incidents like power outages and earthquakes or they could be long term issues like persistent pipe leaks, population fluctuation, and changes to supply and demand. The following section describes disaster scenarios that can be modeled in WNTR. The example **disaster_scenarios.py** demonstrates methods to define disaster scenarios.

15.1 Earthquake

Earthquakes can be some of the most sudden and impactful disasters that a water systems experiences. An earthquake can cause lasting damage to the system that could take weeks, if not months, to fully repair. Earthquakes can cause damage to pipes, tanks, pumps, and other infrastructure. Additionally, earthquakes can cause power outages and fires.

WNTR includes methods to add leaks to pipes and tanks, shut off power to pumps, and change demands for fire conditions, as described in the sections below. The Earthquake class includes methods to compute peak ground acceleration, peak ground velocity, and repair rate based on the earthquake location and magnitude. Alternatively, external earthquake models or databases (e.g., ShakeMap [WWQP06]) can be used to compute earthquake properties and those properties can be loaded into Python for analysis in WNTR.

When simulating the effects of an earthquake, fragility curves are commonly used to define the probability that a component is damaged with respect to peak ground acceleration, peak ground velocity, or repair rate. The American Lifelines Alliance report [ALA01] includes seismic fragility curves for water system components. See Stochastic simulation for more information on fragility curves.

Since properties like peak ground acceleration, peak ground velocity, and repair rate are a function of the distance to the epicenter, node coordinates in the water network model must be in units of meters. Since some network models use other units for node coordinates, WNTR includes a method to change the coordinate scale. To change the node coordinate scale by a factor of 1000, for example, use the following code:

```
wn.scale_node_coordinates(1000)
```

The following code can be used to compute peak ground acceleration, peak ground velocity, and repair rate:

```
epicenter = (32000,15000) # x,y location
magnitude = 6.5 # Richter scale
depth = 10000 # m, shallow depth
earthquake = wntr.scenario.Earthquake(epicenter, magnitude, depth)
distance = earthquake.distance_to_epicenter(wn, element_type=wntr.network.Pipe)
pga = earthquake.pga_attenuation_model(distance)
pgv = earthquake.pgv_attenuation_model(distance)
repair_rate = earthquake.repair_rate_model(pgv)
```

15.2 Pipe breaks or leaks

Pipes are susceptible to leaks. Leaks can be caused by aging infrastructure, the freeze/thaw process, increased demand, or pressure changes. This type of damage is especially common in older cities where distribution systems were constructed from outdated materials like cast iron and even wood.

WNTR includes methods to add leaks to junctions and tanks. Leaks can be added to a pipe by splitting the pipe and adding a junction. To add a leak to a specific pipe:

```
wn.split_pipe('123', '123_B', '123_leak_node')
leak_node = wn.get_node('123_leak_node')
leak_node.add_leak(wn, area=0.05, start_time=2*3600, end_time=12*3600)
```

The method add_leak adds time controls to a junction which includes the start and stop time for the leak.

15.3 Power outage

Power outages can be small and brief, or they can also span over several days and effect whole regions as seen in the 2003 Northeast Blackout. While the Northeast Blackout was an extreme case, a 2012 Lawrence Berkeley National Laboratory study [ELLT12] showed the frequency and duration of power outages are increasing by a rate of two percent annually. In water distribution systems, a power outage can cause pump stations to shut down and result in reduced water pressure. This can lead to shortages in some areas of the system. Typically, no lasting damage in the system is associated with power outages.

WNTR can be used to simulate power outages by changing the pump status from ON to OFF and defining the duration of the outage. To model the impact of a power outage on a specific pump:

```
pump.add_outage(wn, 5*3600, 10*3600)
```

The method add_pump_outage adds time controls to a pump to start and stop a power outage. When simulating power outages, consider placing check bypasses around pumps and check valves next to reservoirs.

15.4 Fires

WNTR can be used to simulate damage caused to system components due to fire and/or to simulate water usage due to fighting fires. To fight fires, additional water is drawn from the system. Fire codes vary by state. Minimum required fire flow and duration are generally based on building area and purpose. While small residential fires might require 1500 gallons/minute for 2 hours, large commercial spaces might require 8000 gallons/minute for 4 hours [ICC12]. This additional demand can have a large impact on water pressure in the system.

WNTR can be used to simulate fire fighting conditions in the system. WNTR simulates fire fighting conditions by specifying the demand, time, and duration of fire fighting. Pressure dependent demand simulation is recommended in cases where fire fighting might impact expected demand. To model the impact of fire conditions at a specific node:

15.5 Environmental change

Environmental change is a long term problem for water distribution systems. Changes in the environment could lead to reduced water availability, damage from weather incidents, or even damage from subsidence. For example, severe drought in California has forced lawmakers to reduce the state's water usage by 25 percent. Environmental change also leads to sea level rise which can inundate distribution systems. This is especially prevalent in cities built on unstable soils like New Orleans and Washington, DC which are experiencing land subsidence.

WNTR can be used to simulate the effects of environmental change on the water distribution system by changing supply and demand, adding disruptive conditions (i.e., power outages, pipe leaks) caused by severe weather, or by adding pipe leaks caused by subsidence. Power outages and pipe leaks are described above. Changes to supply and

demand can be simple (i.e., changing all nodes by a certain percent), or complex (i.e., using external data or correlated statistical methods). To model simple changes in supply and demand:

```
for reservoir_name, reservoir in wn.reservoirs():
    reservoir.head_timeseries.base_value = reservoir.head_timeseries.base_value*0.9
for junction_name, junction in wn.junctions():
    for demand in junction.demand_timeseries_list:
        demand.base_value = demand.base_value*1.15
```

15.6 Contamination

Water distribution systems are vulnerable to contamination by a variety of chemical, microbial, or radiological substances. During disasters, contamination can enter the system through reservoirs, tanks, and at other access points within the distribution system. Long term environmental change can lead to degradation of water sources. Contamination can be difficult to detect and is very expensive to clean up. Recent incidents, including the Elk River chemical spill and Flint lead contamination, highlight the need to minimize human health and economic impacts.

WNTR simulates contamination incidents by introducing contaminants into the distribution system and allowing them to propagate through the system. The example **water_quality_simulation.py** includes steps to define and simulate contamination incidents.

Future versions of WNTR will be able to simulate changes in source water quality due to disruptions.

15.7 Other disaster scenarios

Drinking water systems are also susceptible to other natural disasters including floods, droughts, hurricanes, tornadoes, extreme winter storms, and wind events. WNTR can be used to simulate these events by combining the disaster models already described above. For example, tornadoes might cause power outages, pipe breaks, other damage to infrastructure, and fires. Floods might cause power outages, changes to source water (because of treatment failures), and pipe breaks.

16 Resilience metrics

Resilience of water distribution systems refers to the design, maintenance, and operations of that system. All these aspects must work together to limit the effects of disasters and enable rapid return to normal delivery of safe water to customers. Numerous resilience metrics have been suggested [USEPA14]. These metrics generally fall into five categories: topographic, hydraulic, water quality, water security, and economic. When quantifying resilience, it is important to understand which metric best defines resilience for a particular scenario. WNTR includes many metrics to help users compare resilience using different methods.

The following sections outline metrics that can be computed using WNTR, including:

- Topographic metrics (Table 16.1)
- Hydraulic metrics (Table 16.2)
- Water quality metrics (Table 16.3)
- Water security metrics (Table 16.4)
- Economic metrics (Table 16.5)

While some metrics define resilience as a single system-wide quantity, other metrics define quantities that are a function of time, space, or both. For this reason, state transition plots [BaRR13] and network graphics are useful ways to visualize resilience and compare metrics, as shown in Figure 16.1. In the state transition plot, the x-axis represents time (before, during, and after a disruptive incident). The y-axis represents performance. This can be any time varying resilience metric that responds to the disruptive state. State transition plots are often generated to show time varying performance of the system, but they can also represent the time varying performance of individual components, like tanks or pipes. Network graphics are useful to visualize resilience metrics that vary with respect to location. For metrics that vary with respect to time and space, network animation can be used to illustrate resilience.

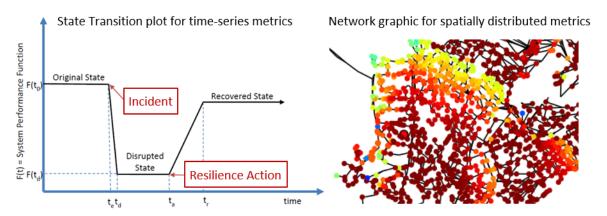


Figure 16.1: Example state transition plot and network graphic used to visualize resilience.

The example **resilience_metrics.py** demonstrates how to compute these metrics.

16.1 Topographic metrics

Topographic metrics, based on graph theory, can be used to assess the connectivity of water distribution networks. These metrics rely on the physical layout of the network components and can be used to understand how the underlying structure and connectivity constrains resilience. For example, a regular lattice, where each node has the same number of edges, is considered to be the most reliable graph structure. On the other hand, a random lattice has nodes and edges that are placed according to a random process. A real world water distribution system probably lies somewhere in between a regular lattice and a random lattice in terms of structure and reliability.

NetworkX includes a wide range of topographic metrics that can be computed using the WntrMultiDiGraph. WNTR includes additional methods/metrics to help compute resilience. These methods are in the WntrMultiDiGraph class. Commonly used topographic metrics are listed in Table 16.1. Information on additional topographic metrics supported by NetworkX can be found at https://networkx.github.io/.

Table 16.1: Topographic Resilience Metrics

	Table 10.1. Topographic Restricted Metrics
Met-	Description
ric	
Node	Node degree is the number of links adjacent to a node. Node degree is a measure of the number of branches
de-	in a network. A node with degree 0 is not connected to the network. Terminal nodes have degree 1. A node
gree	connected to every node (including itself) has a degree equal to the number of nodes in the network. The
	average node degree is a system wide metric used to describe the number of connected links in a network.
	Node degree can be computed using the NetworkX method degree. Terminal nodes can be found using
	the method terminal_nodes.
Link	Link density is the ratio between the total number of links and the maximum number of links in the network.
den-	If links are allowed to connect a node to itself, then the maximum number of links is n^2 , where n is the
sity	number of nodes. Otherwise, the maximum number of nodes is $n(n-1)$. Link density is 0 for a graph
	without edges and 1 for a dense graph. The density of multigraphs can be higher than 1. Link density can
	be computed using the NetworkX method density.
Ec-	Eccentricity is the maximum number of links between a node and all other nodes in the graph. Eccentricity
cen-	is a value between 0 and the number of links in the network. Diameter is the maximum eccentricity in the
tric-	network. Eccentricity and diameter can only be computed using undirected, connected networks. Network
ity	X includes a method to convert directed graphs to undirected graphs, to_undirected, and to check if
and	graphs are connected, is_connected. Eccentricity and diameter can be computed using the NetworkX
di-	methods eccentricity and diameter.
am-	
eter	
Sim-	A simple path is a path between two nodes that does not repeat any nodes. NetworkX includes
ple	a method, all_simple_paths, to compute all simple paths between two nodes. The method
paths	links_in_simple_paths can be used to extract all links in a simple path along with the number of
	times each link was used in the paths. Paths can be time dependent, if related to simulated flow direction.
	The method weight_graph can be used to weight the graph by a specified attribute.
Short-	
est	network. Shortest path length is a value between 0 and the number of links in the network. The average
path	shortest path length is a system wide metric used to describe the number of links between a node and all
length	s other nodes. Shortest path lengths and average shortest path lengths can be computed using the following
	NetworkX methods shortest_path_length and average_shortest_path_length.
Be-	Betweenness centrality is the fraction of shortest paths that pass through each node. Betweenness coeffi-
tween-	
ness	trality of the most central point (having the maximum betweenness centrality) and all other nodes. These
cen-	metrics can be computed using the NetworkX methods betweenness_centrality and the method
tral-	central_point_dominance
ity	
Close-	
ness	centrality can be computed using the NetworkX method closeness_centrality.
cen-	
tral-	
ity	
Ar-	A node is considered an articulation point if the removal of that node (along with all its incident
tic-	edges) increases the number of connected components of a network. Density of articulation points is
ula-	the ratio of the number of articulation points and the total number of nodes. Density of articulation
tion	points is a value between 0 and 1. Articulation points can be computed using the NetworkX method
points	
Driuge	sA link is considered a bridge if the removal of that link increases the number of connected components in
	the network. The ratio of the number of bridges and the total number of links in the network is the bridge
	density. Bridge density is a value between 0 and 1. The method bridges can be used to find bridges in a
	network.

16.2 Hydraulic metrics

Hydraulic metrics are based upon variable flows and/or pressure. The calculation of these metrics requires simulation of network hydraulics that reflect how the system operates under normal or abnormal conditions. Hydraulic metrics included in WNTR are listed in Table 16.2.

Table 16.2: Hydraulic Resilience Metrics

	Table 10.2. Trydraunc Resilience Metrics
Met-	Description
ric	
Pres-	To determine the number of node-time pairs above or below a specified pressure threshold, use the query
sure	method on results.node['pressure'].
То-	The Todini index [Todi00] is related to the capability of a system to overcome failures while still meeting
dini	demands and pressures at the nodes. The Todini index defines resilience at a specific time as a measure of
in-	surplus power at each node and measures relative energy redundancy. The Todini index can be computed
dex	using the todini method.
En-	Entropy [AwGB90] is a measure of uncertainty in a random variable. In a water distribution network
tropy	model, the random variable is flow in the pipes and entropy can be used to measure alternate flow paths
	when a network component fails. A network that carries maximum entropy flow is considered reliable
	with multiple alternate paths. Connectivity will change at each time step, depending on the flow direction.
	The method weight_graph method can be used to weight the graph by a specified attribute. Entropy
	can be computed using the entropy method.
Frac-	Fraction of delivered volume is the ratio of total volume delivered to the total volume requested [OsKS02].
tion	This metric can be computed as a function of time or space using the fdv method.
of	
de-	
liv-	
ered	
vol-	
ume	
Frac-	Fraction of delivered demand is the fraction of time periods where demand is met [OsKS02]. This metric
tion	can be computed as a function of time or space using the fdd method.
of	
de-	
liv-	
ered	
de-	
mand	
Pop-	Population that is impacted by a specific quantity can be computed using the population_impacted
ula-	method. For example, this method can be used to compute the population impacted by pressure below a
tion	specified threshold.
im-	
pacted	

16.3 Water quality metrics

Water quality metrics are based on the concentration or water age. The calculation of these metrics require a water quality simulation. Water quality metrics included in WNTR are listed in Table 16.3.

Table 16.3: Water Quality Resilience Metrics

Metric	Description
Water age	To determine the number of node-time pairs above or below a specified water age threshold, use
	the query method on results.node['quality'] after a simulation using AGE.
Concentration	To determine the number of node-time pairs above or below a specified concentration threshold,
	use the query method on results.node['quality'] after a simulation using CHEM or TRACE.
Fraction of	Fraction of delivered quality is the fraction of time periods where water quality standards are met
delivered	[OsKS02]. This metric can be computed as a function of time or space using the fdq method
quality	
Average water	Average water consumed is computed at each node, based on node demand and demand patterns
consumed	[USEPA15]. The metric can be computed using the average_water_consumed method.
Population	As stated above, population that is impacted by a specific quantity can be computed using the
impacted	population_impacted method. This can be applied to water quality metrics.

16.4 Water security metrics

Water security metrics quantify potential consequences of contamination scenarios. These metrics are documented in [USEPA15]. Water security metrics included in WNTR are listed in Table 16.4.

Table 16.4: Water Security Resilience Metrics

Metric	Description
Mass	Mass consumed is the mass of a contaminant that exits the network via node demand at each node-
con-	time pair [USEPA15]. The metric can be computed using the mass_contaminant_consumed
sumed	method.
Volume	Volume consumed is the volume of a contaminant that exits the network via node demand at each
con-	node-time pair [USEPA15]. A detection limit can be specified. The metric can be computed using the
sumed	volume_contaminant_consumed method.
Extent of	Extent of contamination is the length of contaminated pipe at each node-time pair [USEPA15]. A
contami-	detection limit can be specified. The metric can be computed using the extent_contaminant
nation	method.
Popu-	As stated above, population that is impacted by a specific quantity can be computed using the
lation	population_impacted method. This can be applied to water security metrics.
impacted	

16.5 Economic metrics

Economic metrics include network cost and greenhouse gas emissions. Economic metrics included in WNTR are listed in Table 16.5.

Table 16.5: Economic Resilience Metrics

Metric	Description
Network	Network cost is the annual maintenance and operations cost of tanks, pipes, vales, and pumps based
cost	on the equations from the Battle of Water Networks II [SOKZ12]. Default values can be included in
	the calculation. Network cost can be computed using the cost method.
Green-	Greenhouse gas emissions is the annual emissions associated with pipes based on equations from the
house gas	Battle of Water Networks II [SOKZ12]. Default values can be included in the calculation. Green-
emissions	house gas emissions can be computed using the ghg_emissions method.
Pump	The energy and cost required to operate a pump can be computed using the pump_energy method.
operating	This uses the flowrates and pressures from simulation results to compute pump energy and cost.
energy and	
cost	

17 Stochastic simulation

Stochastic simulations can be used to evaluate an ensemble of hydraulic and/or water quality scenarios. For disaster scenarios, the location, duration, and severity of different types of incidents can be drawn from distributions and included in the simulation. Distributions can be a function of component properties (i.e., age, material) or based on engineering standards. The Python packages Numpy and Scipy include statistical distributions and random selection methods that can be used for stochastic simulations.

For example, the following code can be used to select N unique pipes based on the failure probability of each pipe:

The example **stochastic_simulation.py** runs multiple realizations of a pipe leak scenario where the location and duration are drawn from probability distributions.

17.1 Fragility curves

Fragility curves are commonly used in disaster models to define the probability of exceeding a given damage state as a function environmental change. Fragility curves are closely related to survival curves, which are used to define the probability of component failure due to age. To estimate earthquake damage, fragility curves are defined as a function of peak ground acceleration, peak ground velocity, or repair rate. The American Lifelines Alliance report [ALA01] includes seismic fragility curves for water network components. Fragility curves can also be defined as a function of flood stage, wind speed, and temperature for other types of disasters.

Fragility curves can have multiple damage states. Each state should correspond to specific changes to the network model that represent damage, for example, a major or minor leak. Each state is defined with a name (i.e., 'Major,' 'Minor'), priority (i.e., 1, 2, where higher numbers = higher priority), and distribution (using the Scipy Python package). The distribution can be defined for all elements using the keyword 'Default,' or can be defined for individual components. Each fragility curve includes a 'No damage' state with priority 0 (lowest priority).

The example **fragility_curves.py** uses fragility curves to determine probability of failure:

```
from scipy.stats import lognorm
FC = wntr.scenario.FragilityCurve()
FC.add_state('Minor', 1, {'Default': lognorm(0.5,scale=0.3)})
FC.add_state('Major', 2, {'Default': lognorm(0.5,scale=0.7)})
wntr.graphics.plot_fragility_curve(FC, xlabel='Peak Ground Acceleration (g)')
```

Figure 17.1 illustrates a fragility curve based on peak ground acceleration with two damage states: Minor damage and Major damage. For example, if the peak ground acceleration is 0.5 at a specific junction, the probability of exceeding a Major damage state 0.25 and the probability of exceeding the Minor damage state is 0.85. For each stochastic simulation, a random number is drawn between 0 and 1. If the random number is between 0 and 0.25, the junction is assigned Minor damage. If the random number is between 0.25 and 0.85, then the junction is assigned Major damage. If the random number is between 0.85 and 1, then the junction is assigned No damage. After selecting a damage state for the junction, the network should be changed to reflect the associated damage. For example, if the junction has Major damage, a large leak might be defined at that location.

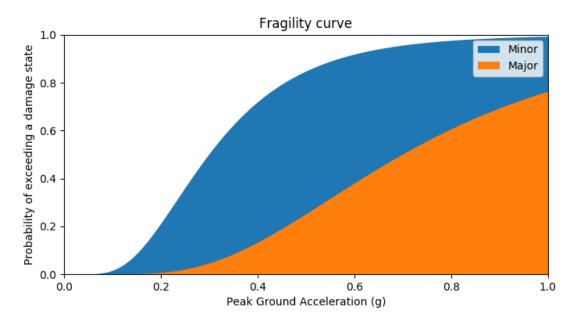


Figure 17.1: Example fragility curve.

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19 Software quality assurance

The following section includes information about the WNTR software repository, software tests, documentation, examples, bug reports, feature requests, and ways to contribute.

19.1 GitHub repository

WNTR is maintained in a version controlled repository. WNTR is hosted on US EPA GitHub organization at https://github.com/USEPA/WNTR.

19.2 Software tests

WNTR includes continuous integration software tests that are run using Travis CI. The tests are run each time changes are made to the repository. The tests cover a wide range of unit and integration tests designed to ensure that the code is performing as expected. New tests are developed each time new functionality is added to the code. Testing status (passing/failed) and code coverage statistics are posted on the README section at https://github.com/USEPA/WNTR.

Tests can also be run locally using the Python package nose. For more information on nose, see http://nose.readthedocs.io/. nose comes with a command line software tool called nosetests. Tests can be run in the WNTR directory using the following command:

nosetests -v --with-coverage --cover-package=wntr wntr

19.3 Documentation

WNTR includes a user manual that is built using the Read the Docs service. The user manual is automatically rebuilt each time changes are made to the code. The documentation is publicly available at http://wntr.readthedocs.io/. The user manual includes an overview, installation instructions, simple examples, and information on the code structure and functions. WNTR includes documentation on the API for all public functions, methods, and classes. New content is marked *Draft*.

19.4 Examples

WNTR includes examples to help new users get started. These examples are intended to demonstrate high level features and use cases for WNTR. The examples are tested to ensure they stay current with the software project.

19.5 Bug reports and feature requests

Bug reports and feature requests can be submitted to https://github.com/USEPA/WNTR/issues. The core development team will prioritize and assign bug reports and feature requests to team members.

19.6 Contributing

Software developers, within the core development team and external collaborators, are expected to follow standard practices to document and test new code. Software developers interested in contributing to the project are encouraged to create a *Fork* of the project and submit a *Pull Request* using GitHub. Pull requests will be reviewed by the core development team.

Pull requests must meet the following minimum requirements to be included in WNTR:

- Code is expected to be documented using Read the Docs.
- Code is expected to be sufficiently tested using Travis CI. *Sufficient* is judged by the strength of the test and code coverage. 80% code coverage is recommended.
- Large files (> 1Mb) will not be committed to the repository without prior approval.
- Network model files will not be duplicated in the repository. Network files are stored in examples/network and wntr/tests/networks_for_testing only.

19.7 Development team

WNTR was developed as part of a collaboration between the United States Environmental Protection Agency National Homeland Security Research Center, Sandia National Laboratories, and Purdue University. See https://github.com/USEPA/WNTR/graphs/contributors for a list of contributors.

20 References

Due to limitations with cross referenced citations in reStructuredText (e.g., commas and spaces are not supported), citations are cross referenced using a 6 digit notation*⁰.

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- If the citation has one author, the first 4 letters of name are used
- If the citation has two authors, the first 2 letters of author 1 and first 2 letters of author 2 are used
- If the citation has three authors, the first 2 letters of author 1, first letter of author 2, and first letter of author 3 are used
- If the citation has four authors, the first letter of each author is used
- If the citation has more than four authors, the first letter of first four authors is used
- Exceptions are made for American Lifelines Alliance (ALA) and United States Environmental Protection Agency (USEPA)

The next two digits are the year (century ignored). If the 6 digits match another citation, a lower case letter (a, b, ...) is added. Cross reference notation will be updated to a standard format when better options come available.

⁰ Cross reference labels begins with 4 letters:

- [Ross00] Rossman, L.A. (2000). EPANET 2 Users Manual. Cincinnati, OH: U.S. Environmental Protection Agency. U.S. Environmental Protection Agency Technical Report, EPA/600/R–00/057, 200p.
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