

*DLR-IRIDES-UN-SPIDER Joint Workshop on
Remote Sensing and Multi-Risk Modeling for
Disaster Management*



**GEOSPATIAL SIMULATION OF
TSUNAMI EVACUATION USING GIS
DATA AND AGENT BASED MODELING**

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Problem

- Population exposed to tsunami
- Need of tools to conduct and evaluate tsunami evacuation plans
- Evacuation drill? - Good for training, but not for experimentation. (i.e. threat of injury, lack of realism)

TUNAMI-N2 (Shallow water equations)



Background and Objective

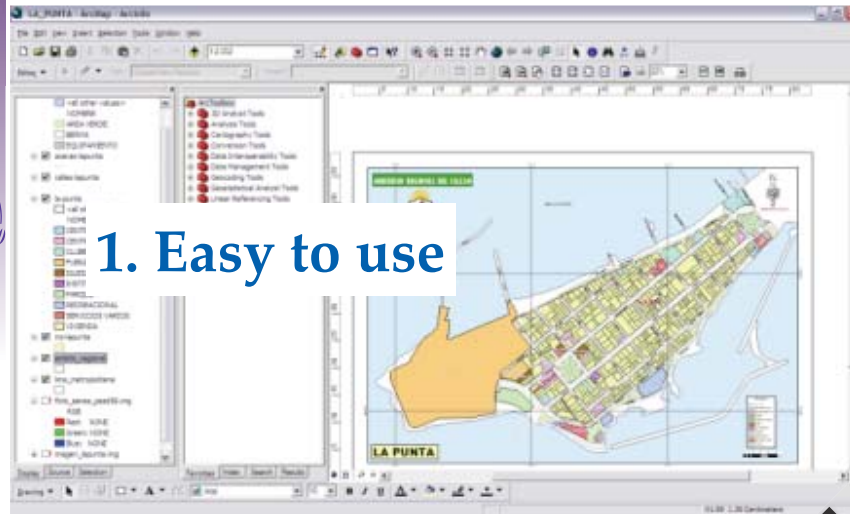
- **Hazard** - Tsunami Simulation
- **Vulnerability** - Exposure, Preparation, Behavior, etc
- **Risk** - Human losses
- **Risk Reduction measures**

Japan tsunami 2011

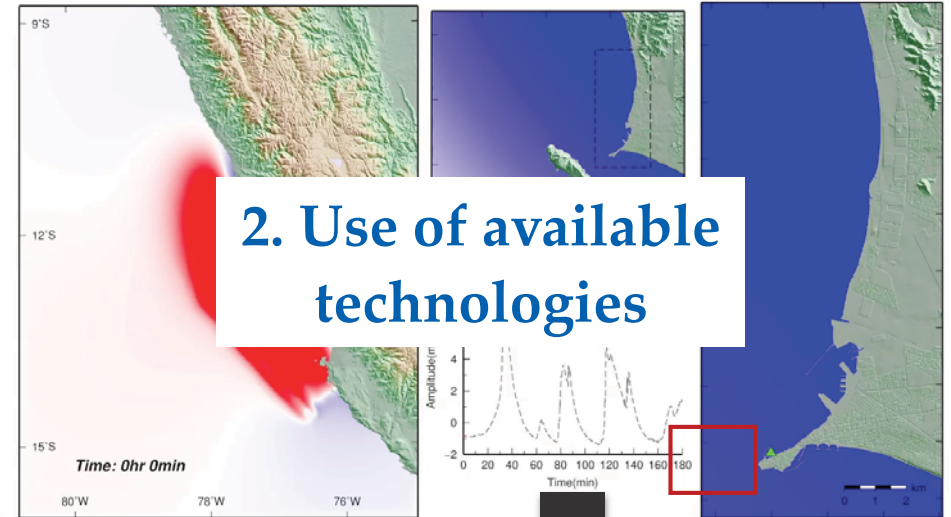
Arahama-Sendai, Miyagi, Japan

APPROACH

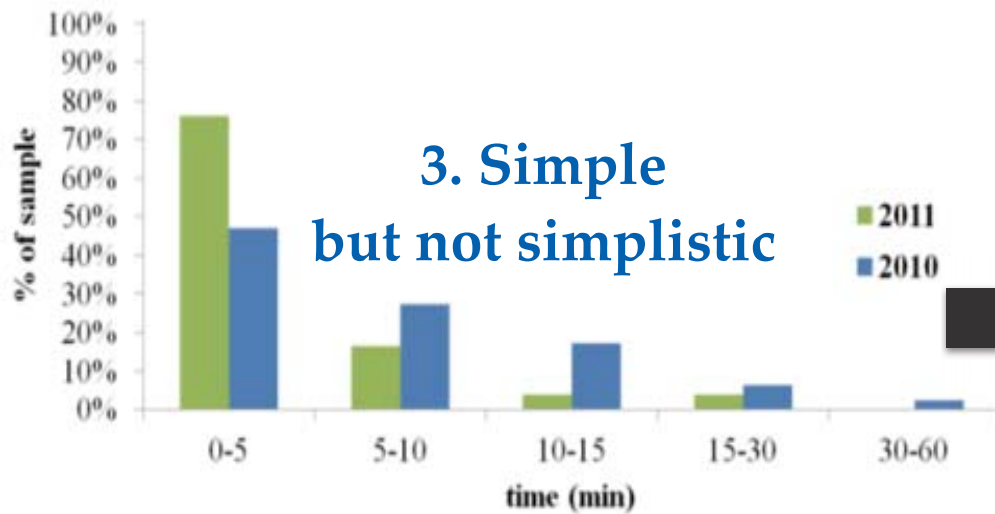
Tsunami numerical simulation results



GIS data



Preparation times - La Punta

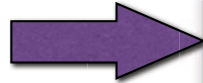


Questionnaire survey data





Tsunami
Departure
Curves

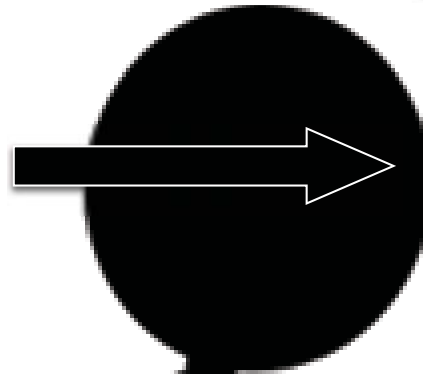


Evacuation
decision (time)



AGENT RULES

Based on surveyed
preferences



Shelter decision



A* algorithm for
pathfinding



Path finding
behavior



Density recognition
within FOV



Traffic and
congestion
recognition



Density
in FOV

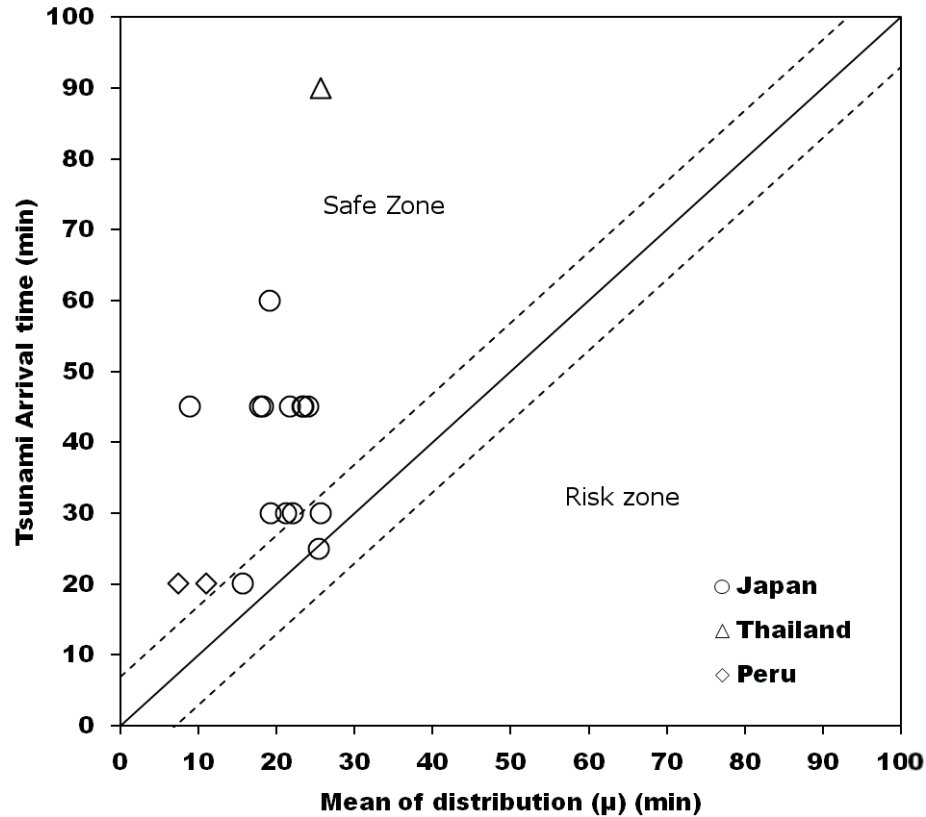


Speed variation

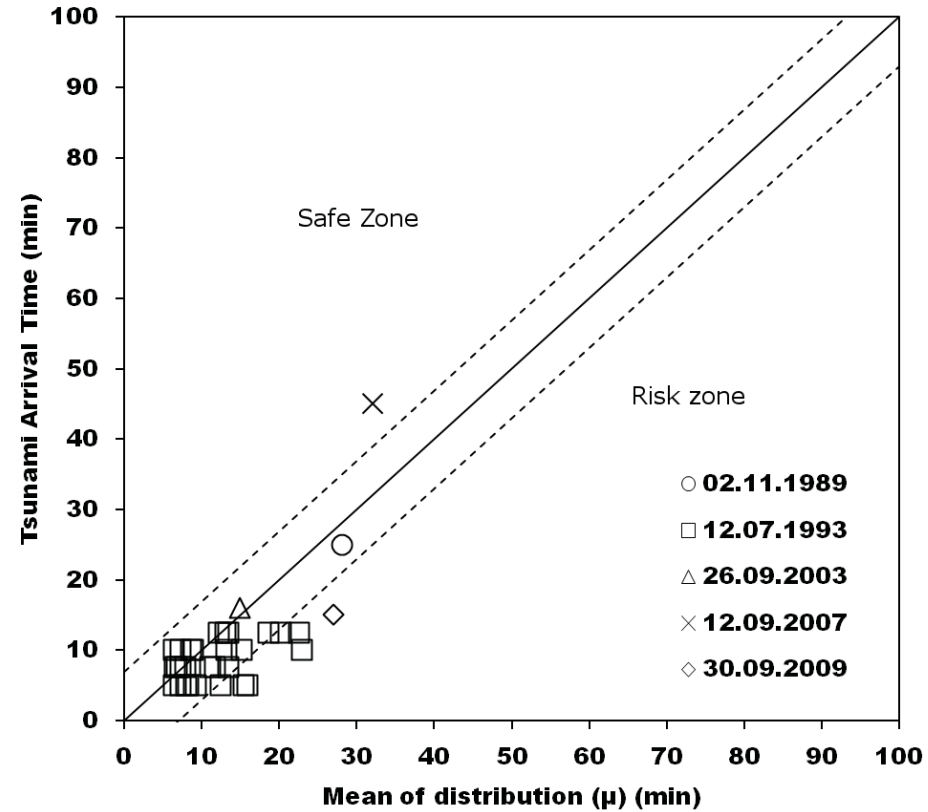


From pre and post tsunami evacuation behavior surveys

Stated Preference surveys



Revealed Preference surveys



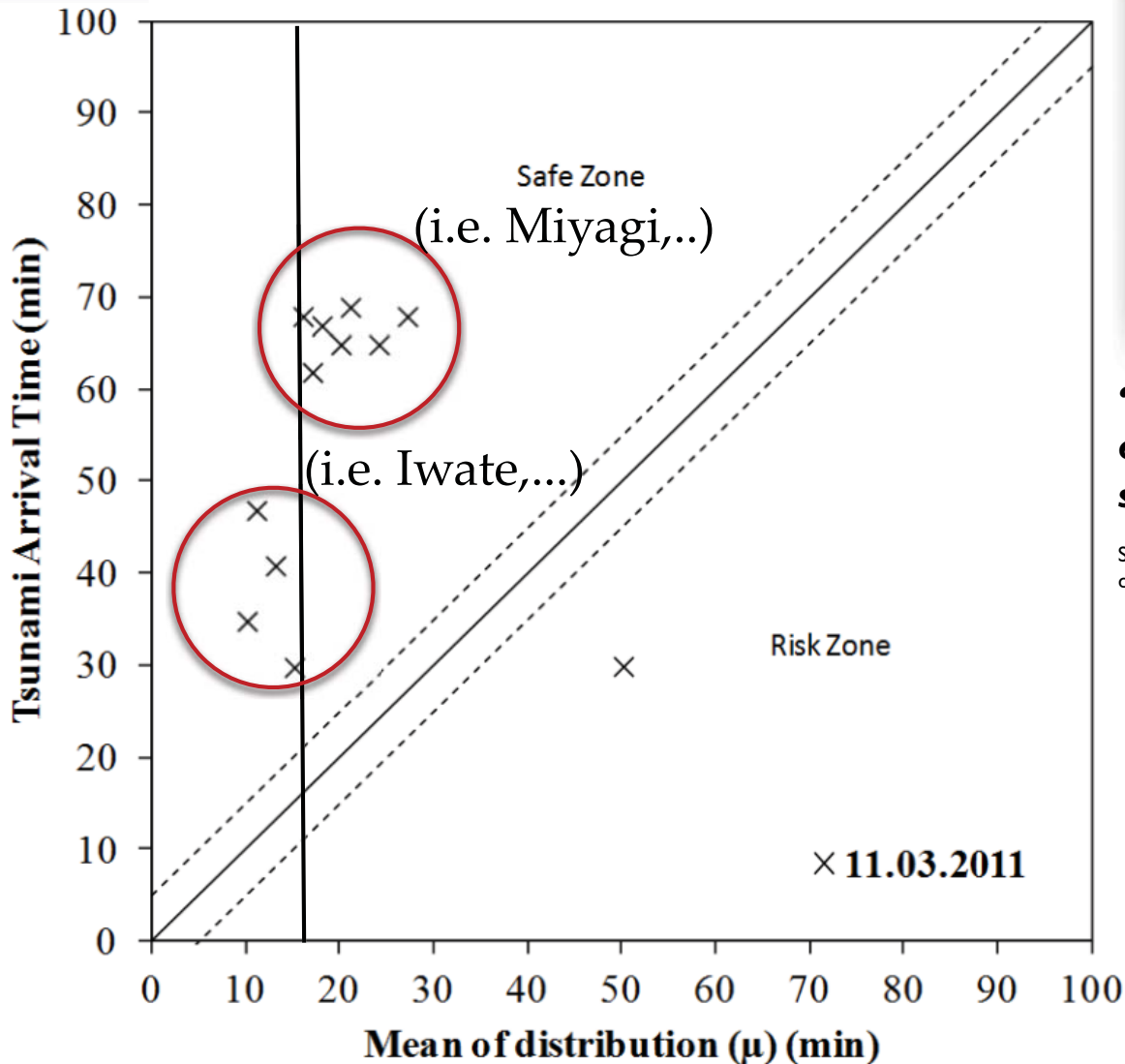
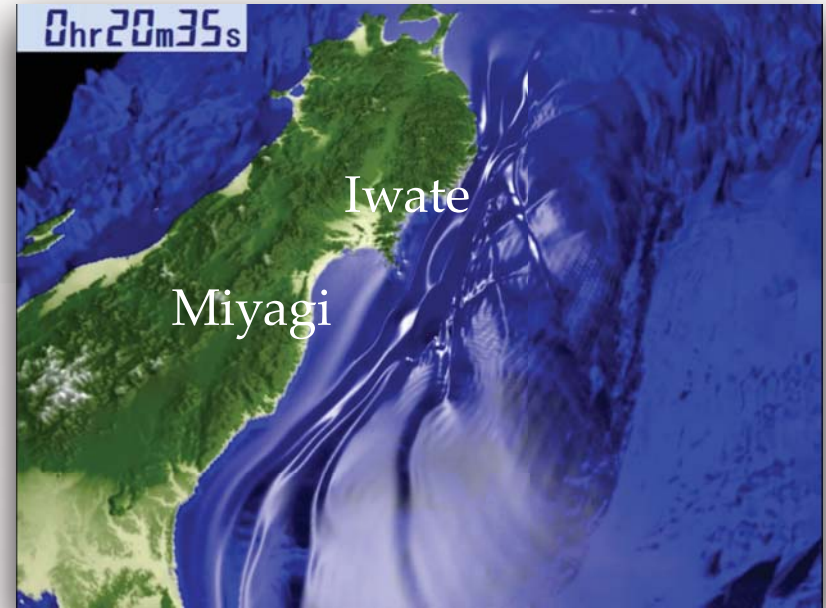
$$D(t) = 1 - e^{-\frac{\pi \cdot t^2}{4\mu^2}}$$

Based on a Rayleigh distribution

“People appear to adjust the rapidity of their evacuation behavior in accordance with the severity and timing of the impending threat.”

Sorensen, J. H. (1991). When Shall We Leave? Factors Affecting the Timing of Evacuation departures. *International Journal of Mass Emergencies and Disasters*, 9(2), 153-165.

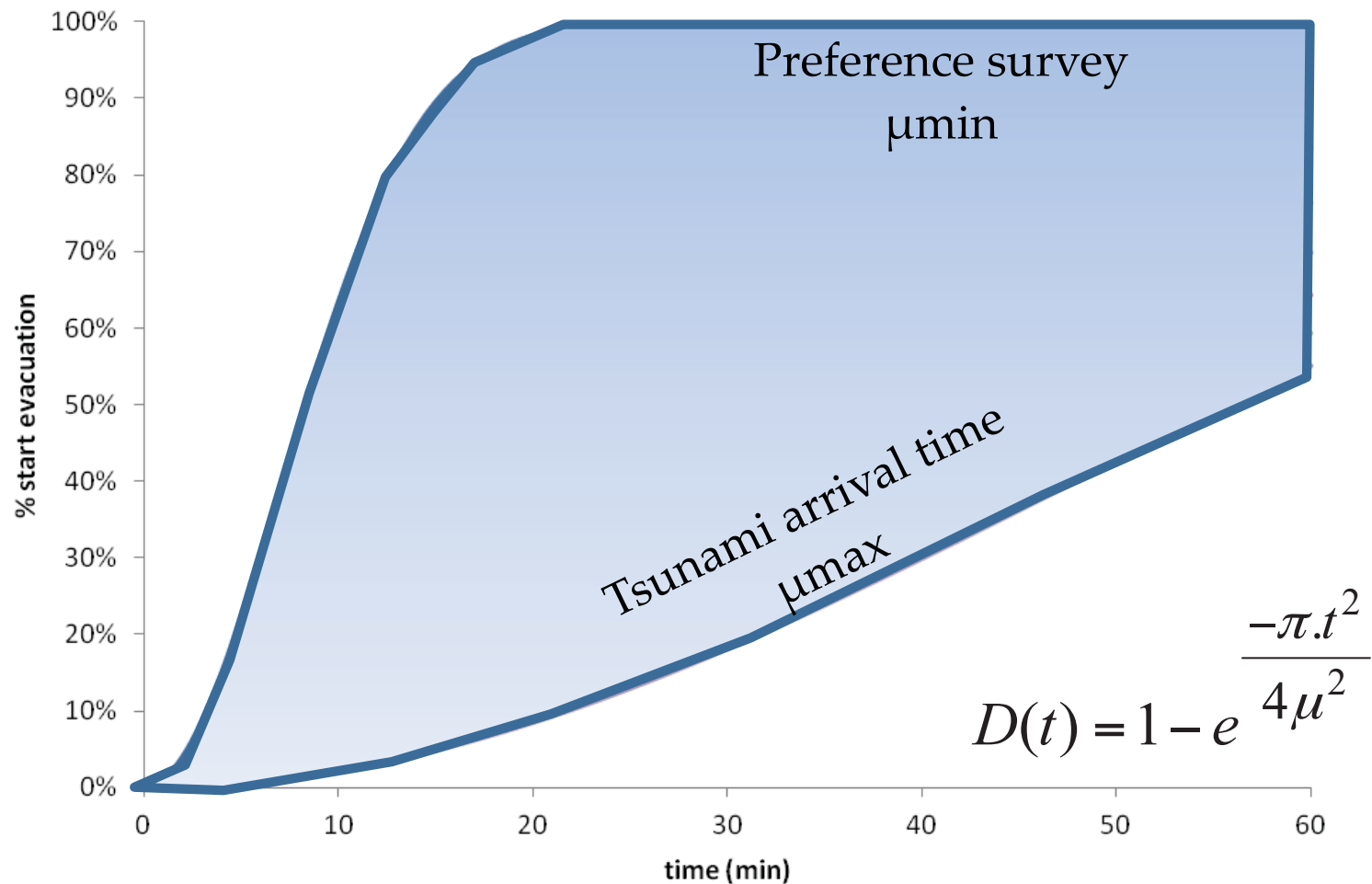
The Japan 2011 tsunami evacuation behavior confirms it



“People appear to adjust the rapidity of their evacuation behavior in accordance with the severity and timing of the impending threat.”

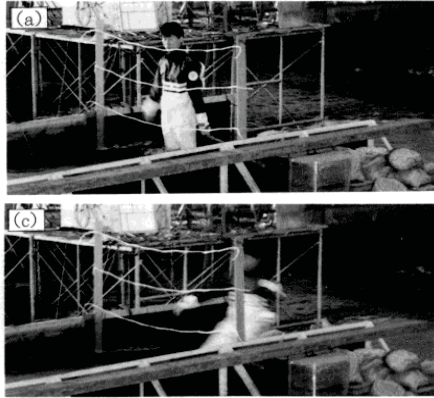
Sorensen, J. H. (1991). When Shall We Leave? Factors Affecting the Timing of Evacuation departures. *International Journal of Mass Emergencies and Disasters*, 9(2), 153-165.

Tsunami Departure Curves for evacuation start time

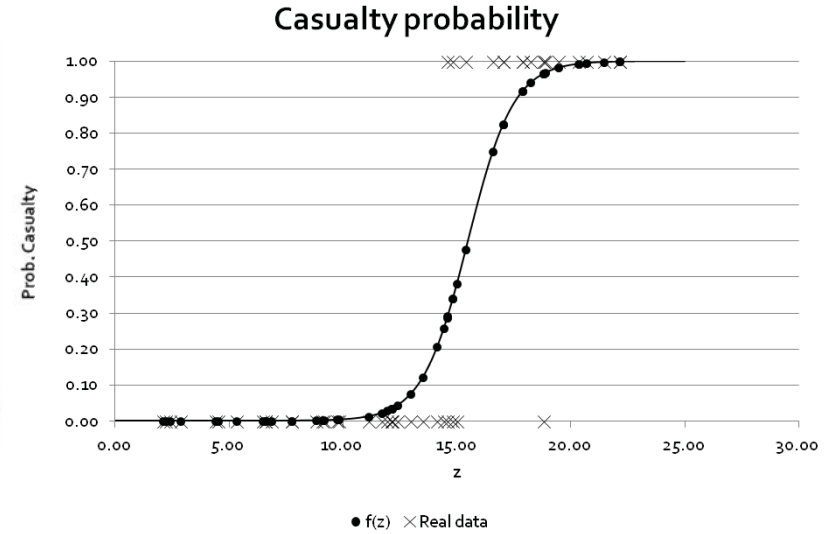
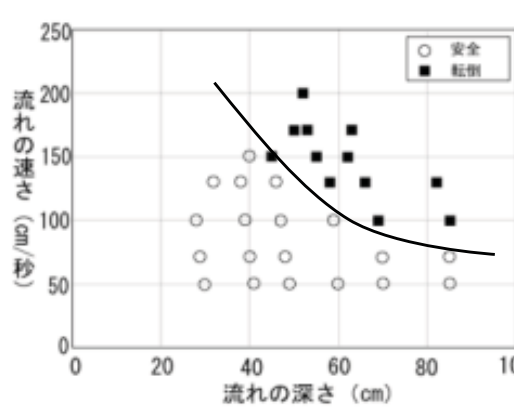


Stochastic simulation of several possible behaviors of departure curves bounded by Stated Preference surveys (μ_{min}) and the arrival time of the tsunami in the study area estimated by numerical simulation (μ_{max}).

Casualty estimation using tsunami features



Takahashi et al, 1992



$$f(z) = \frac{1}{1 + e^{(15.48 - z)}}$$

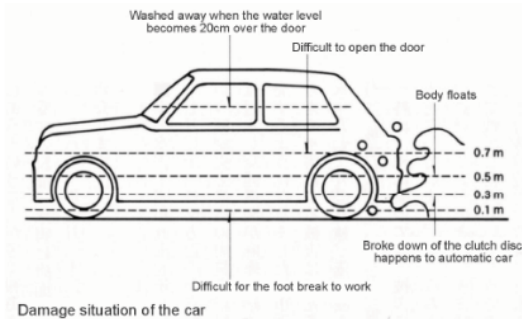
$$z = \beta_0 + \beta_1 * h + \beta_2 * u$$

$$\beta_0 = -12.37$$

$$\beta_1 = 22.036$$

$$\beta_2 = 11.517$$

Note: Equation is applicable for h [0.28,0.85] (m) & u [0.50,2.00] (m/s)
(Nagelkerke R² = 0.83)



Yasuda et al, 2004

Pedestrian
(h ≤ 0.85) f(z)
(h > 0.85) -> casualty

Car
(h > 0.50) -> casualty



TSUNAMI EVACUATION SIMULATOR



Interactive Environment for modeling

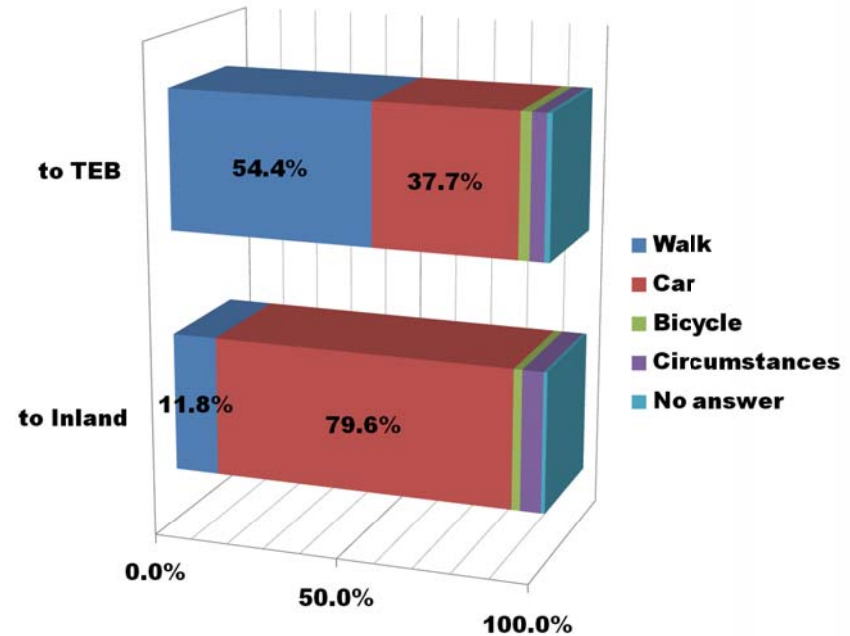
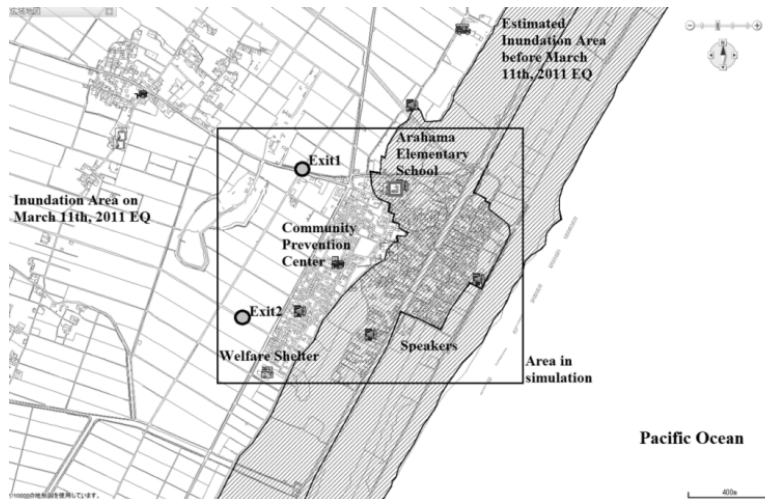
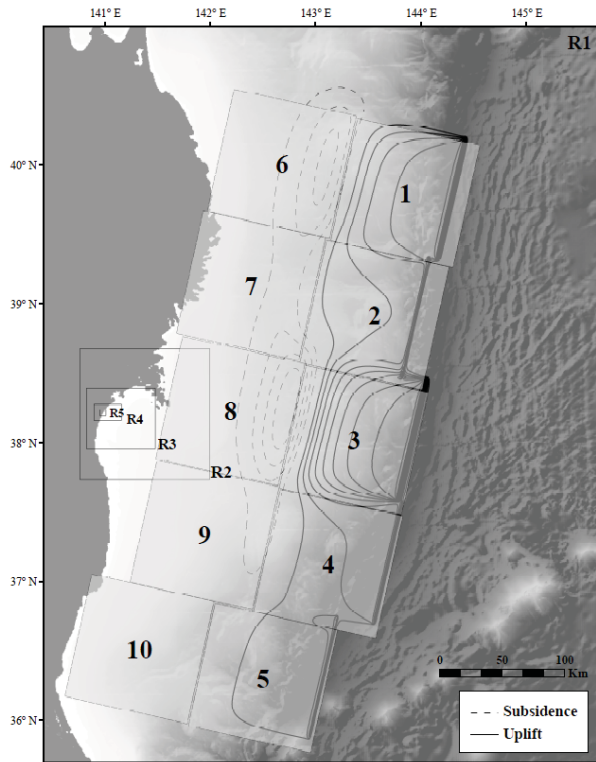


Case studies





1. Arahama, Japan



- **2011 Japan tsunami**
- **2,271 residents (peds. & cars)**
- **Objective: Verify bottleneck and casualties**



1. Arahama, Japan



- Casualties
- Casualties on “traffic”
- Crowd density condition fulfilled at any moment of the computation

Results

Case	Casualties	TEB	Inland
Model	406	498	1367
Real	283	520	1468

- **2011 Japan tsunami**
- **2,271 residents (peds. & cars)**
- **Objective: Verify bottleneck and casualties**

TEB: Tsunami Evacuation Building

Mas, E., Suppasri, A., Imamura, F., & Koshimura, S. (2012). Agent-based Simulation of the 2011 Great East Japan Earthquake / Tsunami Evacuation : An Integrated Model of Tsunami Inundation and Evacuation. *Journal of Natural Disaster Science*, 34(1), 41–57.

2. Yuriage, Natori, Japan



Population: 5,612
Casualties: 762



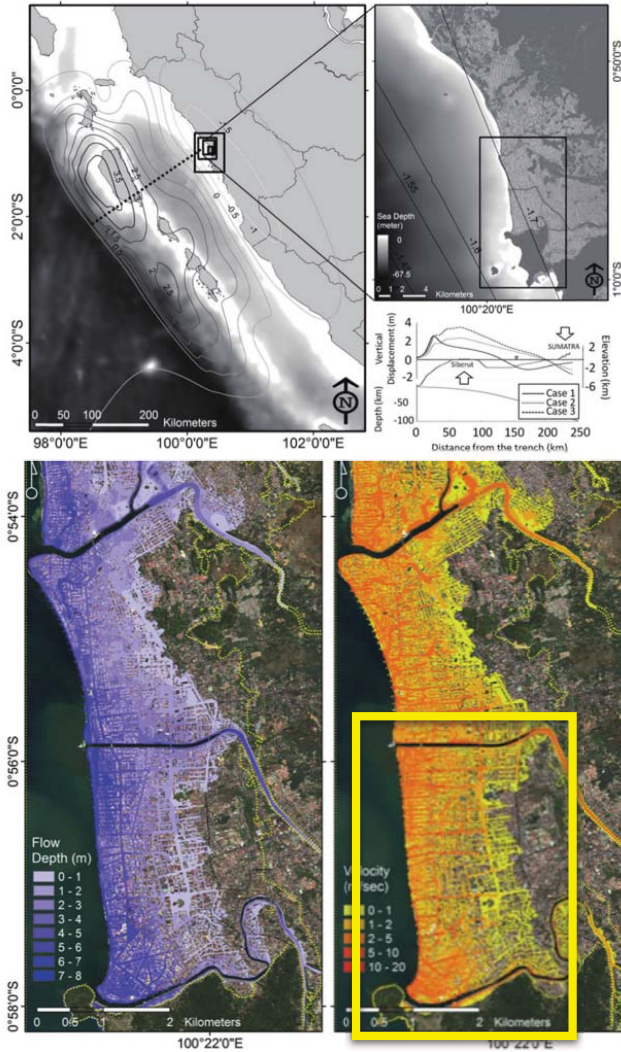
Case	Casualties	TEB1	TEB2	TEB3	Inland
Model	774	43	1050	699	1367
Real	762	~30	~1000	~870	1468

TEB: Tsunami Evacuation Building

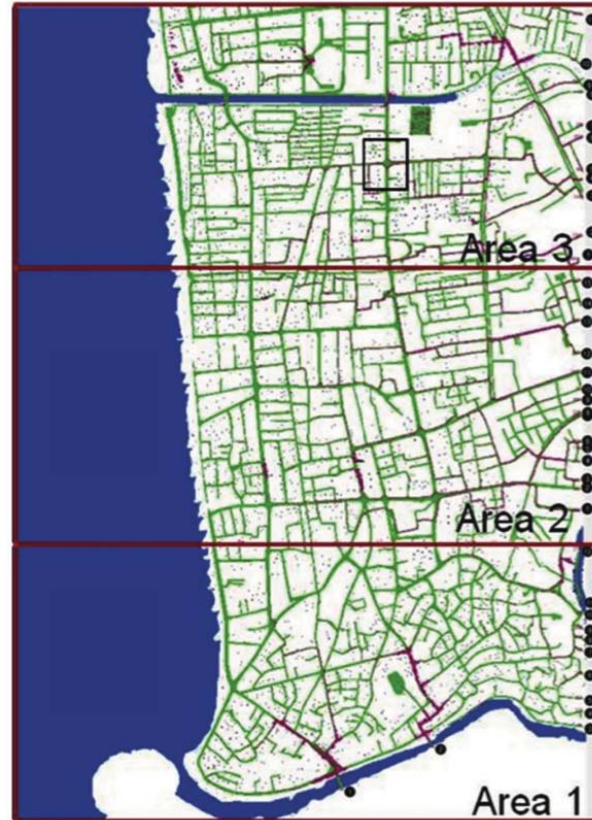
- **2011 Japan tsunami**
- **3,944 residents (peds. & cars)**
- **Objective: Verify bottleneck, casualties and double evacuation**



3. Padang, Indonesia

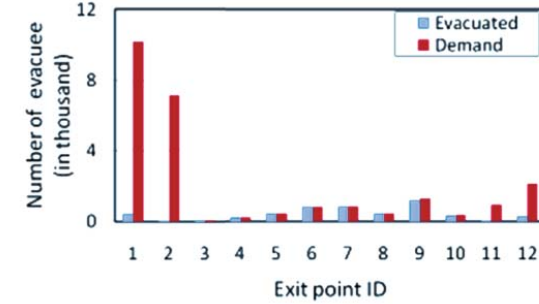


Model layout

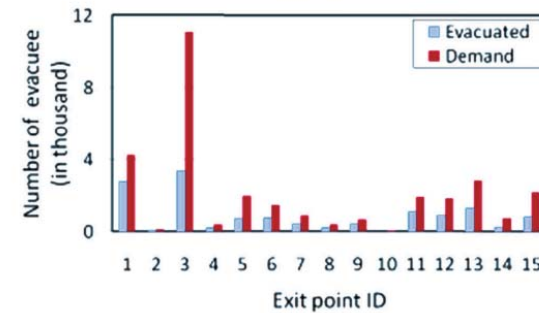


Results

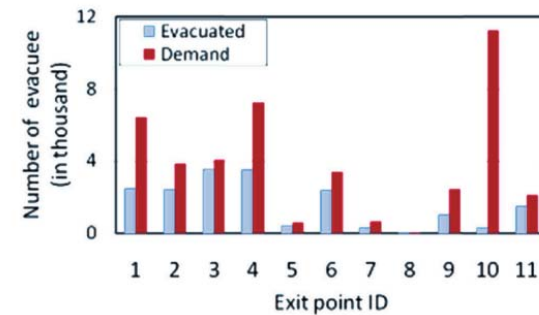
Area 1



Area 2



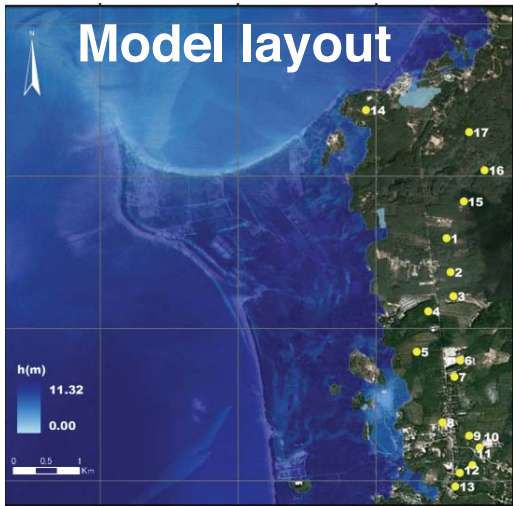
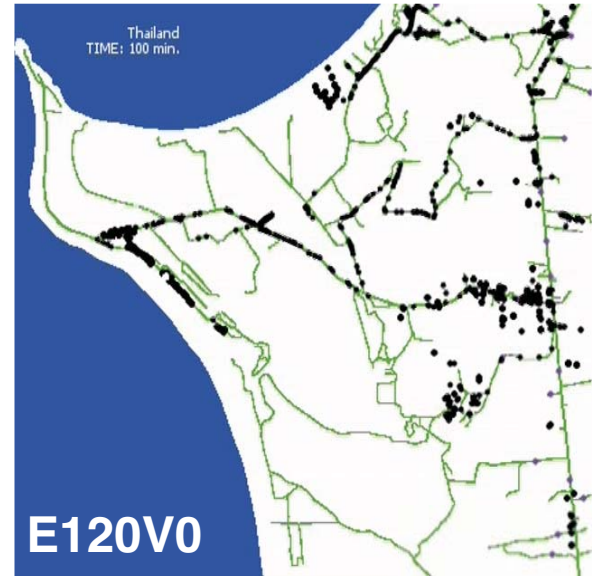
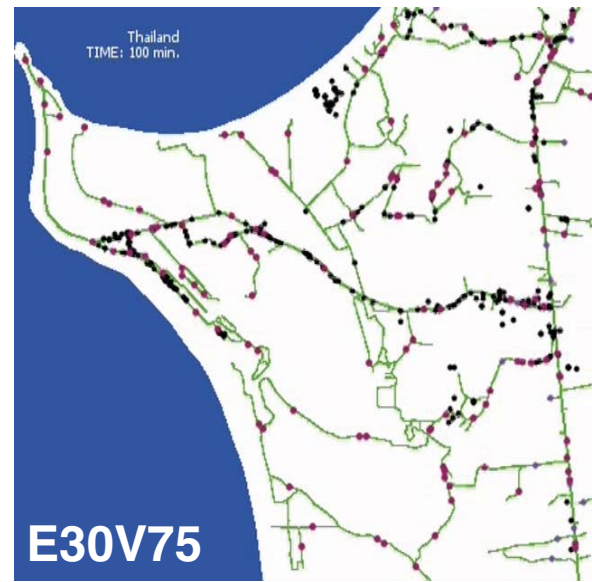
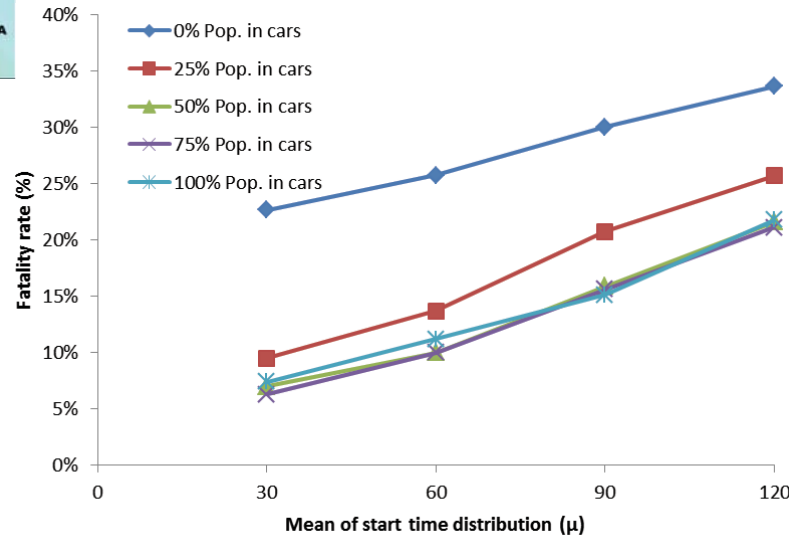
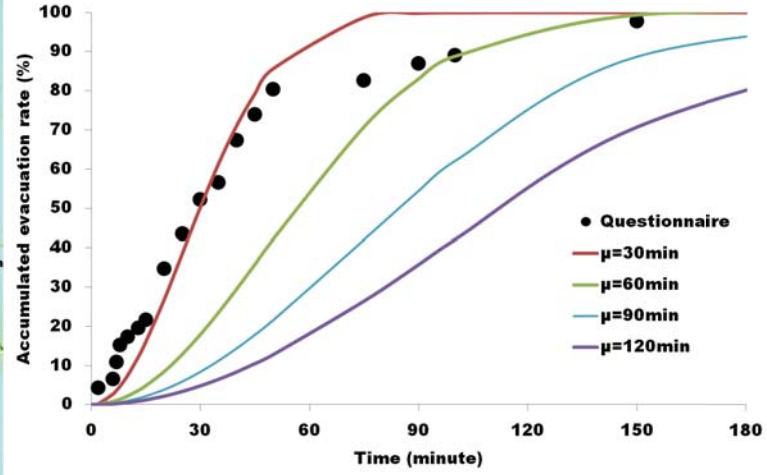
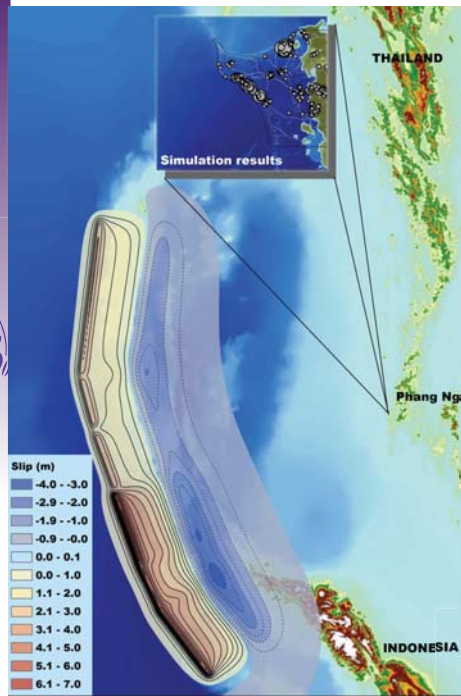
Area 3



- **Mega earthquake in Padang**
- **104,352 pedestrian agents**
- **Objective: Identify bottleneck areas, evaluate casualty estimation (62% pop.)**



4. Phang Nga, Thailand



● Vehicles

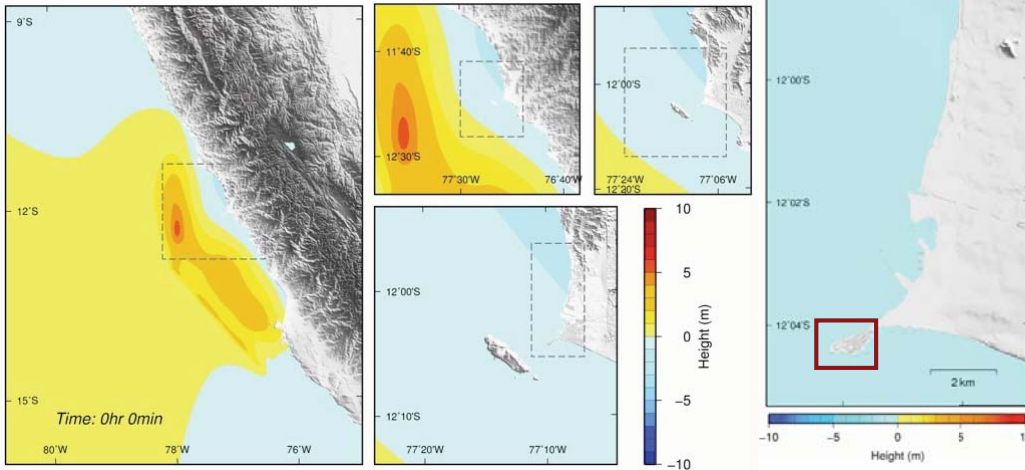
● Pedestrians

- 2004 Indian Ocean tsunami
- 2,649 residents (peds. & cars)
- Objective: Vehicle evacuation

Population in Vehicles	Start Time of Evacuation (min)			
	30	60	90	120
0%	E30V0	E60V0	E90V0	E120V0
25%	E30V25	E60V25	E90V25	E120V25
50%	E30V50	E60V50	E90V50	E120V50
75%	E30V75	E60V75	E90V75	E120V75
100%	E30V100	E60V100	E90V100	E120V100



5. La Punta, Peru



Total Shelter capacity: ~7,000



- **Future mega earthquake scenario**
- **4,370 residents (peds. & cars)**
- **Objective: Estimate shelter demand**

Population: 4,370 / Casualties: 271

Mas, E., Adriano, B., Koshimura, S., Imamura, F., Kuroiwa Horiuchi, J., Yamazaki, F., Zavala, C., Estrada, M. (2014). Identifying Evacuees Demand of Tsunami Shelters Using Agent Based Simulation. In Y. A. Kontar, V. Santiago-Fandino, & T. Takahashi (Eds.), Tsunami Events and Lessons Learned (pp. 347–358). Springer Netherlands. doi:10.1007/978-94-007-7269-4_19



5. La Punta, Peru

Vertical Evacuation

Casualties = 16



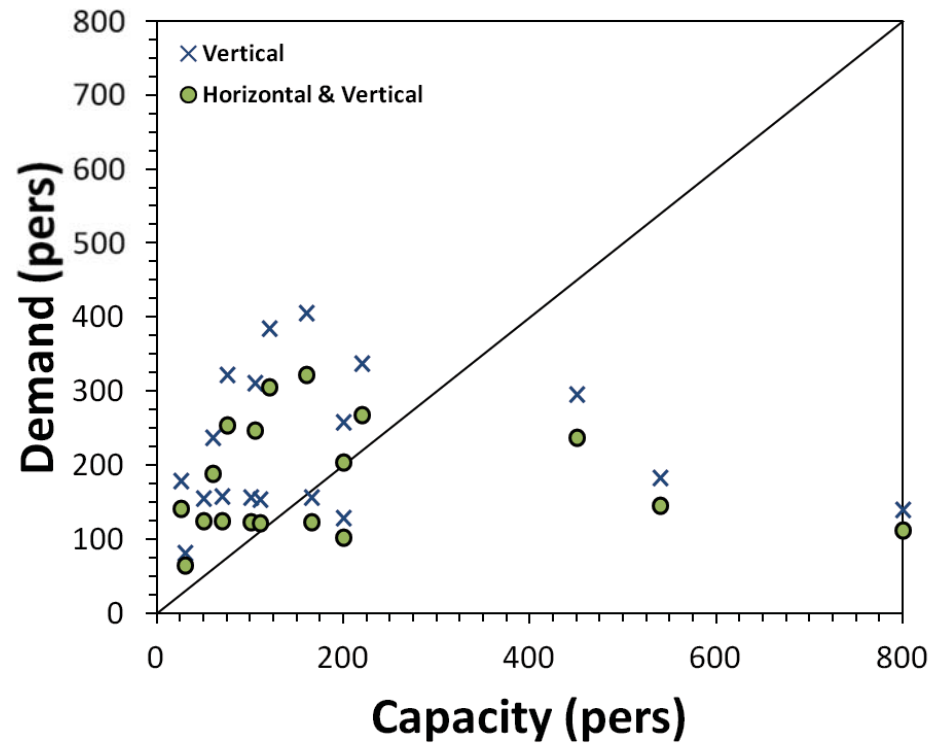
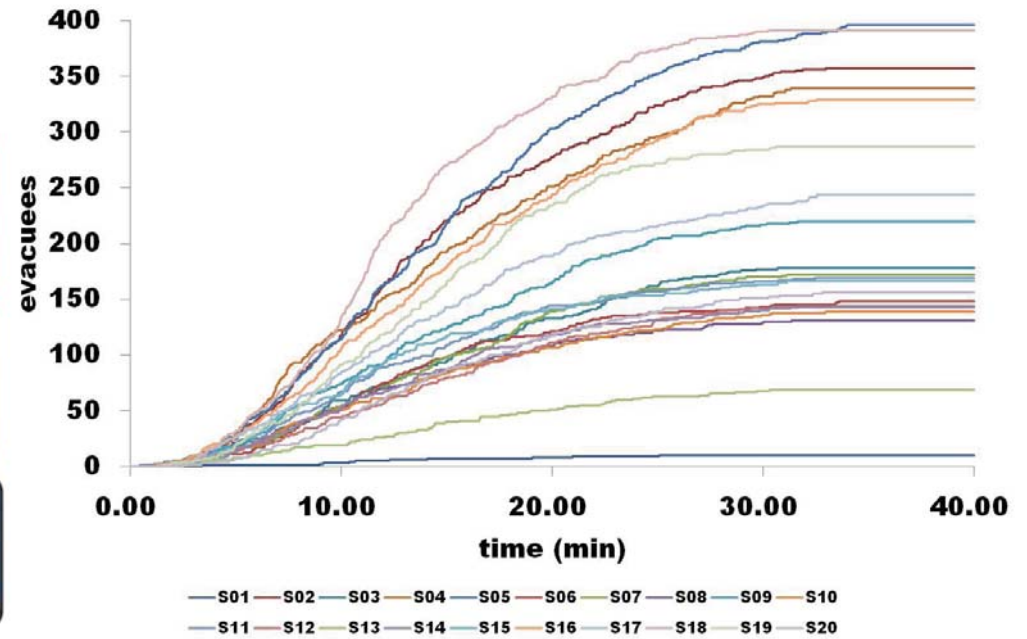
Horizontal and Vertical Evacuation

Casualties = 153



- **Vertical evacuation yields better results because no vehicles are involved for traffic congestion.**
- **Notice that here the use of vehicles is not convenient, different to the case shown in Thailand**

5. La Punta, Peru

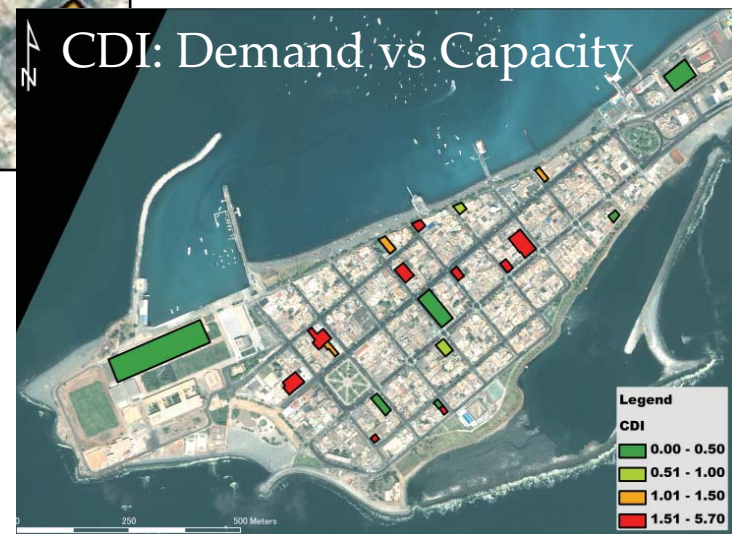
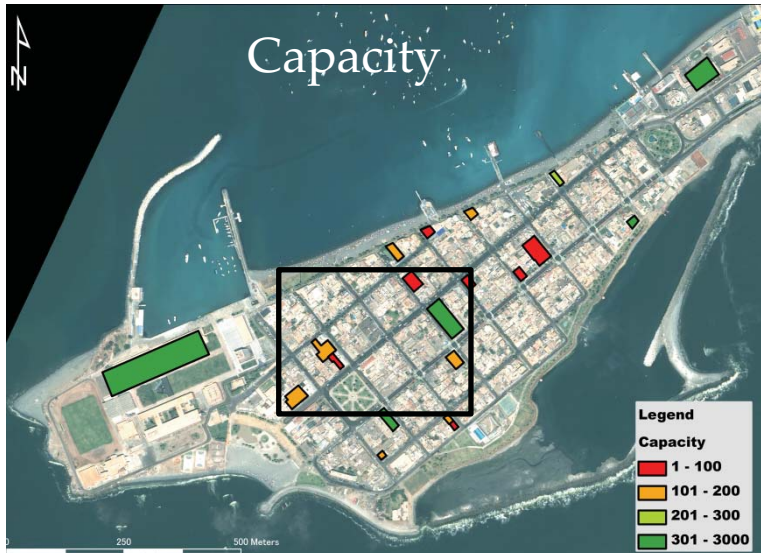
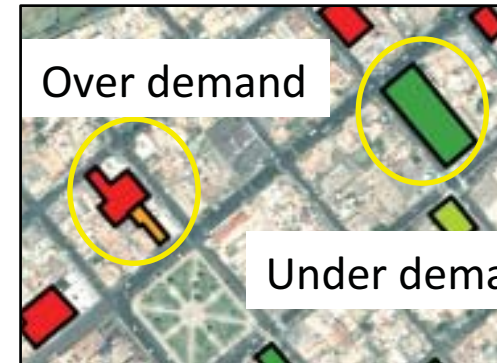
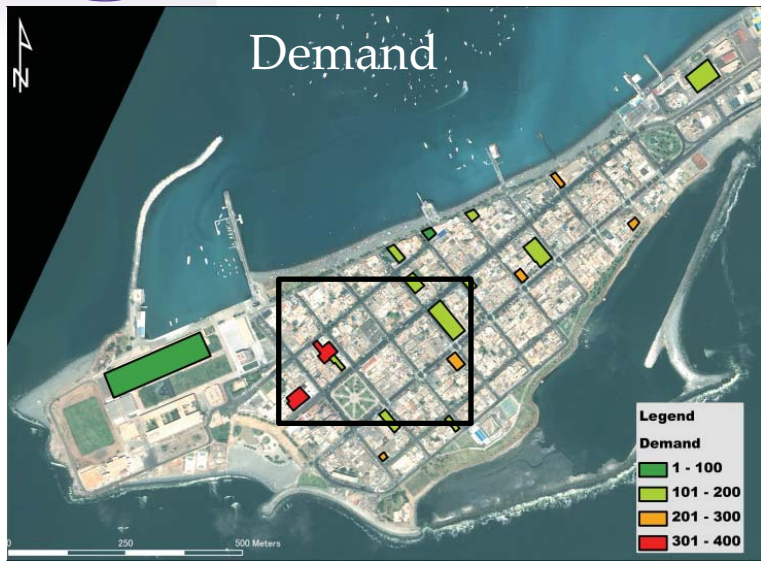


• **At least 13 out of 20 shelters can experience over demand in case of emergency evacuation**

5. La Punta, Peru

Another way is to spatially look at the results

RED: OVER DEMAND
GREEN: UNDER DEMAND



Capacity-Demand Index (CDI)

$$CDI = \frac{\text{Demand}}{\text{Capacity}}$$



Conclusions

- Complex environments can be simulated using simple and basic rules. (Agent based paradigm)
- Physical simulation, Social behavior and Geospatial information are put together in an easy to understand manner as a tool for tsunami evacuation planning.
- The model was built in NetLogo, an easy language to understand the core, limitations and even modify the model.
- Multiple applications can be tested by modifying the model to answer specific research questions.

**Thank you for your
attention**

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