InfraRisk

Release 1.0

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InfraRisk is an experimental Python-based integrated power-, water-, transport network simulation tool. This documentation provides guidelines to install, setup and use the tool for simulation and analysis of infrastructure networks.

We are continuously working to add new features and improve the tool. If you have any questions or suggestions, or would like to collaborate with us, please write to us at srijith.balakrishnan[at]sec.ethz.ch.

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CHAPTER

ONE

INTRODUCTION

This package was developed as part of the Disaster REsilience Assessment, Modelling, and INno-vation Singapore (DREAMIN'SG) project at the Future Resilient Systems of the Singapore-ETH Centre. The DREAMIN'SG project is funded by the National Research Foundation, Singapore under the Intra-CREATE grant program. In the wake of increasing threats posed by climate change on urban infrastructure¹, this project aims at studying the effects of policy interventions and network characteristics on the resilience of urban infrastructure networks. Given the critical nature of the above infrastructure systems, their interdependencies need to be considered in pre- and post-disaster resilience actions.

In specific, the DREAMIN'SG project envisaged to build a platform to assess and predict the resilience of urban infrastructure systems and propose new pathways to develop innovative technologies and services for its improvement. The urban infrastructure system is modeled as an interdependent power-, water-, and transportation network that interact with each other before, during and after a disaster. The researchers are developing an integrated simulation model to study the performance of the interdependent infrastructure network under various disruption and recov-ery scenarios. Based on the simulation-generated datasets, machine learning algorithms are implemented to understand the causal relationship between topological and policy-related interventions and disaster risks. The results of the research are intended to support local governments and system managers to improve infrastructure resilience against weather-related disruptions. The methodology adopted in the study is presented in Fig. 1.1.



Fig. 1.1: Methodological framework of DREAMIN'SG project

The steps of the project are summarized as follows:

- 1. Multiple scenarios are generated by considering different disruptions, network models, technological constraints and system configurations.
- 2. A simulation model is created for the interdependent power grid, water distribution system, and road transportation system.
- 3. Resilience is assessed based on the simulated performance of the three systems.
- 4. An interpretable machine learning algorithm is implemented to analyze the scenarios and extract information related to key system features that influence resilience.

¹ Nissen, K. M. and U. Ulbrich (2017). Increasing frequencies and changing characteristics of heavy precipitation events threatening infrastructure in Europe under climate change. Natural Hazards and Earth System Sciences, 17(7), 1177–1190. ISSN 16849981.

5. The identified system features inform the design of new services, technologies, and prod-ucts that are able to simultaneously enhance resilience and accommodate the technological constraints.

For further information and updates on the project, please visit the DREAMIN'SG webpage. In the rest of the documentation, the details of the interdependent infrastructure simulation platform, including its modeling, installation, and usage are discussed.

METHODOLOGY AND ARCHITECTURE

The integrated simulation model has been developed as a Python-based package consisting of modules for simulation of system- and network-level cascading effects resulting from component failures. The overall methodological framework of the integrated simulation platform is illustrated in Fig. 2.1.

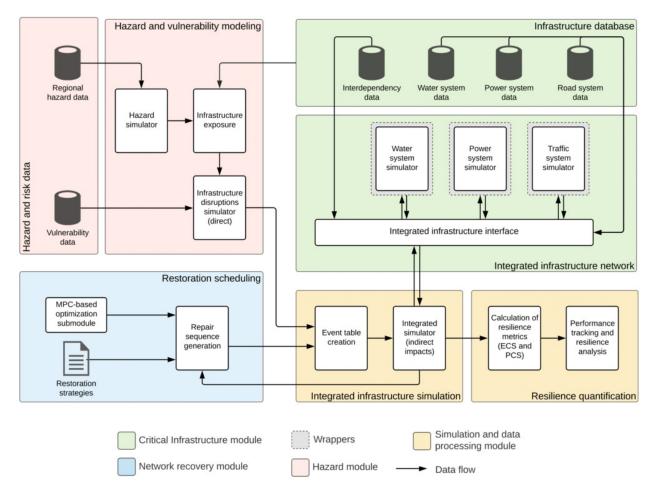


Fig. 2.1: InfraRisk integrated simulation platform structure

The platform is based on the widely accepted risk- and resilience analysis frameworks as presented in [Argyroudis2020] and [Balakrishnan2020]. In this framework, the most important component is an interdependent infrastructure model that consists of various infrastructure system submodels of interest. In addition, the major hazards in the region can also be modeled. Further, the vulnerabilities in the network to those hazards are mapped and the direct impacts (physical and functional failures in the infrastructure components) are simulated using the hazard model. For scheduling post-disaster

restoration/repair actions, a recovery model is also developed. The restoration actions are prioritized based on specific recovery strategies or optimization methods. The indirect failures in the network are simulated using the interdependent infrastructure model based on the initial failure events and the subsequent repair actions. The component- and system-level operational performance are quantified and tracked using appropriate resilience metrics (Fig. 2.2).

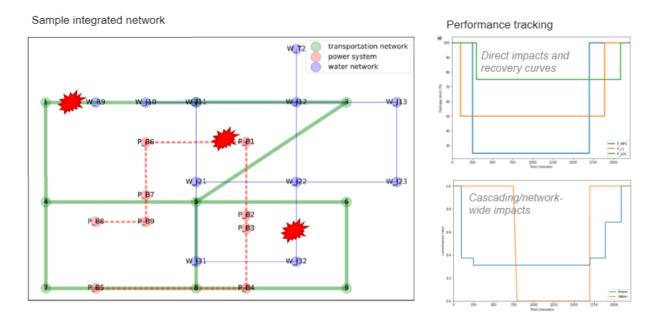


Fig. 2.2: Implementation of the simulation platform to generate performance curves

The basic idea behind the InfraRisk simulation package is to integrate existing infrastructure-specific simulation models through an object-oriented interface so that interdependent infrastructure simulation can be achieved. Interfacing requires identifying and modeling the dependencies among various infrastructure components and time-synchronization among infrastructure simulation models. To address the above challenges, InfraRisk is built using a sequential simulation framework (Figure 2). The advantage of this approach is that it simplifies the efforts for data preparation and enables the complete utilization of component-level modeling features of the domain-specific infrastructure models.

InfraRisk consists of five modules, namely,

- 1. integrated infrastructure network simulation
- 2. hazard initiation and vulnerability modeling
- 3. recovery modeling
- 4. simulation of direct and indirect effects
- 5. resilience quantification.

In the rest of the section, a detailed discussion on each of the above modules is provided.

2.1 Integrated infrastructure network

This module houses the three infrastructure models to simulate power-, water-, and transport systems. These models are developed using existing Python-based packages. In order to model the power system, *pandapower* is employed [Thurner2018]. The water distribution system is modeled using *wntr* package [Klise2018]. The traffic model provides the travel costs for traveling from one point in the network to another and is modeled using the static traffic assignment method [Boyles2020]. All three packages have network-flow optimization models that identify the steady-state resource flows in the respective systems considering the operational constraints. The details of the packages are presented in infrapackages.

Infrastructure	Package	Capabilities
Power	pandapower	 Capable of generating power distribution systems with standard components, such as lines, buses, and transformers based on design data. Capable of performing power-flow analysis.
Water	wntr	 Capable of generating water distribution systems with standard components such as pipes, tanks, and nodes based on design data. Capable of performing pressure dependent demand or demand-driven hydraulic
Transport	static traffic assignment package	Capable of implementing static traffic assignment and computing travel times between origin-destination pairs.

2.1.1 Power system model

The *pandapower* package can be used to determine the steady-state optimal power flow for a given set of system conditions. The optimal power flow problem, solved by *pandapower*, attempts to minimize the total power distribution costs in the system under load flow-, branch-, bus-, and operational power constraints (Equation 1)

$$\begin{array}{ll} \min & \sum_{i \in gen, sgen, load, extgrid} P_i \times f_i \left(P_i \right) \\ \text{s.t.} & P_{min,i} \leq P_i \leq P_{max,i} & \forall i \in gen, sgen, extgrid, load \\ & Q_{min,i} \leq Q_i \leq Q_{max,i} & \forall i \in gen, sgen, extgrid, load \\ & V_{min,j} \leq V_j \leq V_{max,j} & \forall j \in bus \\ & L_k \leq L_{max,k} & \forall k \in trafo, line, trafo3w \end{array}$$

where i, j, and k are the power system components, gen is the set of generators, sgen is the set of static generators, load is the set of loads, extgrid is the set of external grid connections, bus is the set of bus bars, trafo is the set of

transformers, *line* is the set of lines, and trafo3w is the set of three winding transformers, $f_i(\cdot)$ is the cost function, P_i is the active power in i, Q_i is the reactive power in i, V_j is the voltage in j and L_k is the loading percentage in k.

2.1.2 Water system model

The *wntr* package can simulate water flows in water distribution systems using two common approaches, namely, demand-driven analysis (DDA) and pressure-dependent demand analysis (PDA). While DDA assigns pipe flows based on the demands irrespective of the pressure at demand nodes, PDA assumes that the demand is a function of the pressure at which water is supplied. The PDA approach is more suitable for pressure-deficient situations, such as disaster-induced disruptions to water infrastructure. In the case of PDA, the actual node demands is computed as a function of available the water pressure at the nodes as in Equation.

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$$d_i(t) = \begin{cases} 0 & p_i(t) \le P_0 \\ D_i(t) \left(\frac{p_i(t) - P_0}{P_f - P_0}\right)^{\frac{1}{e}} & P_0 < p_i(t) \le P_f \\ D_i & p_i(t) > P_0 \end{cases}$$

where is the actual demand at node i at time t, $D_i(t)$ is the desired demand at a node i at t, $p_i(t)$ is the available pressure in node i at t, P_f is the nominal pressure, and P_0 is the lower pressure threshold, below which no water is consumed. In InfraRisk, the hydraulic simulation is performed using the PDA approach.

2.1.3 Transport system model

The traffic condition in the transport system is modeled using the static traffic assignment method based on the principle of user-equilibrium. Under user-equilibrium, every user tries to minimize their travel costs. The traffic assignment problem considered in InfraRisk package is formulated as follows (Equation~ref{eq:staeqs}) cite{Boyles2020}.

$$\min_{\mathbf{x},\mathbf{h}} \quad \sum_{(i,j)\in A} \int_0^{x_{ij}} t_{ij}(x_{ij}) dx$$
s.t.
$$x_{ij} = \sum_{\pi \in \Pi} h^{\pi} \delta_{ij}^{\pi} \qquad \forall (i,j) \in A$$

$$\sum_{\pi \in \Pi^{rs}} h^{\pi} = d^{rs} \qquad \forall (r,s) \in Z^2$$

$$h^{\pi} \ge 0 \qquad \forall \pi \in \Pi$$

where A is the set of all road links with i and j as the tail and head nodes, t_{ij} is the travel cost on link (i,j), x_{ij} is the traffic flow on link (i,j), h^{π} is the flow on path $\pi \in \Pi$, δ^{π}_{ij} is an indicator variable that denotes whether (i,j) is part of π , d^{rs} is the total flow between origin-destination pair (r,s).

2.1.4 Modeling interdependencies

The module also consists of an interdependency layer which serves as an interface between infrastructure systems. The interdependency layer stipulates the different pieces of information that can be exchanged among individual infrastructure systems and their respective formats. The interdependency submodule also stores information related to the various component-to-component couplings between infrastructure systems. The module facilitates the communication between infrastructure systems and enables information transfer triggered by dependencies. Currently the following dependencies are considered.

- 1. Power-water dependencies, which include dependency of water pumps on electric motors and generators on reservoirs (hydro-power).
- 2. Dependencies also exist between road traffic system and the other two infrastructure systems, as the former provides access to the latter. The disruptions to transport infrastructure components and their recovery are key considerations that influence the restoration and recovery of all other infrastructure systems. The module also stores the functional details of all infrastructure components, including their operational status after a disaster.

The interdependency layer communicates with the infrastructure simulators through inbuilt functions (wrappers).

2.2 Hazard initiation and vulnerability modeling

The hazard module generates disaster scenarios and initiates disaster-induced infrastructure failures based on their vulnerability. The hazard initiation and the resulting infrastructure component failures is the first step in the interdependent infrastructure simulation. The probabilistic failure of an infrastructure component is modeled as follows (Equation~ref{eq:failureprob}):

$$p$$
 (failure_i) = p (hazard) $\times p$ (exposure_i|hazard) $\times p$ (failure_i|exposure_i)

where i is the component, $p(\cdot)$ is the probability. The probability of failure of a component is computed as the product of the probability of the hazard, the probability of the component being exposed to the hazard if it occurs, and the probability of failure of the component if it is exposed to the event.

In InfraRisk, infrastructure component failures can be induced using five types of hazards.

- 1. Point events (e.g., explosions)
- 2. Track-based events (e.g., hurricanes and floods)
- 3. Random disruption events (e.g., seven random road link failures)
- 4. Custom events (e.g., fail five specific pipelines)
- 5. Fragility-based events (e.g., earthquakes)

Among these, the first four two of event types are agnostic to infrastructure vulnerability and focus on the proximity of the components to the location of the event. The random events are generated randomly based on user requirements. Custom events can generate disruptions based on the user-defined lists. The fragility-based events are generated based on the component fragility curves and considers the vulnerability characteristics of the components.

2.3 Recovery modeling

The third module, which is the recovery module, determines how the repair actions are sequenced and implemented. The three major factors that influence recovery are the availability of repair crews, repair times of components, and the criteria used for selecting subsequent components to restore. In InfraRisk, the user can specify the number of crews deployed for restoration of the three infrastructure systems, their initial locations in the network, and the repair times of the infrastructure components.

The repair sequence can be derived using two approaches as follows.

2.3.1 Heuristics-based repair sequences

The first approach is to adopt pre-defined repair strategies based on performance- and network-based heuristics. Currently, there are three inbuilt strategies based on the following criteria:

- 1. Maximum flow handled: The resource-flow during normal operating conditions could reflect the importance of an infrastructure component to the system. The maximum resource-flow handled by a component, considering the temporal fluctuations, can be used as a performance-based heuristics to prioritize failed components for restoration.
- 2. Betweenness centrality: Centrality is a graph-based measure that is used to denote the relative importance of components (nodes and links) in a system. Betweenness centrality is often cited as an effective measure to identify critical infrastructure components cite{Almoghathawi2019}.
- 3. Landuse/zone: Certain regions of a network may have consumers with large demands or critical to the functioning of the whole city. Industrial zones and central business districts are critical from both societal and economic perspectives.

While it is comparatively easier to derive repair sequences based on heuristics, they may not guarantee optimal recovery of the system or the network.

2.3.2 Recovery optimization

The second approach is an optimization model leveraging on the concept of model predictive control (MPC) cite{Camacho2007}. In this approach, first, out of n repair steps, the solution considering only k steps (called the prediction horizon) is computed. Next, the first step of the obtained solution is applied to the system and then the process is repeated for the remaining n-l components until all components are scheduled for repair. In the context of the integrated infrastructure simulation, the optimizer module evaluates repair sequences of the length of the prediction horizon for each infrastructure (assuming that each infrastructure has a separate recovery crew) based on a chosen resilience metric cite{Kottmann2021}. The optimal repair sequence is found by maximizing the resilience metric. At this stage, the optimal repair action in each prediction horizon is computed using a brute-force approach where the resilience metric is evaluated for each of the possible repair sequences. The major limitation of MPC is that it is suitable only for small disruptions involving a few component failures; MPC becomes computationally expensive to derive optimal restoration sequences for larger disruptions due to the large number of repair permutations it has to simulate.

2.4 Simulation of direct and indirect effects

The simulation module implements the integrated infrastructure simulation in two steps, namely, event table generation and interdependent infrastructure simulation. The objective of the event table is to provide a reference object to schedule all the disruptions and repair actions for implementing the interdependent network simulation.

The component failures, repair actions, and the respective time-stamps, are recorded in an event table for later use in the simulation module. The simulation platform uses the event table as a reference to modify the operational status of system components during the simulation, so that the consequences of disaster events and repair actions are reflected in the system performance. The recovery module also stores details including the number of repair crews for every infrastructure system, and their initial locations.

The next step is to simulate the interdependent effects resulting from the component disruptions and the subsequent restoration efforts. One of the main challenge in simulating the interdependent effects using a platform that integrates multiple infrastructure models is the time synchronization.

In order to synchronize the times, the power- and water- system models are run successively for every subsequent time-interval in the event table. The required water system metrics are collected for every one minute of simulation time from the *wntr* model, whereas power system characteristics at the start of every time interval is recorded from the *pandapower* model. The power flow characteristics are assumed to remain unchanged unless there is any modification to the power system in the subsequent time-steps in the simulation.

2.5 Resilience quantification

Currently, the model has two measures of performance (MOP), namely, equitable consumer serviceability (ECS) and prioritized consumer serviceability (PCS), to quantify the system- and network steady-state performances. The above MOPs are based on the well-known concepts of satisfied demand cite{Didier2017} and productivity cite{Poulin2021}. Th MOPs are used as the basis for defining the resilience metrics.

Consider an interdependent infrastructure network \mathbb{K} consisting of a set of infrastructure systems denoted by $K: K \in \mathbb{K}$. There are N consumers who are connected to \mathbb{K} and the resource supply from a system K to consumer $iin\ N$ at time t under normal operating conditions is represented by $S_i^K(t)$.

The ECS approach assumes equal importance to all the consumers dependent on the system irrespective of the quantity of resources consumed from the system. For an infrastructure system, the ECS at time t is given by Equation~ref{eq:ecs}.

$$\mathrm{ECS}_K(t) = \left(\sum_{\forall i: S_i^K(t) > 0} \frac{s_i^K(t)}{S_i^K(t)}\right) / n_K(t), \quad \text{where } 0 \leq s_i^K(t) \leq S_i^K(t)$$

where s_i is the resource supply at time t under stressed system conditions and $n_K(t)$ is the number of consumers with a non-zero normal demand at time t.

In the case of PCS, the consumers are weighted by the quantity of resources drawn by them. This approach assumes that disruptions to serviceability of large-scale consumers, such as manufacturing sector, have larger effect to the whole region compared to small-scale consumers such as residential buildings. The PCS metric of an infrastructure system at time t is given by the Equation~ref{eq:pcs}.

$$PCS_K(t) = \left(\frac{\sum_{\forall i: S_i^K(t) > 0} s_i^K(t)}{\sum_{\forall i: S_i^K(t) > 0} S_i^K(t)}\right), \quad \text{where } 0 \le s_i^K(t) \le S_i^K(t)$$

The normal serviceability component $(S_i^K(t))$ makes both ECS and PCS metrics unaffected by the intrinsic design inefficiencies as well as the temporal fluctuations in demand.

For water distribution systems, pressure-driven approach is chosen as it is reported to be most ideal for the hydraulic simulation under pressure deficient situations. The component resource supply values for water systems are computed as in Equations~ref{eq:water_t_pda}-ref{eq:water_base_pda}.

$$s_i^{water}(t) = Q_i(t)$$
$$S_i^{water}(t) = Q_i^0(t)$$

where $Q_i(t)$ and $Q_i^0(t)$ are the water supplied to consumer i during stressed and normal system conditions, respectively.

For power systems, the power supplied to components under normal and stressed system conditions can be calculated using Equations~ref{eq:power_t}-ref{eq:power_base}.

$$s_i^{power}(t) = p_i(t)$$
$$S_i^{power}(t) = p_i^0(t)$$

where $p_i(t)$ and $p_i^0(t)$ are the power supplied to consumer i under stressed and normal power system conditions.

The ECS and PCS time series can be used to profile the effect of the disruption on any of the infrastructure systems. To quantify the system-level cumulative performance loss, a resilience metric called Equivalent Outage Hours (EOH), based on the well-known concept of *resilience triangle' cite{Bruneau2003}*, *is introduced. EOH of an infrastructure system due to disaster event 'gamma^{K}* is calculated as in Equation~ref{eq:system_eoh}.

$$\gamma^K = \frac{1}{3600} \int_{t_0}^{t_{max}} \left[1 - PCS_K(t) \right] dt \quad \text{or} \quad \gamma^K = \frac{1}{3600} \int_{t_0}^{t_{max}} \left[1 - ECS_K(t) \right] dt$$

where t_0 is the time of the disaster event in the simulation and t_{max} is the maximum simulation time (both in seconds). In Equation~ref{eq:system_eoh}, system performance during normal operating conditions is 1 due to the expression of the MOP used (see Equations ~ref{eq:ecs}-~ref{eq:pcs}).

EOH of an infrastructure system can be interpreted as the duration (in hours) of a full infrastructure service outage that would result in an equivalent quantity of reduced consumption of the same service by all consumers during a disaster. The larger the EOH value, the larger the impact on the infrastructure system and thereby on the consumers due to the disruptive event. The EOH metric can effectively capture the response and resilience of the infrastructure system (Equation~ref{eq:system_eoh}), according to the serviceability criteria chosen by the user.

Similar to EOH of a system, the consumer-level EOH can also be quantified, which indicates the equivalent duration of infrastructure service outage experienced by each consumer (Equation~ref{eq:consum_eoh}).

$$\gamma_i^K = \int_{T_0}^T \left[1 - \frac{s_i^K(t)}{S_i^K(t)} \right] dt$$

Finally, in order to compute the resilience of the interdependent infrastructure network, a weighted EOH metric is derived (Equation~ref{eq:wEOH}).

$$\overline{\gamma} = \sum_{K \in \mathbb{K}} w^K \gamma^K$$

By default, equal weights are applied to both water and power systems.

DATA REQUIREMENTS

Currently, network generation and hazard generation are not automated in the integrated simulation model. Therefore, in order to use the model, three types of data are to be manually fed into the model, namely the water, power and transportation networks, interdependency data, and infrastructure disruption data. There datasets need to be in specific formats which are compatible with the model. In this chapter, the details such as file formats and information to be included in the input files are discussed in detail.

3.1 Infrastructre Networks

The infrastructure network data must be compatible with the respective infrastructure model packages enlisted in Table 1. In addition, disruptions to certain components belonging to the infrastructure systems are not supported as of now. The individual networks must be constructed taking into the above aspects into consideration.

3.1.1 Water distribution system

Since the integrated simulation model handles the water distribution network models using wntr package, the input file must be in .inp format. Some examples of water network files can be found in wntr Github repository1. The water network can be either built using EPANET or wntr package. Currently, the water network simulation is performed using WNTRSimulator in the wntr package. Therefore, there are certain exceptions which must be considered while generating the water network file. These exceptions can be found in wntr's software framework and limitations page.

In addition, the integrated simulation model identifies the component details such as infrastructure type, component type, etc. using the component names. The name of the components must follow the nomenclature. The details of nomenclature and whether a component can be failed in the model is presented in Table 3.1. For example, a water pump can be named as W_WP1. Integers must be followed by the prefix to name components belonging to same category.

Table 3.1. Nomenclature for water network components

Prefix	Component name	Disruption sup-	Prefix	Component name	Disruption sup-
		ported			ported
W_WP	Pump	Yes	W_PMA	Main Pipe	Yes
W_R	Reservoir	No	W_PHC	Hydrant Connection	Yes
				Pipe	
W_P	Pipe	Yes	W_PV	Valve converted to	Yes
				Pipe	
W_PSC	Service Connection	Yes	W_J	Junction	No
	Pipe				
W_T	Tank	Yes			

3.1.2 Power systems

The power system is modeled using pandapower package, and therefore the network file must be in *.json format. Several tutorials for generating power system networks using pandapower are available in the package's tutorial page. Similar to water network components, naming of power system components must also follow the stipulated nomenclature presented in Table 3. Currently, power networks are modeled as three-phase systems. Therefore, single-phase components in pandapower are not supported. Integers must be followed by the prefix to name components belonging to same category.

Table 3.2. Nomenclature for power network components

Pre-	Component name	Disruption	Pre-	Component name	Disruption
fix		supported	fix		supported
P_B	Bus	Yes	P_L	Line	Yes
P_BLC	Bus connected to load	Yes	P_TF	Transformer	Yes
P_BS	Bus connected to switch	Yes	P_TFE	GTransformer connected to	Yes
				external grid	
P_BEC	Bus connected to external	yes	P_S	Switch	Yes
	grid connection				
P_LO	Load	Yes	P_SEG	Switch connected to exter-	Yes
				nal grid	
P_MP	Motor	Yes	P_SLI	Switch connected to Line	Yes
P_G	Generator	No	P_EG	External Grid connection	Yes

3.1.3 Transportation system

The transportation system is simulated using the static traffic assignment model developed by Prof. Stephen Boyles of Department of Civil, Architectural and Environmental Engineering, The University of Texas at Austin. The transportation network data must be in the TNTP data format. More details on the format and example networks can be found in Ben Stabler's Github page4. The naming of the transportation network components must follow the nomenclature presented in Table 3.3. Integers must be followed by the prefix to name components belonging to same category.

Table 3.3. Nomenclature for transportation network components

Prefix	Component name	Disruption supported
T_J	Junction	No
T_L	Link	Yes

3.2 Infrastructure dependencies

Data related to water-power dependencies between infrastructure components must be provided separately in a .csv file. The file must contain water_id and power_id fields which represent the water- and power component names (Table 3.4). The model will determine the type of the waterand power components and construct the dependencies accordingly.

Table 3.4. Format of disruption data

water_id	power_id	
W_WP9	P_MP1	
W_R9	P_G3	

3.3 Infrastructure disruption data

The third data input is related to disrupted components. Similar to the dependency input file, the disruption data also needs to be provided in *.dat format. The file should have three fields, namely time_stamp (time of disruption in seconds), components (name of the component that is included in any of the three networks), $fail_perc$ (percentage of damage), and recovery_time (recovery time in hours). An example for the dependency data is presented in Table 3.5.

table 3.5. Format of disruption data

time_stamp	components	fail_perc	recovery_time
7200	W_PMA1	50	7
7200	W_MP2	75	138
7200	T_L438	25	13

While the percentage of damage of component is not used in the current model, this may be incorporated in the model to find the repair duration estimate in the future versions.

CHAPTER

FOUR

INSTALLATION

4.1 From sources

The sources for dreaminsg-integrated-model can be downloaded from the Github repo.

You can either clone the public repository:

\$ git clone git://github.com/srijithabalakrishnan/dreaminsg_integrated_model

Once you have a copy of the source, you can install it with:

\$ python setup.py install

You may need to create a new Python environment that has all required packages and dependencies installed before start using the package. Run the following comment.

\$ conda env create --name infrarisk --file=environment.yml

We have observed that in certain instances, a few package conflicts when installing the environment. If so, please install the packages manually.

CHAPTER

FIVE

GETTING STARTED

This chapter provides a step-by-step tutorial for running a model predictive control (MPC) method to identify the optimal repair strategy after a disruptive event. It is suggested to create a Jupyter notebook inside the notebooks folder as below:

```
$ cd notebooks
$ conda activate infrarisk
(infrarisk) $ conda install ipykernel
(infrarisk) $ ipython kernel install -user -name=infrarisk
```

The browser would open showing available notebook kernels. Select redcar from options to open a Jupyter notebook that can run the integrated simulation model.

5.1 Shelby county simulation demonstration

5.1.1 Load required modules and libraries

Now run the following IPython extensions to reload all modules within the simulation package and set the Jupyter notebook.

```
%load_ext autoreload
%autoreload 2

from IPython.core.display import display, HTML
display(HTML("<style>.container { width:100% !important; }</style>"))
from IPython.core.interactiveshell import InteractiveShell
InteractiveShell.ast_node_interactivity = "all"
```

Now, load the required modules and external libraries manually as follows:

```
from pathlib import Path
from infrarisk.src.network_recovery import *
import infrarisk.src.simulation as simulation
from infrarisk.src.physical.integrated_network import *
import infrarisk.src.recovery_strategies as strategies
import infrarisk.src.socioeconomic.se_analysis as se_analysis
from infrarisk.src.physical.interdependencies import *

import infrarisk.src.plots as model_plots
```

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```
import warnings
warnings.filterwarnings('ignore')
```

5.1.2 Create an IntegratedNetwork object and load inidividual networks

In order to create the integrated infrastructure model, first we need to initiate the IntegratedNetwork object from the integrated_network module. Then the individual models should be loaded one by one to the IntegratedNetwork object. For this study, we use a simplified integrated network consisting of a few nodes and links.

Next, the individual infrastructure networks will be converted into a networkX object for plotting purposes.

```
shelby_network.generate_integrated_graph(basemap = True)
```

The above method will create the object and outputs the integrated graph (Fig. 5.1) consisting of the topologies of all the three infrastructure networks that were loaded.

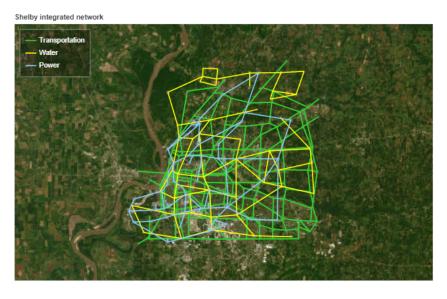


Fig. 5.1: Integrated network of Shelby County, TN

In the next step, we need to build the interdependencies within the integrated network. In this model, three types of interdependencies are considered.

- 1. Water pump on electric motor (water system on power system dependency)
- 2. Power generator on reservoir (power system on water system dependency)
- 3. All power and water system components on nearest transportation network node (power and water systems on transportation system dependency)

The information related to the first two types of dependencies must be provided in the form of csv file whereas the third set of dependencies will be automatically identified by the simulation model.

```
dependency_file = MAIN_DIR/f"{network_dir}/dependencies.csv"
shelby_network.generate_dependency_table(dependency_file = dependency_file)
```

The dependencies are referenced using two pandas dataframes in the model.

- wp_table stores water power dependencies.
- access_table stores transportation access dependencies.

In order to view the wp_table, the following line of code may be implemented. It will return the table shown in Table 7.

shelby_network.dependency_table.wp_table.head()

water_id	power_id	water_type	power_type
W_WP81	P_MP81	Pump	Motor
W_WP82	P_MP82	Pump	Motor
W_WP83	P_MP83	Pump	Motor
W_WP84	P_MP84	Pump	Motor
W_WP85	P_MP85	Pump	Motor

Similarly, the access_table can be printed which will return a table as shown in Table 8.

shelby_network.dependency_table.access_table.head()

origin_id	transp_id	origin_cat	origin_type	access_dist
P_B40L0	T_J153	power	Bus connected to load	2202.69
P_B57L0	T_J153	power	Bus connected to load	3411.97
P_B2L0	T_J58	power	Bus connected to load	1262.27
P_B12L0	T_J183	power	Bus connected to load	1195.67
P_B49L0	T_J54	power	Bus connected to load	698.73

5.1.3 Load socioeconomic data for Shelby County

Before we initiate the simulations, we need to download the socio-economic data for Shelby county. The following code does that. Please note that socioeconomic analysis is only specific to Shlby county and may not work in the case of other available networks in this package. The user may use the socio-economic module for retrieving data for other counties in the United States.

```
year, tract, county, state = 2017, '*', 157, 47
county = 157
```

(continues on next page)

(continued from previous page)

```
ShelbySE.plot_interactive(type = "annual receipts")
```

The above code would produce an interative map showing the annual industrial output from various zipcodes of Shelby County in Tennessee.

5.1.4 Generate disaster scenario and set infrastructure component disruptions

The information regarding the dursuptive events are also stored in the IntegratedNetwork object. The data related to disrupted components and the level of damage must be provided in csv file format.

```
scenario_folder = f"scenarios/scenario1"
disruption_file = MAIN_DIR/f"{network_dir}/{scenario_folder}/disruption_file.dat"
shelby_network.set_disrupted_components(disruption_file=disruption_file)
disrupted_components = shelby_network.get_disrupted_components()
print(*disrupted_components, sep = ", ")
```

In this example, 14 components in the integrated network are failed, including six water pipes, six power lines and two road links. The disruptive events table can be returned using the following code.

```
shelby_network.get_disruptive_events()
```

The returned pandas dataframe would like the one below (Table 6). It shows the time (time_stamp) in seconds at which the component (components) failed and the intensity of damage in percentage (fail_perc).

5.1.5 Set initial locations of restoration crews

To perform the restoration and recovery of damaged or failed components after disruptive event occurs, each of the infrastructure agency has a repair crew. Once the disaster hits, each of these crews are sent to the locations of the damaged infrastructure components based on a recovery strategy. To set the initial locations of the water- power-, and transportation system repair crews, the following method is initiated.

```
crew_count = 10
shelby_network.deploy_crews(
   init_power_crew_locs=['T_J8']*crew_count,
   init_water_crew_locs=['T_J8']*crew_count,
   init_transpo_crew_locs= ['T_J8']*crew_count
)
```

In the current example, for simplicity and demonstration purpose, the initial locations of all the three repair crews are set as T_J8, which is a transportation node (junction).

5.1.6 Simulation of restoration and recovery process

The next step is to create a NetworkRecovery object. The NetworkRecovery object stores recovery related information including the start times and end times of various repair actions.

Now, a NetworkSimulation object is created which include methods to performactions to simulate direct and indirect impacts in the network due to the external event as well as recovery actions.

```
bf_simulation = simulation.NetworkSimulation(network_recovery)
```

Now, we define repair strategy and generate the repair sequence. Here, we adopt HandlingCapacityStrategy in which the repair sequence is generated based of the maximum daily infrastructure service flow handled by the component under normal operating conditions.

```
capacity_strategy = strategies.HandlingCapacityStrategy(shelby_network)
capacity_strategy.set_repair_order()
repair_order = capacity_strategy.get_repair_order()

import os
if not os.path.exists(MAIN_DIR/f"{network_dir}/{scenario_folder}/capacity"):
    os.makedirs(MAIN_DIR/f"{network_dir}/{scenario_folder}/capacity")
```

The next step is to schedule the recovery actions based on the repair sequence as follows:

```
bf_simulation.network_recovery.schedule_recovery(repair_order)
bf_simulation.expand_event_table()
```

Finally, we run the integrated infrastructure simulation model to simulate the indirect effects of the initial infrastructure disruptions. The results of the simulation (including the node-level water and power demands) are stored in the ResilienceMetrics object.

Once the simulation is completed, the results can be saved in a csv file using the following code.

5.1.7 Quanitification of loss using resilience metrics

The ResilienceMetrics object stores the results of the simulation. The following code calculates the water and power resilience values. The average network resilience is also calculated which is the weighted sum of the water and resilience values.

```
resilience_metrics.calculate_power_resmetric(network_recovery)
resilience_metrics.calculate_water_resmetrics(network_recovery)
resilience_metrics.set_weighted_auc_metrics()
```

In addition to the functional resilience values, we can also calculate the economic costs of business disruptions if the industry data is available for the network under study. The following code calculates the sector-wise economic costs of business disruptions.

5.1.8 Plot simulation results

The network performance of water and power systems during the simulation can be visualized using the following code.

The following code plots the map of the network showing the initial diruptions and the initial locations of the repair crews.

```
model_plots.plot_disruptions_and_crews(shelby_network, basemap = True)
```

At the same time, the following code can be used to plot the equivalent outage hours (resilience metric to quantify operational loss) of the water and power systems in various buildings or service areas.

The following code produces an interactive map that shows the sector-wise economic loss of business disruptions due the simulated event.

```
ShelbySE.plot_interactive(type = "economic costs")
```

5.2 Additional tutorials

There are several Jupyter notebooks in infrarisk/notebooks that demonstrate the use of various features of the package, including generating hazards and interdependent infrastructure simulations based on other networks.

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CHAPTER

SIX

SUPPORT

The model is still in development stage. To report any issues in the model, suggest changes, or obtain support with installation or use, please write to srijith.balakrishnan[at]sec.ethz.ch

API DOCUMENTATION

7.1 Subpackages

7.1.1 infrarisk.src.hazards package

infrarisk.src.hazards.custom module

Bases: object

Generates the disruption file consisting of the list of failed components, time of occurrence, and failure percentage (damage extent).

Parameters location (*string*) – The location of the file to be saved.

get_fail_compon_dict()

Returns the dictionary of that could be failed due to a radial disaster.

Returns dictionary of components that could be failed.

Return type dictionary

plot_disruptions(integrated_graph)

set_affected_components(G, plot_components=True)

set_fail_compon_dict()

Sets the dictionary of components that could be failed due to a radial disaster.

set_time_of_occurrence(time_of_occurrence)

Sets the time of occurrence of the disruptive event.

Parameters time_of_occurrence (integer) – Time in seconds and multiple of 60.

infrarisk.src.hazards.fragility_based module

Class of disruption based on fragility analysis

Bases: object

ascertain_damage_probabilities(component, imt_type, imt_value, plotting=True)

Ascertains the damage of a component type

Parameters

- **component** (*str*) The component type
- **imt_value** (*float*) The intensity measure value

ascertain_pipe_damage_probabilities(wn, pipe, gmf_gpd, method=1, plotting=True)

assign_recovery_time(component, failure state)

Assigns the recovery time of a component based on the failure state.

Parameters

- **component** (*str*) The component identifier
- **failure_state** (*str*) The failure state of the component

Returns The recovery time of the component

Return type float

static calculate_state_probability(imt, median, beta)

Calculates the damage state cumulative probability from the fragility functions.

Parameters

- **imt** (*string*) The intensity measure used in the fragility curves.
- **median** (*float*) The median parameter of the fragility curve corresponding to the damage state.
- **beta** (*float*) The beta parameter of the fragility curve corresponding to the damage state

Returns The cumulative probability distribution value corresponding to the damage state.

Return type float

```
generate_bokeh_disruptions(integrated_graph, infra, map_extends)
```

Generates the disruption file consisting of the list of failed components, time of occurrence, and failure percentage (damage extent).

Parameters location (*string*) – The location of the file to be saved.

get_affected_components()

Returns the disrupted infrastructure components.

Returns The disrupted infrastructure components along with their disruption states probabilities.

Return type pandas. DataFrame object

get_fail_compon_dict()

Returns the dictionary of the component types that fail

Returns The dictionary of the component types in each infrastructure system that must be considered for disruption

Return type dict

```
static get_imt_at_line(start_coords, end_coords, imt_type, gmf_gpd)
```

Returns the maximum intensity measure (PGA, PGV, or PGD) along a line if corresponding fragility curves are available.

Parameters

- **start_coords** (*list*) The coordinates of the start point (latitude, longitude) in UTM
- end_coords (list) The coordinates of the end point (latitude, longitude) in UTM
- **imt_type** (*str*) The intensity measure type (PGA, PGV, PGD)
- gmf_gpd (geopandas.GeoDataFrame) The ground motion field data

Returns The maximum intensity measure along the line

Return type float

static get_imt_at_point(coords, imt_type, gmf_gpd)

Returns the intensity measure (PGA, PGV, or PGD) at a point if corresponding fragility curves are available.

Parameters

- coords (list) The coordinates of the point (latitude, longitude) in UTM
- **imt_type** (*str*) The intensity measure type (PGA, PGV, PGD)
- gmf_gpd (geopandas.GeoDataFrame) The ground motion field data

Returns The intensity measure at the point

Return type float

get_imt_dict()

Returns the mapping between infrastructure components and corresponding imt measures as a dictionary.

Returns The dictionary with component prefix as the keys and imt measure types as the values.

Return type dictionary

plot_disruptions(integrated_graph, map_extends)

plot_failure_distributions()

```
plot_imt(gmf_gpd, imt_column)
```

Plots the fragility curves based on intensity measure type (PGA, PGV, or PGD) on the map.

Parameters

- gmf_gpd (geopandas.GeoDataFrame) The ground motion field data
- imt_column (str) The intensity measure type (PGA, PGV, PGD)

plot_state_probabilities(imt_type, imt_value, compon_type, state_cdf)

Plots the probabilities of a component being in different damage states for a given intensity measure value

Parameters

• **imt_type** (*str*) – The intensity measure type (PGA, PGV, PGD)

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- **imt_value** (*float*) The intensity measure value
- **compon_type** (*str*) The component type
- **state_cdf** (*list*) The cumulative probabilities of the component being in different damage states
- **set_affected_components**(*integrated_network*, *gmf_gpd*, *disruption_time*, *plot_components=True*)

 Determines the dirupted infrastructure components using the calculated damage state probabilities.

Parameters

- **G** (IntegratedNetwork.integrated_graph object) The networkx integrated graph object
- gmf_gpd (geopandas.GeoDataFrame object) The geopandas GeoDataFrame that consists of the ground motion fields at available geographic points.
- **disruption_time** (*integer*) The time of disruption in seconds
- plot_components (bool, optional) boolean to determine whether to generate the diruption plots, defaults to True

set_all_fragility_and_recovery_curves()

Creates a dictionary of all fragility curves that will be used in generating the disruptions.

set_compon_fragility_curves(*compon_prefix*, *imt*, *list_of_states*, *list_of_ds_median*, *list_of_ds_beta*)

Sets the fragility curves for a component type

Parameters

- **compon_prefix** (*str*) The prefix of the component type
- **imt** (*str*) The intensity measure type
- list_of_states (list) The list of states
- list_of_ds_median (list) The list of median values of the fragility curves in the order
 of states
- list_of_ds_beta (list) The list of beta values of the fragility curves in the order of states
- **set_compon_recovery_curves**(*compon_prefix*, *list_of_states*, *list_of_recov_mean*, *list_of_recov_sigma*)

 Sets the recovery curves for a component type

Parameters

- **compon_prefix** (*str*) The prefix of the component type
- **list_of_states** (*list*) The list of states
- list_of_recov_mean (list) The list of mean values of the recovery curves in the order of states
- list_of_recov_sigma (list) The list of sigma values of the recovery curves in the order of states

${\tt set_fail_compon_dict}(fail_compon_dict)$

Sets the dictionary of the component types that fail

Parameters fail_compon_dict (*dict*) – The dictionary of the component types in each infrastructure system that must be considered for disruption.

set_gmfs(G, gmf_gpd)

Calculates the ground motion field values of all components that must be considered for disruptions.

Parameters

- **G**(IntegratedNetwork.integrated_graph object) The integrated graph object
- **gmf_gpd** (*geopandas.GeoDataFrame object*) The geopandas GeoDataFrame that consists of the ground motion fields at available geographic points.

set_imt_dict()

Sets the mapping between infrastructure components and corresponding imt measures used in fragility curves, if available.

set_link_gmfs(G, gmf_gpd)

Calculates the ground motion field values of all link (edge) components that must be considered for disruptions.

Parameters

- **G**(IntegratedNetwork.integrated_graph object) The integrated graph object
- **gmf_gpd** (*geopandas.GeoDataFrame object*) The geopandas GeoDataFrame that consists of the ground motion fields at available geographic points.

set_node_gmfs(G, gmf_gpd)

Calculates the ground motion field values of all node components that must be considered for disruptions.

Parameters

- G (IntegratedNetwork.integrated_graph object) The integrated graph object
- gmf_gpd (geopandas.GeoDataFrame object) The geopandas GeoDataFrame that consists of the ground motion fields at available geographic points.

infrarisk.src.hazards.radial module

Bases: object

Class of disaster where the probability of failure of components reduces with distance from the point of occurrence of the event.

```
assign_link_failure(p_occ, start_coords, end_coords)
```

Assigns the link failure status.

Parameters

- **p_occ** (*shapely Point object*) The point of occurrence of the disruptive event.
- **start_coords** (*tuple*) The coordinates of the start node of the link.
- **end_coords** (*tuple*) The coordinates of the end node of the link.

Returns The failure status of the link

Return type bool

```
assign_node_failure(p_occ, node_point)
```

Assigns node failure status.

Parameters

• **p_occ** (*shapely Point object*) – The point of occurrence of the disruptive event.

• **node_point** (*shapely Point object*) – The node for which the failure status is to be assigned.

Returns The failure status of the node.

Return type bool

Generates the disruption file consisting of the list of failed components, time of occurrence, and failure percentage (damage extent).

Parameters location (*string*) – The location of the file to be saved.

get_fail_compon_dict()

Returns the dictionary of that could be failed due to a radial disaster.

Returns dictionary of components that could be failed.

Return type dictionary

plot_disruptions(integrated graph)

set_affected_components(G, plot_components=True)

Set the affected components (nodes and link)

Parameters

- **G** (*Networkx object*) The infrastructure network as a networkx graph.
- plot_components (bool, optional) plots affected components, defaults to True

set_fail_compon_dict(*fail_compon_dict={'power': ['L'], 'transport': ['L'], 'water': ['PMA', 'WP']}*)

Sets the dictionary of components that could be failed due to a radial disaster.

Parameters fail_compon_dict (_type_) – A dictionary of the prefixes of different infrastructure components that must be considered for failing

set_intensity_failure_probability()

Sets the vulnerability (probability of failure) based on the intensity of the disaster event (currently arbitrary values are used).

set_point_of_occurrence(point_of_occurrence)

Sets the point of occurrence of the radial disruption.

Parameters point_of_occurrence (*tuple*, *optional*) – The central point (represented by a tuple of longitude and latitude) of the disruptive event, defaults to None

set_radius_of_impact(radius_of_impact)

Sets the radius of the radial disruption.

Parameters radius_of_impact (*float or integer, optional*) – The radius of the impact (he probability of failure at the curcumferance reacher zero) in metres., defaults to None

set_time_of_occurrence(time_of_occurrence)

Stes the time of occurrence of the disruptive event.

Parameters time_of_occurrence (integer) – Time in seconds and multiple of 60.

infrarisk.src.hazards.random module

A class for radom network disruptions

Bases: object

Generates the disruption file consisting of the list of failed components, time of occurrence, and failure percentage (damage extent).

Parameters location (*string*) – The location of the file to be saved.

get_fail_compon_dict()

Returns the dictionary of that could be failed due to a radial disaster.

Returns dictionary of components that could be failed.

Return type dictionary

plot_disruptions(integrated_graph)

set_affected_components(G, plot_components=True)

set_fail_compon_dict(*fail_compon_dict={'power': ['L'], 'transport': ['L'], 'water': ['PMA', 'WP']}*)

Sets the dictionary of components that could be failed due to a radial disaster.

Parameters fail_compon_dict (_type_) – A dictionary of the prefixes of different infrastructure components that must be considered for failing

set_time_of_occurrence(time_of_occurrence)

Sets the time of occurrence of the disruptive event.

Parameters time_of_occurrence (integer) – Time in seconds and multiple of 60.

infrarisk.src.hazards.track module

Bases: object

Class of flood disaster where the probability of failure of components reduces with the longitudinal distance from the track of the event.

assign_link_failure(track, link_line)

Assigns the link failure status.

Parameters

- **track** (*shapely LineString object*) The track of the disruptive event.
- link_line (shapely LineString object) The link for which the failure status is to be assigned.

Returns The failure status of the link.

Return type bool

assign_node_failure(track, node_point)

Assigns node failure status.

Parameters

- **track** (*shapely LineString object*) The track of the disruptive event.
- **node_point** (*shapely Point object.*) The node for which the failure status is to be assigned.

Returns The failure status of the node.

Return type bool

Generates the disruption file consisting of the list of failed components, time of occurrence, and failure percentage (damage extent).

Parameters location (*string*) – The location of the file to be saved.

generate_random_track(loc_extents, shape='spline')

Generates a random track using a spline connecting three points on the map. :param loc_extents: The [(xmin, ymin), (xmax, ymax)] coordinates from the map denoting the occurrence of the event. :type loc_extents: list of tutples :param shape: The method of generating the track. If "line", generates a straight line, if "spline", generates a smooth curve. :type shape: string :return: The disaster track. :rtype: shapely LineString object

get_fail_compon_dict()

Returns the dictionary of that could be failed due to a radial disaster.

Returns dictionary of components that could be failed.

Return type dictionary

plot_disruptions(integrated_graph)

set_affected_components(G, plot_components=True)

Set the affected components (nodes and link)

Parameters

- **G** (Networkx object) The infrastructure network as a networkx graph.
- plot_components (bool, optional) plots affected components, defaults to True

set_buffer_of_impact(buffer_of_impact)

Sets the impact buffer distance in meters.

Parameters buffer_of_impact (interger or float) – Impact buffer distance in meters.

set_fail_compon_dict(*fail_compon_dict=('power': ['L'], 'transport': ['L'], 'water': ['PMA', 'WP']})*Sets the dictionary of components that could be failed due to a radial disaster.

Parameters fail_compon_dict (_type_) – A dictionary of the prefixes of different infrastructure components that must be considered for failing

set_hazard_tracks_from_linestring(linestring_track)

Sets a hazard track from a LineString object.

Parameters linestring_track (*LineString object*) — A shapely LineString object denoting the track of the hazard.

set_hazard_tracks_from_shapefile(hazard tracks)

Sets the tracks of the track-based hazard from a shapefile.

Parameters hazard_tracks (*shapefile*) – A shapefile that has tracks of the event as LineString objects.

set_intensity_failure_probability()

Sets the vulnerability (probability of failure) based on the intensity of the disaster event (currently arbitrary values are used).

set_time_of_occurrence(time_of_occurrence)

Sets the time of occurrence of the disruptive event.

Parameters time_of_occurrence (integer) – Time in seconds and multiple of 60.

Module contents

7.1.2 infrarisk.src.physical package

Subpackages

infrarisk.src.physical.power package

infrarisk.src.physical.power.power system model module

Functions to implement power systems simulations.

```
infrarisk.src.physical.power.power_system_model.generate_base_supply(pn)
```

infrarisk.src.physical.power_power_system_model.get_power_control_dict()

```
infrarisk.src.physical.power.power_system_model.get_power_dict()
```

Creates a dictionary of major power system components in a network. Used for naming automatically generated networks.

Returns Mapping of infrastructure component abbreviations to names.

Return type dictionary of string: dictionary of string: string

Loads the power system model from a json file.

Parameters

- **network_json** (*string*) Location of the json power system file generated by pandapower package.
- **sim_type** (*string*) Type of power flow simulation: '1ph': single phase, '3ph': three phase.

Returns The loaded power system model object.

Return type pandapower network object

```
infrarisk.src.physical.power_system_model.run_power_simulation(pn)
Runs the power flow model for an instance.
```

Parameters pn (*pandapower network object*) – A power system model object generated by pandapower package.

Module contents

infrarisk.src.physical.transportation package

infrarisk.src.physical.transportation.network module

exception infrarisk.src.physical.transportation.network.BadNetworkOperationException Bases: Exception

You can raise this exception if you try a network action which is invalid (e.g., trying to find a topological order on a network with cycles.)

class infrarisk.src.physical.transportation.network.Network(networkFile=", demandFile=", nodeFile=")

Bases: object

This is the class used for transportation networks. It uses the following dictionaries to store the network; the keys are IDs for the network elements, and the values are objects of the relevant type:

node – network nodes; see node.py for description of this class link – network links; see link.py for description of this class ODpair – origin-destination pairs; see od.py path – network paths; see path.py. Paths are NOT automatically generated

when the network is initialized (you probably wouldn't want this, the number of paths is exponential in network size.)

The network topology is expressed both in links (through the tail and head nodes) and in nodes (forwardStar and reverseStar are Node attributes storing the IDs of entering and leaving links in a list).

 $numNodes,\ numLinks,\ numZones-self-explanatory\ firstThroughNode-in\ the\ TNTP\ data\ format,\ transiting\ through\ nodes\ with$

low IDs can be prohibited (typically for centroids; you may not want vehicles to use these as "shortcuts"). When implementing shortest path or other routefinding, you should prevent trips from using nodes with lower IDs than firstThroughNode, unless it is the destination.

FrankWolfeStepSize(targetFlows, precision=0.0001)

This method returns the step size lambda used by the Frank-Wolfe algorithm.

The current link flows are given in the self.link[ij].flow attributes, and the target flows are given in the targetFlows dictionary.

The precision argument dictates how close your method needs to come to finding the exact Frank-Wolfe step size: you are fine if the absolute difference between the true value, and the value returned by your method, is less than precision.

acyclicShortestPath(origin)

This method finds the shortest path in an acyclic network, from the stated origin. You can assume that a topological order has already been found, and referred to in the 'order' attributes of network Nodes. You can also find a list of nodes in topological order in self.topologicalList. (See the method createTopologicalList below.)

Use the 'cost' attribute of the Links to calculate travel times. These values are given – do not try to recalculate them based on flows, BPR functions, etc.

Be aware that both the order Node attribute and topologicalList respect the usual convention in network modeling that the topological order starts at 1, whereas Python starts numbering at 0.

The implementation in the text uses a vector of backnode labels. In this assignment, you should use back-LINK labels instead. The idea is exactly the same, except you are storing the ID of the last *link* in a shortest

path to each node.

The backlink and cost labels are both stored in dict's, whose keys are node IDs.

* BE SURE YOUR IMPLEMENTATION RESPECTS THE FIRST THROUGH NODE! * Travelers should not be able to use "centroid connectors" as shortcuts, *** and the shortest path tree should reflect this.

You should use the macro utils.NO_PATH_EXISTS to initialize backlink labels, and utils.INFINITY to initialize cost labels.

allOrNothing()

This method generates an all-or-nothing assignment using the current link cost values. It must do the following:

- 1. Find shortest paths from all origins to all destinations
- 2. For each OD pairs in the network, load its demand onto the shortest path found above. (Ties can be broken arbitrarily.)

The resulting link flows should be returned in the allOrNothing dict, whose keys are the link IDs.

Be aware that the network files are in the TNTP format, where nodes are numbered starting at 1, whereas Python starts numbering at 0.

Your code will not be scored based on efficiency, but you should think about different ways of finding an all-or-nothing loading, and how this might best be done.

averageExcessCost()

This method should calculate the average excess cost based on the current link flows, and return this value.

To do this, you will need to calculate both the total system travel time, and the shortest path travel time (you will find it useful to call some of the methods implemented in earlier assignments).

beckmannFunction()

This method evaluates the Beckmann function at the current link flows.

calculateShortestTravelTime(origin, destination)

createTopologicalList()

Takes a topological ordering of the nodes, expressed by the 'order' attribute of the Node objects, and creates a single list which stores the IDs of the nodes in topological order. This is essentially the inverse function of the topological order, the k-th element of this list gives you the ID of the node whose order value is k.

finalize()

Establish the forward and reverse star lists for nodes, initialize flows and costs for links and OD pairs.

findLeastEnteringLinks()

This method should return the ID of the node with the *least* number of links entering the node. Ties can be broken arbitrarily.

findTopologicalOrder()

This method should find a topological order for the network, storing the order in the 'order' attribute of the nodes, i.e.:

self.node[5].order

should store the topological label for node 5.

The topological order is generally not unique, this method can return any valid order. The nodes should be labeled 1, 2, 3, ... up through numNodes.

If the network has cycles, a topological order does not exist. The presence of cycles can be detected in the algorithm for finding a topological order, and you should raise an exception if this is detected.

formAdjacencyMatrix()

This method should produce an adjacency matrix, with rows and columns corresponding to each node, and entries of 1 if there is a link connecting the row node to the column node, and 0 otherwise. This matrix should be stored in self.adjacencyMatrix, which is a dictionary of dictionaries: the first key is the "row" (tail) node, and the second key is the "column" (head) node.

loadPaths()

This method should take given values of path flows (stored in the self.path[].flow attributes), and do the following:

- 1. Set link flows to correspond to these values (self.link[].flow)
- 2. Set link costs based on new flows (self.link[].cost), see link.py
- 3. Set path costs based on new link costs (self.path[].cost), see path.py

readDemandFile(demandFileName)

Reads demand (OD matrix) data from a file in the TNTP format.

readFromFiles(networkFile, demandFile)

Reads network data from a pair of files (networkFile, containing the topology, and demandFile, containing the OD matrix), then do some basic checks on the input data (validate) and build necessary data structures (finalize).

readNetworkFile(networkFileName)

Reads network topology data from the TNTP data format. In keeping with this format, the zones/centroids are assumed to have the lowest node IDs (1, 2, ..., numZones).

relativeGap()

This method should calculate the relative gap (as defined in the course text) based on the current link flows, and return this value.

To do this, you will need to calculate both the total system travel time, and the shortest path travel time (you will find it useful to call some of the methods implemented in earlier assignments).

shiftFlows(targetFlows, stepSize)

This method should update the flow on each link, by taking a weighted average of the current link flows (self.link[ij].flow) and the flows given in the targetFlows dictionary (targetFlows[ij]). stepSize indicates the weight to place on the target flows (so the weight on the current flows is 1 - stepSize).

* IMPORTANT: After updating the flow on a link, you should call its updateCost method, so that the travel time is updated to reflect the new flow value. *

This method does not need to return a value.

shortestPath(origin)

This method finds the shortest path in a network which may or may not have cycles; thus you cannot assume that a topological order exists.

The implementation in the text uses a vector of backnode labels. In this assignment, you should use back-LINK labels instead. The idea is exactly the same, except you are storing the ID of the last *link* in a shortest path to each node.

Use the 'cost' attribute of the Links to calculate travel times. These values are given – do not try to recalculate them based on flows, BPR functions, etc.

The backlink and cost labels are both stored in dict's, whose keys are node IDs.

* BE SURE YOUR IMPLEMENTATION RESPECTS THE FIRST THROUGH NODE! * Travelers should not be able to use "centroid connectors" as shortcuts, *** and the shortest path tree should reflect this.

You should use the macro utils.NO_PATH_EXISTS to initialize backlink labels, and utils.INFINITY to initialize cost labels.

userEquilibrium(stepSizeRule='MSA', maxIterations=100, targetGap=1e-06, gapFunction=<function Network.relativeGap>)

This method uses the (link-based) convex combinations algorithm to solve for user equilibrium. Arguments are the following:

stepSizeRule – a string specifying how the step size lambda is to be chosen. Currently 'FW' and 'MSA' are the available choices, but you can implement more if you want.

maxIterations – stop after this many iterations have been performed targetGap – stop once the gap is below this level gapFunction – pointer to the function used to calculate gap. After

finishing this assignment, you should be able to choose either relativeGap or averageExcessCost.

validate()

Perform some basic validation checking of network, link, and node data to ensure reasonableness and consistency.

infrarisk.src.physical.transportation.tests module

```
infrarisk.src.physical.transportation.tests.approxEqual(value, target, tolerance)
infrarisk.src.physical.transportation.tests.averageExcessCost(testFileName)
infrarisk.src.physical.transportation.tests.check(name, value, target, tolerance)
infrarisk.src.physical.transportation.tests.convexCombination(testFileName)
infrarisk.src.physical.transportation.tests.frankWolfe(testFileName)
infrarisk.src.physical.transportation.tests.readFlowsFile(flowsFileName)
infrarisk.src.physical.transportation.tests.relativeGap(testFileName)
```

infrarisk.src.physical.transportation.transpo compons module

Bases: object

Class for network links. As currently written, assumes costs are calculated as the sum of three factors:

- 1. Travel time, computed via the BPR function
- 2. Toll cost, the product of toll and network.tollFactor
- 3. Distance-related costs, the product of length and network.distanceFactor

calculateBeckmannComponent()

Calculates the integral of the BPR function for the link, for its contribution to the sum in the Beckmann function.

calculateCost()

Calculates the cost of the link using the BPR relation, adding in toll and distance-related costs. This cost is returned by the method and NOT stored in the cost attribute.

updateCost()

Same as calculateCost, except that the link.cost attribute is updated as well.

class infrarisk.src.physical.transportation.transpo_compons.Node(isZone=False)
 Bases: object

class infrarisk.src.physical.transportation.transpo_compons.Path(links, network, flow=0)
 Bases: object

A Path is an ordered sequence of adjacent links; these are expressed in the attribute 'links', which is a tuple of link IDs. Other attributes are as follows:

network points to the parent Network class (needed for calculating costs) flow is the number of vehicles using this path cost is the total cost of the path

calculateCost()

Calculates the cost of the path by summing the cost of its constituent links. This cost is returned by the method and NOT stored in the cost attribute.

updateCost()

Same as calculateCost, except that the path.cost attribute is updated as well.

infrarisk.src.physical.transportation.transpo_compons.get_transpo_dict()

infrarisk.src.physical.transportation.utils module

exception infrarisk.src.physical.transportation.utils.BadFileFormatException Bases: Exception

This exception is raised if a network or demand file is in the wrong format or expresses an invalid network.

This exception is used as a placeholder for code you should fill in.

infrarisk.src.physical.transportation.utils.path2linkTuple(pathString)

Converts a path expressed as a sequence of nodes, e.g. [1,2,3,4] into a tuple of link IDs for use with the Path object (see path.py), in this case ((1,2),(2,3),(3,4))

infrarisk.src.physical.transportation.utils.readMetadata(lines)

Read metadata tags and values from a TNTP file, returning a dictionary whose keys are the tags (strings between the <> characters) and corresponding values. The last metadata line (reading <END OF METADATA>) is stored with a value giving the line number this tag was found in. You can use this to proceed with reading the rest of the file after the metadata.

Module contents

infrarisk.src.physical.water package

infrarisk.src.physical.water.water_network_model module

Functions to implement water network simulations.

```
infrarisk.src.physical.water\_network\_model.add\_control\_system(wn, list\_of\_tanks, list\_of\_pumps, controller\_id=None)
```

Adds a controller system to the water network.

Parameters

- wn (wntr water network object) Water network model object.
- list_of_tanks (list) List of tanks controlled by the controller system.
- list_of_pumps (list) List of pumps controlled by the controller system.
- **id** (*integer*) The ID of the controller to be added.

infrarisk.src.physical.water.water_network_model.add_discharge_pipe(wn, tank_id, elevation)

Adds a discharge pipe to the tank of interest.

Parameters

- wn (wntr water network object) Water network model object.
- tank_id (string) The ID of the tank to which the discharge pipe is to be added.
- **elevation** (*float*) The elevation of the discharge pipe.

```
infrarisk.src.physical.water.water_network_model.add_discharge_pipe_actuator_system(wn,
```

controller_id, list_of_tanks)

Adds a discharge pipe actuator system to the water network.

Parameters wn (wntr water network object) - Water network model object.

Adds a pump actuator system to the water network.

Parameters wn (wntr water network object) - Water network model object.

infrarisk.src.physical.water_network_model.add_tank_level_sensor_system(wn,

controller_id,
list_of_tanks)

Adds a sensor system to the water network.

Parameters

- wn (wntr water network object) Water network model object.
- **controller_id** (*string*) The ID of the controller to which the sensor system is to be added.
- list_of_tanks (list) List of tank IDs for which tank level sensors are to be assigned.

infrarisk.src.physical.water.water_network_model.add_universal_control_system(wn, controller id=None)

Adds single control system to the water network.

Parameters wn (wntr water network object) - Water network model object.

infrarisk.src.physical.water.water_network_model.generate_base_supply(wn_original, directory)
Runs demand driven simulation (DDA) simulation under normal network conditions and stores the node demands.

Parameters

- wn (wntr water network object) Water network model object.
- **directory** (*string*) The directory to which the node demands are to be saved.

infrarisk.src.physical.water.water_network_model.generate_base_supply_pda(wn_original, dir)
Runs pressure-dependent demand simulation (PDA) simulation under normal network conditions and stores the node demands.

Parameters

- wn (wntr water network object) Water network model object.
- **dir** (*string*) The directory to which the node demands are to be saved.

Parameters wn (_type_) - _description_

infrarisk.src.physical.water_water_network_model.get_water_control_dict()

Creates a dictionary of major water distribution system contol components.

Returns Mapping of control component abbreviations to names.

Return type dictionary of string: string

infrarisk.src.physical.water_water_network_model.get_water_dict()

Creates a dictionary of major water distribution system components.

Returns Mapping of infrastructure component abbreviations to names.

Return type dictionary of string: string

 $infrarisk.src.physical.water_water_network_model. \textbf{load_water_network} (\textit{network_inp},$

water_sim_type,
initial_sim_step,
cyber_layer=False)

Loads the water network model from an inp file.

Parameters

- **network_inp** (*string*) Location of the inp water network file.
- water_sim_type The type of water simulation in wntr. Available options are pressure-dependent demand analysis ('PDA') and demand driven analysis ('DDA').
- initial_sim_step (integer) The initial iteration step size in seconds.

Returns The loaded water wntr network object.

Return type wntr network object

```
infrarisk.src.physical.water.water_network_model.run_water_simulation(wn)
    Runs the simulation for one time step.
```

Parameters wn (wntr water network object) - Water network model object.

Returns Simulation results in pandas tables.

Return type ordered dictionary of string: pandas table

infrarisk.src.physical.water.water_network_model.set_initial_control_system_status(wn,

```
actua-

tor_status=1,

sen-

sor_status=1,

con-

troller_status=1)
```

Sets the initial status of the control system components (sensors, actuators, and sensors).

Parameters

- wn (wntr water network object) Water network model object.
- actuator_status (int, optional) Initial status of the actuators, defaults to 1
- sensor_status (int, optional) Initial status of the sensors, defaults to 1
- controller_status (int, optional) Initial status of the controller, defaults to 1

Sets the maximum and allowable range of water levels for the tank.

Parameters

- wn (wntr water network object) water network model object.
- tank_id (string) Name of the tank (id).
- **tolerance** (*float*) The difference between maximum and allowable tank levels in meters.

infrarisk.src.physical.water_water_network_model.set_tl_sensor_ef(wn, tank_id, error_factor)

Sets the error factor for the tank level sensor. A value of 1 means no error.

Parameters

- wn (wntr water network object) Water network model object.
- tank_id (str) Tank ID.
- error_factor (float) Error factor.

Module contents

infrarisk.src.physical.integrated_network module

Bases: object

An integrated infrastructure network class

deploy_crews (*init_power_crew_locs=None*, *power_crews_size=None*, *init_water_crew_locs=None*, *water_crews_size=None*, *init_transpo_crew_locs=None*, *transpo_crews_size=None*)

Deploys the infrastructure crews for performing recovery actions.

Parameters

- init_power_crew_locs (list of strings) Initial locations (nearest transportation nodes) of the power crews.
- power_crews_size (list) Size of the power crews.
- init_water_crew_locs (list) Initial locations (nearest transportation nodes) of the water crews.
- water_crews_size (list) Size of the water crews.
- init_transpo_crew_locs (list of strings) Initial locations (nearest transportation nodes) of the transportation crews.
- **transpo_crews_size** (*list*) Size of the transportation crews.

generate_betweenness_centrality()

Generates the betweenness centrality of the integrated graph.

generate_dependency_file)

Generates the dependency table from an input file.

Parameters dependency_file (*string*) – The location of the dependency file in csv format.

generate_integrated_graph(basemap=False)

Generates the integrated network as a Networkx graph.

Parameters basemap (bool, optional) – If True, the basemap will be added to the integrated graph, defaults to False

generate_power_networkx_graph(plot=False)

Generates the power network as a networkx object.

Parameters plot (bool, optional) – To generate the network plot, defaults to False.

Returns The power network as a networkx object.

Return type networkx.Graph

generate_transpo_networkx_graph(plot=False)

Generates the transportation network as a networkx object.

Parameters plot (bool, optional) – To generate the network plot, defaults to False., defaults to False.

Returns The transportation network as a network object.

Return type networkx.Graph

generate_water_networkx_graph(plot=False)

Generates the water network as a networkx object.

Parameters plot (bool, optional) – To generate the network plot, defaults to False., defaults to False.

Returns The water network as a networkx object.

Return type networkx.Graph

get_disrupted_components()

Returns the list of disrupted components.

Returns current list of disrupted components.

Return type list

get_disrupted_infra_dict()

Returns the disrupted infrastructure components dictionary.

Returns The disrupted infrastructure components dictionary.

Return type dictionary

get_disruptive_events()

Returns the disruptive event data

Returns The table of disruptive events.

Return type pandas.DataFrame

get_idle_crew(crew_type, min_time=None)

Returns the idle crew of the given type.

Parameters

- **crew_type** (*string*) Type of the crew.
- min_time (float) Earliest time to be considered for the idle crew.

Returns The idle crew of the given type.

Return type repair_crews.

get_map_extends()

Returns the extents of the map in the format ((xmin, ymin), (xmax, ymax)).

Returns The extent of the integrated graph (coordinates)

Return type list of tuples

get_node_link_dict()

Returns the dictionary of nodes and links in the network.

get_power_crew_loc()

Returns the current power crew location.

Returns Power crew location

Return type string

get_transpo_crew_loc()

Returns the current transportation crew location.

Returns Transportation crew location

Return type string

get_water_crew_loc()

Returns the current water crew location.

Returns Water crew location

Return type string

Loads the water, power and transportation networks.

Parameters

- water_folder (pathlib.Path object, optional) The directory that consists of required water network files, defaults to None
- **power_folder** (*pathlib.Path object*, *optional*) The directory that consists of required power network files, defaults to None
- **transp_folder** (*pathlib.Path object*, *optional*) The directory that consists of required traffic network files, defaults to None
- **power_sim_type** (*string*, *optional*) Power simulation type ("1ph" for single phase networks, "3ph" for three phase networks), defaults to "1ph"
- water_sim_type (string) Type of water simulation: 'PDA' for pressure-dependent driven analysis, 'DDA' for demand driven analysis
- **sim_step** (*int*, *optional*) Simulation step in seconds, defaults to 60
- **cyber_layer** (*bool*, *optional*) Whether to include cyber layer in the integrated network, defaults to False

load_power_network(power_folder, power_sim_type, cyber_layer=False)
Loads the power network.

Parameters

- **power_file** (*string*) The power systems file in json format
- **power_sim_type** (*string*, *optional*) Power simulation type ("1ph" for single phase networks, "3ph" for three phase networks), defaults to "1ph"
- **service_area** (*bool*, *optional*) If True, the service area will be loaded, defaults to False

load_transpo_network(transp_folder)

Loads the transportation network.

Parameters transp_folder (*string*) – The directory that consists of required transportation network files

load_water_network(*water_folder*, *water_sim_type*, *initial_sim_step=60*, *cyber_layer=False*) Loads the water network.

Parameters

- water_folder (pathlib.Path object) The directory that consists of required water network files
- water_sim_type (string) Type of water simulation: 'PDA' for pressure-dependent driven analysis, 'DDA' for demand driven analysis
- initial_sim_step (int, optional) The initial simulation step in seconds, defaults to 60
- cyber_layer (bool, optional) If True, the cyber layer will be loaded, defaults to False

pipe_leak_node_generator()

Splits the directly affected pipes to induce leak during simulations.

reset_crew_locs()

Resets the location of infrastructure crews.

set_disrupted_components(disruption_file)

Sets the disrupted components in the network.

Parameters scenario_file (string) – The location of the physical disruption scenario file in the list.

set_disrupted_cyber_components(cyber_disruption_file)

Sets the disrupted components in the network.

Parameters cyber_disruption_file - The location of the disruption scenario file in the list.

set_disrupted_cyber_dict()

Sets the disrupted infrastructure components dictionary with infrastructure type as keys.

set_disrupted_infra_dict()

Sets the disrupted infrastructure components dictionary with infrastructure type as keys.

set_map_extends()

Sets the extents of the map in the format ((xmin, ymin), (xmax, ymax)).

set_power_crew_loc(power_crew_loc)

Sets the location of the power crew.

Parameters power_crew_loc (string) – The name of the location (transportation node)

set_transpo_crew_loc(transpo_crew_loc)

Sets the location of the transportation crew.

Parameters transpo_crew_loc (*string*) – The name of the location (transportation node)

set_water_crew_loc(water_crew_loc)

Sets the location of the water crew.

Parameters water_crew_loc (*string*) – The name of the location (transportation node)

infrarisk.src.physical.interdependencies module

Classes and functions to manage dependencies in the integrated infrastructure network.

class infrarisk.src.physical.interdependencies.DependencyTable

Bases: object

A class to store information related to dependencies among power, water and transportation networks.

add_gen_reserv_coupling(water_id, power_id)

Creates a generator-on-reservoir dependency entry in the dependency table.

Parameters

- water_id (string) The name of the reservoir in the water network model.
- **power_id** (*string*) The name of the generator in the power systems model.

add_pump_loadmotor_coupling(water_id, power_id)

Creates a pump-on-motor dependency entry in the dependency table when motor is modled as a load.

Parameters

- water_id (string) The name of the pump in the water network model.
- **power_id** (*string*) The name of the motor (modeled as load in three phase pandapower networks) in the power systems model.

add_pump_motor_coupling(water_id, power_id)

Creates a pump-on-motor dependency entry in the dependency table.

Parameters

- water_id (string) The name of the pump in the water network model.
- **power_id** (*string*) The name of the motor in the power systems model.

add_transpo_access(integrated_graph)

Creates a mapping to nearest road link from every water/power network component.

Parameters integrated_graph (networkx. Graph) – The integrated network as networkx object.

build_power_water_dependencies(dependency file)

Adds the power-water dependency table to the DependencyTable object.

Parameters dependency_file (*string*) – The location of the dependency file containing dependency information.

build_transportation_access(integrated_graph)

Adds the transportatio naccess table to the DependencyTable object.

Parameters integrated_graph (networkx.Graph) – The integrated network as Networkx object.

update_dependencies(network, time_stamp, next_time_stamp)

Updates the operational performance of all the dependent components in the integrated network.

Parameters

- **network** (*networkx*. *Graph*) The integrated infrastructure network object.
- **time_stamp** (*integer*) The start time of the current iteration in seconds.
- **next_time_stamp** (*integer*) The end tiem of the iteration.

infrarisk.src.physical.interdependencies.**find_connected_nodes**(component, integrated_network) Finds the nodes to which the given component is connected to.

Parameters

- **component** (*string*) Name of the component.
- integrated_network (networkx.Graph) The integrated network in networkx format.

Returns List of connected nodes.

Return type list

infrarisk.src.physical.interdependencies.find_connected_power_node(component, pn)

Finds the bus to which the given power systems component is connected to. For elements which are connected to two buses, the start bus is returned.

Parameters

- **component** (*string*) Name of the power systems component.
- **pn** (pandaPowerNet) The power network the origin node belongs to.

Returns Name of the connected bus.

Return type string

infrarisk.src.physical.interdependencies.find_connected_transpo_node(component, tn)

Finds the bus to which the given power systems component is connected to. For elements which are connected to two buses, the start bus is returned.

Parameters

• **component** (*string*) – Name of the power systems component.

• **pn** (pandaPowerNet) – The power network the origin node belongs to.

Returns Name of the connected bus.

Return type string

 $infrarisk.src.physical.interdependencies. \textbf{find_connected_water_node}(\mathit{component}, \mathit{wn})$

Finds the water network node to which the water component is connected to.

Parameters

- **component** (*string*) Name of the water network component.
- wn (wntr.network.WaterNetworkModel) The water distribution network the origin node belongs to.

Returns Name of the water network node.

Return type string

infrarisk.src.physical.interdependencies.get_compon_details(compon_name)

Fetches the infrastructure type, component type, component code and component actual name.

Parameters compon_name (string) – Name of the component.

Returns Infrastructure type, component type, component code and component actual name.

Return type list

infrarisk.src.physical.interdependencies.get_compon_repair_time(component)

Returns the repair time of the given component.

Parameters component (*string*) – Name of the component.

Returns Repair time of the component in hours.

Return type float

Finds the nearest node belonging to a specific family from a given node and the distance between the two.

Parameters

- **integrated_graph** (*netwrokx.Graph*) The integrated network in networkx format.
- **connected_node** (*string/integer*) Name of the node for which the nearest node has to be identified.
- target_type (*string*) The type of the target node (power, transpo, water)

Returns Nearest node belonging to target type and the distance in meters.

Return type list

Module contents

7.1.3 infrarisk.src.socioeconomic package

infrarisk.src.socioeconomic.se_analysis module

Bases: object

A class for downloading and analyzing socioeconomic data for a given county in the United States. The module is used to quantify the sector-wise economic impacts from infrastructure disruptions.

calculate_economic_costs()

Calculate the zipcode-level economic costs of water and power outages for each industrial sector in the county.

combine_infrastructure_se_data(integrated_network, resilience_metrics)

Combine the SE data with the infrastructure data.

Parameters

- integrated_network (IntegratedNetwork) The integrated network object.
- resilience_metrics (ResilienceMetrics) The resilience metrics object.

create_setable()

Create a socioeconomic table for the county zipcodes by combining American Business Survey data with County shapefile.

download_abs_data(force_download=False)

Download Annual Business Survey data from census.gov and save to the local drive.

Parameters force_download (*boo1*) – If True, download the ABS data even if it already exists on the local drive.

download_acs5_data(force_download=False)

Download 5-year American Community Survey data from census.gov and save to the local drive.

Parameters force_download (*bool*) – If True, download the ACS5 data even if it already exists on the local drive.

download_cbp_data(force_download=False)

Download County Business Patterns data from census.gov and save to the local drive.

Parameters force_download (*boo1*) – If True, download the CBP data even if it already exists on the local drive.

download_ecnbasic_data(force_download=False)

Download Economic Census Basic data from census.gov and save to the local drive.

Parameters force_download (*boo1*) – If True, download the ECNBasic data even if it already exists on the local drive.

download_se_data(force_download=False)

Download all SE data (County maps, CBP, ECN and ABS datasets) from census.gov and save to the local drive.

Parameters force_download (*bool*) – If True, download the SE data even if it already exists on the local drive.

download_zipcode_map(force_download=False)

Download zipcode shapefile from census.gov and save to the local drive.

Parameters force_download (*bool*) – If True, download the zipcode-level county shapefile even if it already exists on the local drive.

plot_economic_costs(var, alpha)

Plot the economic costs of an industry in the county.

Parameters

- **var** (*str*) The name of the industry to plot.
- **alpha** (*float*) The transparency of the plot.

plot_industry_output(var, alpha)

Plot the annual receipts of an industry in the county.

Parameters

- **var** (*str*) The name of the industry to plot.
- **alpha** (*float*) The transparency of the plot.

plot_interactive(type='annual receipts')

Plot the economic costs of water and power outages for each industrial sector in the county.

Parameters type (*str*) – The type of plot to generate. Options are "annual receipts" and "economic costs".

Module contents

7.2 infrarisk.src.network_recovery module

Bases: object

Generate a disaster and recovery object for storing simulation-related information and settings.

add_additional_end_events(repair_order, extra_hours=8)

Add events post-recovery to the event table.

Parameters

- repair_order (list) list of components to be repaired
- extra_hours (integer, optional) Number of hours post-recovery to be added, defaults to 5

add_disruption_to_event_table()

Schedules the events until the initial disruption events.

add_recovery_to_event_table(component, recovery_start, recovery_time)

Adds the recovery time to the event table.

Parameters

- **component** (*string*) The component name
- recovery_start (integer) The start time of the recovery in seconds

• **recovery_time** (*integer*) – The duration of the recovery in seconds

calculate_recovery_start_end(links_to_repair, repair_order)

Calculates the start and end times for the repair of the links.

Parameters

- **links_to_repair** (*list*) The list of components to be repaired
- **repair_order** (*1ist*) The list of components to be repaired in the order in which they are to be repaired

Returns The component name, start time and duration of the repair of the links

Return type list

calculate_recovery_time(component)

Calculates the recovery time of the given component.

Parameters component (*string*) – Component whose recovery time is to be calculated.

Returns Recovery time of the component in seconds.

Return type float

calculate_travel_time_and_path(component, crew)

Calculates the travel time and path for a component and crew.

Parameters

- component (string) The component for which the travel time and path is to be calculated
- crew (crew object) The crew for which the travel time and path is to be calculated

Returns The nearest node, travel time to that node for the crew and path for the component and crew

Return type list

check_route_accessibility(failed_transpo_link_en_route)

Checks when the failed transportation links along a route are repaired and the possible start time.

Parameters failed_transpo_link_en_route (list) – List of transportation links along the route.

Returns Accessibility and possible start time of the route.

Return type list

fail_transpo_link(link compon)

Fails the given transportation link by changing the free-flow travel time to a very large value.

Parameters link_compon (*string*) – Name of the transportation link.

get_event_table()

Returns the event table.

Returns The event table.

Return type pandas.DataFrame

remove_previous_water_controls()

Removes all previous pump controls

reset_networks()

Resets the IntegratedNetwork object within NetworkRecovery object.

restore_transpo_link(link_compon)

Restores the disrupted transportation link by changing the free flow travel time to the original value.

Parameters link_compon (*string*) – Name of the transportation link.

schedule_recovery(repair order)

Generates the unexpanded event table consisting of disruptions and repair actions.

Parameters repair_order (*list of strings*.) – The repair order considered in the current simulation.

set_initial_crew_start()

Sets the initial start times at which the respective infrastructure crews start from their locations post-disaster.

switch_closure_allowed(compons_to_repair, switch)

Check if a switch closure is possible. Depends on whether a switch needs to be open to isolate any component whose repair is not yet performed

Parameters

- **compons_to_repair**(*list*)—List of components to be repaired excluding the component under consideration.
- **switch** (*string*) Switch component

Returns True if switch closure is allowed, False otherwise.

Return type bool

update_directly_affected_components(time stamp, next sim time)

Updates the operational performance of directly impacted infrastructure components by the external event.

Parameters

- **time_stamp** (*integer*) Current time stamp in the event table in seconds.
- **next_sim_time** (*integer*) Next time stamp in the event table in seconds.

update_traffic_model()

Updates the static traffic assignment model based on current network conditions.

Adds a leak to a junction.

Parameters

- wn (wntr.network.WaterNetworkModel) Water network object.
- **leak_junc** (*string*) Name of the junction where the leak is to be added.
- **area** (*float*) Area of the leak in m².
- **discharge_coeff** (*float*) Discharge coefficient of the leak.
- **start_time** (*integer*) Time at which the leak must start in seconds.
- **end_time** (*integer*) Time at which the leak must end in seconds.

infrarisk.src.network_recovery.get_nearest_time_step(time_stamp, time_step)
Returns the nearest time step to the given time stamp.

Parameters

- **time_stamp** (*integer*) Time stamp in seconds.
- **time_step** (*integer*) Time step in seconds.

infrarisk.src.network_recovery.link_close_event(wn, pipe_name, time_stamp, state)
 Closes a pipe.

Parameters

- wn (wntr.network.WaterNetworkModel) Water network object.
- pipe_name (string) Name of the pipe.
- **time_stamp** (*integer*) Time stamp at which the pipe must be closed in seconds.
- **state** (*string*) The state of the object.

Returns The modified wntr network object after pipe splits.

Return type wntr network object

infrarisk.src.network_recovery.link_open_event(wn, pipe_name, time_stamp, state)

Opens a pipe. :param wn: Water network object. :type wn: wntr.network.WaterNetworkModel :param pipe_name: Name of the pipe. :type pipe_name: string :param time_stamp: Time stamp at which the pipe must be opened in seconds. :type time_stamp: integer :param state: The state of the object. :type state: string :return: The modified wntr network object after pipe splits. :rtype: wntr.network.WaterNetworkModel

infrarisk.src.network_recovery.pipe_leak_node_generator(network)

Splits the directly affected pipes to induce leak during simulations.

Parameters network (IntegratedNetwork object) – Integrated infrastructure network object

7.3 infrarisk.src.optimizer module

class infrarisk.src.optimizer.BruteForceOptimizer(prediction_horizon=None)

Bases: infrarisk.src.optimizer.Optimizer

A Brute Force Optimizer class

Parameters Optimizer (Optimizer abstract class.) – An optimizer class.

find_optimal_recovery(simulation)

Identifies the optimal recovery strategy using the Model Predictive Control principle.

Parameters simulation (infrarisk.src.simulation.NetworkSimulation) – The infrastructure network simulation object.

get_optimization_log()

Returns the optimization log.

Returns A table consisting of the AUC values from the network simulations.

Return type pandas.DataFrame

get_repair_permutations(simulation)

Returns all possible permutations of the repair order.

Parameters simulation (infrarisk.src.simulation.NetworkSimulation) — An integrated infrastructure network simulation object.

Returns A nested list of all possible repair permutations for the given list of components.

Return type list

get_trackers()

Returns the time, power consumption ratio and water consumption ratio values.

Returns: lists: list

class infrarisk.src.optimizer.Optimizer(prediction_horizon=None)

Bases: abc.ABC

The Optimizer class defines an interface to a discrete optimizer or can be implemented as such. This optimizer takes a network object and a prediction horizon and should compute the best steps of the length of the prediction_horizon

```
abstract find_optimal_recovery(simulation)
abstract get_optimization_log()
abstract get_trackers()
```

7.4 infrarisk.src.plots module

Functions to generate infrastructure network plots and result plots.

```
infrarisk.src.plots.integrate(x, y)
```

Calculates the area under a curve

Parameters

- **x** (array of floats) An array of the x values of the curve
- **y** An array of the y values of the curve

:type y:array of floats :return: The area under the curve :rtype: float

infrarisk.src.plots.plot_bokeh_from_integrated_graph(G, title, extent=[(1000, 1000), (8000, 6600)], basemap=False)

Converts the integrated network into a Bokeh interactive plot.

Parameters

- **G** (networkx.Graph) Integrated network on which the simulation is to be performed.
- title (string) Title of the plot.
- **extent** (*list*, *optional*) Extent of the plot as a list of tuple in the format [(xmin, xmax), (ymin, ymax)], defaults to [(1000, 8000), (1000, 6600)]

Plots the links on the map.

Parameters

- **p** (*bokeh.plotting.figure.Figure*) The bokeh figure object.
- \mathbf{x} (list) The x coordinates of the links.
- y(list) The y coordinates of the links.
- **infra** (*string*) The infrastructure type of the links.
- **link_layer** (*string*) The link layer of the links.
- **link_category** (*string*) The link category of the links.
- ids (list) The link ids.
- **line_dash** (*string*) The line dash style of the links.
- **color** (*string*) The color of the links.

• **alpha** (*float*) – The alpha value of the links.

Returns The bokeh figure object.

Return type bokeh.plotting.figure.Figure

infrarisk.src.plots.plot_disruptions_and_crews(integrated_network, basemap=False)
Generate a plot of the number of disruptions and crews for each strategy.

Parameters

- integrated_network (infrarisk.src.physical.integrated_network. IntegratedNetwork) - The integrated network object
- basemap (bool, optional) Whether to include a basemap, defaults to False

infrarisk.src.plots.plot_interdependent_effects(resilience_metrics, metric, title=True)
Plots the interdependent effects of the water and power systems.

Parameters

- resilience_metrics (infrarisk.src.resilience_metrics. WeightedResilienceMetric) The object in which simulation results are stored.
- **metric** (*string*) The metric to be plotted.
- title (bool, optional) Whether to show the title, defaults to True

Plots the impact of the disruption on the network.

Parameters

- resilience_metrics (infrarisk.src.resilience_metrics. WeightedResilienceMetric) The object in which simulation results are stored.
- integrated_network (infrarisk.src.integrated_network. IntegratedNetwork) - The integrated network.
- **strategy** (*string*) The strategy used to restore the network.
- **node_prefix** (*string*) The prefix of the nodes to be considered.
- **infra** (*string*, *optional*) The infrastructure to be considered, defaults to "power"
- time_index (int, optional) The time index to be considered, defaults to None

infrarisk.src.plots.plot_power_net(net)

Generates the power systems plot.

Parameters net (pandapowerNet) – The power systems network.

infrarisk.src.plots.plot_region_impact_map(resilience_metrics, sa_dict, strategy, extends)
 Plot the impact map of the region.

Parameters

- resilience_metrics (: infrarisk.src.resilience_metrics. WeightedResilienceMetric) - The object in which simulation results are stored
- **sa_dict** (*dictionary of geopandas.GeoDataFrame*) The power and water socioe-conomic impact dictionary
- **strategy** (*string*) The name of the recovery strategy
- **extends** (tuple) The extends of the region

infrarisk.src.plots.plot_repair_curves(network_recovery, scatter=False)

Generates the direct impact and repair level plots for the failed components.

Parameters

- **network_recovery** (infrarisk.src.network_recovery.NetworkRecovery) The disrupt_generator.DisruptionAndRecovery object.
- scatter (bool, optional) scatter plot, defaults to False

infrarisk.src.plots.plot_transpo_net(transpo_folder)

Generates the transportation network plot.

Parameters transpo_folder (*string*) – Location of the transport model (.tntp files).

infrarisk.src.plots.plot_water_net(wn)

Generates the water network plot.

Parameters wn (wntr.network.WaterNetworkModel) - The water network.

7.5 infrarisk.src.recovery_strategies module

class infrarisk.src.recovery_strategies.CentralityStrategy(integrated_network)

Bases: object

Based on betweenness centrality of the components multiplied by capacity. Break ties randomly.

get_repair_order()

Returns the repair sequence based on the principle of betweenness centrality.

Returns A list of component names in the order of repair action.

Return type list

set_repair_order()

Identifies the repair sequence based on the betweenness centrality measure. For methodology, please refer to networkx package documentation.

class infrarisk.src.recovery_strategies.CrewDistanceStrategy(integrated_network)

Bases: object

Based on the distance between the component and the crew location. Break ties randomly.

get_repair_order()

Returns the repair sequence based on the distance from the initial crew location.

Returns A list of component names in the order of repair action.

Return type list

set_repair_order()

Identifies the repair sequence based on the distance from crew location.

class infrarisk.src.recovery_strategies.HandlingCapacityStrategy(integrated_network)

Bases: object

Based on the predetermined priority for different components

get_repair_order()

Returns the repair sequence based on the distance from the initial crew location.

Returns A list of component names in the order of repair action.

Return type list

```
set_repair_order()
```

Identifies the repair sequence based on the maximum quantity of resource flow handled.

class infrarisk.src.recovery_strategies.JointStrategy

Bases: object

Optimized strategy. Capture interdependencies somehow if exist. Not an immediate priority

class infrarisk.src.recovery_strategies.ZoneBasedStrategy(integrated_network, zones_shp)

Bases: object

Based on the zone in which the components are located.

get_repair_order()

Returns the repair sequence based on the distance from the initial crew location.

Returns A list of component names in the order of repair action.

Return type list

set_repair_order()

Identifies the repair sequence based on the zone of the component.

7.6 infrarisk.src.repair crews module

Repair crew classes

```
\textbf{class} \  \, \textbf{infrarisk.src.repair\_crews.PowerRepairCrew} \\ (\textit{name=None}, \textit{init\_loc=None}, \textit{crew\_size=None}) \\
```

Bases: object

Power network repair crew class

get_crew_loc()

Returns the current location of the crew (transport junction).

Returns Name of the current location of the crew

Return type string

get_next_trip_start()

Returns the next trip start time for the crew in seconds.

Parameters time (integer) – Start time of the next trip start

reset_locs()

Resets the current location of the crew.

set_crew_loc(loc)

Sets the current location of the crew (transport junction name).

Parameters loc (string) – Name of the current location of the crew

set_next_trip_start(time)

Sets the next trip start time for the crew in seconds.

Parameters time (integer) – Start time of the next trip start

class infrarisk.src.repair_crews.TranspoRepairCrew(name=None, init_loc=None, crew_size=None)

Bases: object

Traffic network repair crew class

get_crew_loc()

Returns the current location of the crew (transport node name).

Returns Name of the current location of the crew

Return type string

get_next_trip_start()

Returns the next trip start time for the crew in seconds.

Parameters time (*integer*) – Start time of the next trip start

reset locs()

Resets the current location of the crew.

set_crew_loc(loc)

Sets the current location of the crew (transport node name).

Parameters loc (*string*) – Name of the current location of the crew

set_next_trip_start(time)

Sets the next trip start time for the crew in seconds.

Parameters time (integer) – Start time of the next trip start

Water network repair crew class

get_crew_loc()

Returns the current location of the crew (transport junction name).

Returns Name of the current location of the crew

Return type string

get_next_trip_start()

Returns the next trip start time for the crew in seconds.

Parameters time (integer) – Start time of the next trip start

reset_locs()

Resets the current location of the crew.

set_crew_loc(loc)

Sets the current location of the crew (transport junction name).

Parameters loc (*string*) – Name of the current location of the crew

set_next_trip_start(time)

Sets the next trip start time for the crew.

Parameters time (integer) – Start time of the next trip start in seconds

7.7 infrarisk.src.resilience_metrics module

Resilience metric classes to be used for optimizing recovery actions.

class infrarisk.src.resilience_metrics.WeightedResilienceMetric Bases: object

A class that consists of methods to calculate and store weighted ILOS estimates without

calculate_node_details(network_recovery, wn_results)

Calculates the node head, deamand and pressure and stores them to respective tables.

Parameters

- network_recovery(infrarisk.src.network_recovery.NetworkRecovery) The
 network recovery object
- wn_results (dictionary) The water network simulation results for the current time interval

calculate_power_load(network_recovery, sim_time)

Calculates the power flow in loads and motor pumps.

Parameters

- **network_recovery** (infrarisk.src.network_recovery.NetworkRecovery) The network recovery object.
- **sim_time** (*integer*) The simulation time when the data is collected in seconds.

calculate_power_resmetric(network_recovery)

Calculates the power network performance timelines (pcs and ecs).

Parameters network_recovery

(infrarisk.src.network_recovery.

NetworkRecovery) - The network recovery object

calculate_pump_energy(wn_object)

Calculates the energy consumed by each pump in kWhr in the network and stores the values in a dictionary.

Parameters wn_object (wntr.network.WaterNetworkModel) - The water network model.

calculate_pump_flow(network_recovery, wn_results)

Calculates the flowrates in pumps and stores the values to a table.

Parameters

- **network_recovery**(infrarisk.src.network_recovery.NetworkRecovery)—The network recovery object.
- wn_results (dictionary) The water network simulation results for the current time interval

calculate_pump_status(network_recovery, wn_results)

Calculates the status of pumps and stores the values to a table.

Parameters

- network_recovery(infrarisk.src.network_recovery.NetworkRecovery) The
 network recovery object.
- wn_results (*dictionary*) The water network simulation results for the current time interval.

calculate_transpo_resmetric(tn)

calculate_water_lost(network_recovery, wn_results)

Calculates the flows through pipe leaks and stores it to a table.

Parameters

- network_recovery (infrarisk.src.network_recovery.NetworkRecovery) The network recovery object
- wn_results (dictionary) The water network simulation results for the current time interval

calculate_water_resmetrics(network recovery)

Calculates the water network performance timelines (pcs and ecs).

Parameters network_recovery

(infrarisk.src.network_recovery.

NetworkRecovery) – The network recovery object

get_weighted_auc_metrics()

Returns the weighted auc metrics.

Returns list of acs and pcs weighted auc values

Return type list

integrate(x, y)

Calculates the area under a curve

Parameters

- x (array of floats) An array of the x values of the curve
- y An array of the y values of the curve

:type y:array of floats :return: The area under the curve :rtype: float

set_weighted_auc_metrics()

Calculates the water, power, and weighted auc values.

7.8 infrarisk.src.simulation module

Functions to implement the various steps of the interdependent infrastructure network simulations.

class infrarisk.src.simulation.NetworkSimulation(network_recovery)

Bases: object

A class to perform simulation of interdependent effects.

expand_event_table()

Expands the event table with additional time_stamps for simulation.

get_components_repaired()

Returns the list of components that are already repaired.

Returns list of components which are already repaired.

Return type list

get_components_to_repair()

Returns the remaining components to be repaired.

Returns The list of components

Return type list

get_sim_times(network_recovery)

Returns the unique simulation times scheduled by the event table.

Parameters network_recovery

(infrarisk.src.network_recovery.

NetworkRecovery) – A integrated infrastructure network recovery object.

Returns Unique simulation time stamps

Return type list

simulate_interdependent_effects(network recovery original)

Simulates the interdependent effect based on the initial disruptions and subsequent repair actions.

Parameters network_recovery_original (infrarisk.src.network_recovery. NetworkRecovery) – A integrated infrastructure network recovery object.

Returns lists of time stamps and resilience values of power and water supply.

Return type infrarisk.src.resilience_metrics.WeightedResilienceMetric

update_repaired_components(component)

Update the lists of repaired and to be repaired components.

Parameters component (*string*) – The name of the component that was recently repaired.

write_results(file_dir, resilience_metrics)

Writes the results to csv files.

Parameters

- **file_dir** (*string*) The directory in which the simulation contents are to be saved.
- resilience_metrics (infrarisk.src.resilience_metrics. WeightedResilienceMetric) The object in which simulation related data are stored.

7.9 Module contents

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SEC DISCLAIMER

This research is carried out by Singapore ETH Centre through its Future Resilient Systems module funded by the National Research Foundation (NRF) Singapore. It is subject to Agency's review and hence is for internal use only. Not the contents necessarily reflect the views of the Agency. Mention of trade names, products, or services does not convey official NRF approval, endorsement, or recommendation.

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