

¹ pyMassEvac: A Python package for simulating multi-domain mass evacuation scenarios

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DOI: [10.xxxxxx/draft](https://doi.org/10.xxxxxx/draft)

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Submitted: 01 January 1970

Published: unpublished

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⁵ Summary

⁶ pyMassEvac is a Python package whose aim is to study mass evacuation scenarios. In particular, it is designed to simulate single- and multi-domain mass evacuation operations in which:

- the individuals to be evacuated are at a remote location, such as in the Arctic, where access to immediate medical care is limited or non-existent;
- each individual's medical condition may change over time, perhaps due to environmental conditions, injury, or care being provided; and
- the individuals must be transported from the evacuation site to a Forward Operating Location (FOL).

An example of a multi-domain mass evacuation operation, where the objective is to maximize the number of lives saved by transporting them to the FOL, that may be modelled using pyMassEvac is described in Rempel (2024) and is depicted in Figure 1.

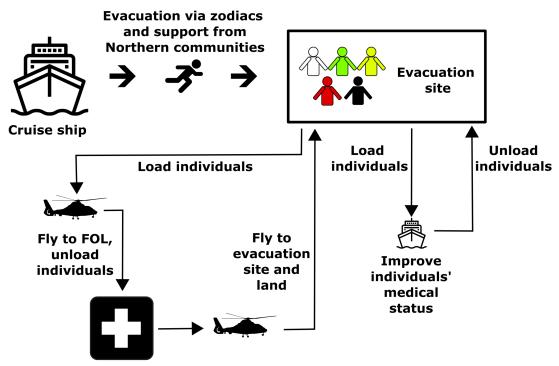
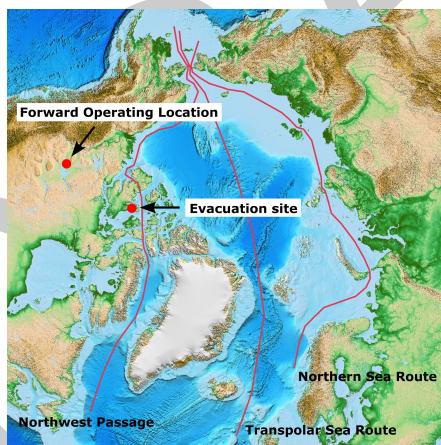


Figure 1: Evacuation plan via air with medical assistance provided at the evacuation site via ship. Colours of individuals at the evacuation site represent those in different triage categories.

¹⁷ Within this context, pyMassEvac may be used to provide decision support to defence and ¹⁸ security planners in two ways. First, through exploring the impact of the policies to make the ¹⁹ three decisions depicted in Figure 1 (see right panel):

- **Decision policy 1:** the policy that determines which individuals are loaded onto a vehicle, such as a helicopter, for transport to the FOL;
- **Decision policy 2:** the policy that determines which individuals receive medical care (if available) at the evacuation site, such as onboard a nearby ship; and

24 ▪ **Decision policy 3:** the policy that determines which individuals are removed from the
25 group receiving medical care, for reasons such as limited capacity or that the individuals'
26 medical condition has been sufficiently improved, and returned to the group ready to be
27 transported to the FOL.

28 Second, assuming decision policies are selected, decision support may be provided by using
29 pyMassEvac to explore their robustness to the uncertainty in a scenario's parameters. For
30 example, pyMassEvac may be used to explore how robust a set of decision policies is in terms
31 of the number of lives saved with respect to:

- 32 ▪ the arrival time of the initial transport vehicle after the individuals have arrived at the
33 evacuation site;
34 ▪ the distance, and thus travel time, between the evacuation site and the FOL; and
35 ▪ the rate at which an individual's medical condition becomes better (through receiving
36 medical care) or worse (due to injury or exposure to environmental conditions) over time.

37 In addition to uncertainty, changes in such parameters from baseline values may reflect a
38 variety of real-world decisions beyond the scenario itself, such as:

- 39 ▪ the reduction in the arrival time of the initial transport vehicle may reflect the pre-
40 positioning of vehicles during the summer season;
41 ▪ the reduction in the distance between the evacuation site and FOL may reflect the
42 building a new aerodrome; and
43 ▪ the decrease in the rate at which an individual's medical condition worsens may reflect
44 the use of improved medical kit.

45 Thus, pyMassEvac is designed to be primarily used by operational researchers who study
46 humanitarian or defence and security operations.

47 pyMassEvac is accessible at <https://github.com/mrrempel/pyMassEvac> and is installed via
48 a setup.py script. In addition, published evacuation scenarios that have studied using this
49 package (or its earlier developmental versions) are described in Rempel et al. (2021), Rempel
50 (2023), and Rempel (2024).

51 Statement of need

52 The significant decrease in Arctic sea ice in recent decades has resulted in increased activity
53 in the Arctic across a range of sectors, such as oil and gas, mining, fishing, and tourism. As
54 the ability to navigate the Arctic's primary sea routes—the Northwest passage, Northern Sea
55 Route, and Transpolar Sea Route (see the left panel of ??)—becomes more commonplace,
56 their use for both trade and the transport of individuals will follow. In regard to the transport
57 of individuals, for example via cruise ships, Arctic nations are concerned with both the potential
58 increase in the number of Search and Rescue (SAR) incidents that may occur, and the increased
59 size of those incidents in terms of the number of individuals in need of evacuation. This is
60 evidenced by recent exercises that have been conducted, such as the SARex series in Norway
61 Solberg et al. (2016); Solberg et al. (2018), a table-top exercise including the United States,
62 Canada, and the cruise ship industry McNutt (2016), and NANOOK-TATIGIT 21 by the
63 Canadian Armed Forces National Defence (2021).

- 64 ▪ “mass evacuation” “software” - review what MassEvac can do and how does it not fit
65 this need?
66 ▪ reference Camur (2021)

67 While software exists to support planning for and executing evacuation operations, this software
68 either requires a paid license, does not enable a researcher to study the impact of different
69 decision policies, or ...

70 With this in mind, pyMassEvac aims to enable researchers to study the ...

71 Features

72 Mass evacuation operations are modelled in pyMassEvac as a sequential decision problem under
 73 uncertainty using Powell's universal framework for sequential decisions Powell (2022). Given
 74 this framework, a scenario's parameters are specified via the initial state variable S_0 .

- 75 ■ m^e : Vector of mean time (hours) for an individual to transition from a triage category
 76 $t \in \mathcal{T}$ to the next triage category $t' \in \mathcal{T}$ at the evacuation site, i.e., m_w^e is the mean
 77 transition time from the white to green tag category. The set of triage categories is
 78 given as $\mathcal{T} = w, g, y, r, b$.
- 79 ■ m^s : Vector of mean time (hours) for an individual to transition from a triage category
 80 $t \in \mathcal{T}_w$ to the next triage category $t' \in \mathcal{T}_r$ while receiving medical care, i.e., m_r^s is
 81 the mean transition time from the red to yellow tag category.
- 82 ■ c^h : Total capacity for individuals onboard a helicopter.
- 83 ■ c_s : Total capacity for individuals to receive medical care.
- 84 ■ δ^h : Vector of capacity consumed by each triage category $t \in \mathcal{T}$ onboard a helicopter.
- 85 ■ δ^s : Vector of capacity consumed by each triage category $t \in \mathcal{T}$ when receiving medical
 86 care.
- 87 ■ η^h : Total time for a helicopter to load individuals at the evacuation site, transport them
 88 to the FOL, unload the individuals, and return to the evacuation site.
- 89 ■ η^{sl} : Total time to transfer individuals at the evacuation site to the local facility (such as
 90 a ship) in which they will receive medical care, plus the time until a decision is made as
 91 to which individuals to transfer back to the evacuation site.
- 92 ■ η^{su} : Total time to transfer individuals from the local facility (such as a ship) in which
 93 they are receiving medical care to the evacuation site, plus the time until a decision is
 94 made as to which individuals to transport to the FOL.
- 95 ■ τ^h : Arrival time of the initial transport vehicle after the individuals have arrived at the
 96 evacuation site.
- 97 ■ τ^s : Arrival time of the medical care facility (such as a ship) after the individuals have
 98 arrived at the evacuation site.

99 Limitations

100 Citations

101 Citations to entries in paper.bib should be in [rMarkdown](#) format.

102 If you want to cite a software repository URL (e.g. something on GitHub without a preferred
 103 citation) then you can do it with the example BibTeX entry below for (?).

104 For a quick reference, the following citation commands can be used: - @author:2001 ->
 105 "Author et al. (2001)" - [@author:2001] -> "(Author et al., 2001)" - [@author1:2001;
 106 @author2:2001] -> "(Author1 et al., 2001; Author2 et al., 2002)"

107 Acknowledgements

108 I acknowledge contributions from Nicholi Shiell and Kaeden Tessier who are co-authors on
 109 related papers. These collaborations inspired the development of this package.

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