

# Efficiency of Earthquake Early Warning Systems

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# Introduction

## Components of Early Warning System

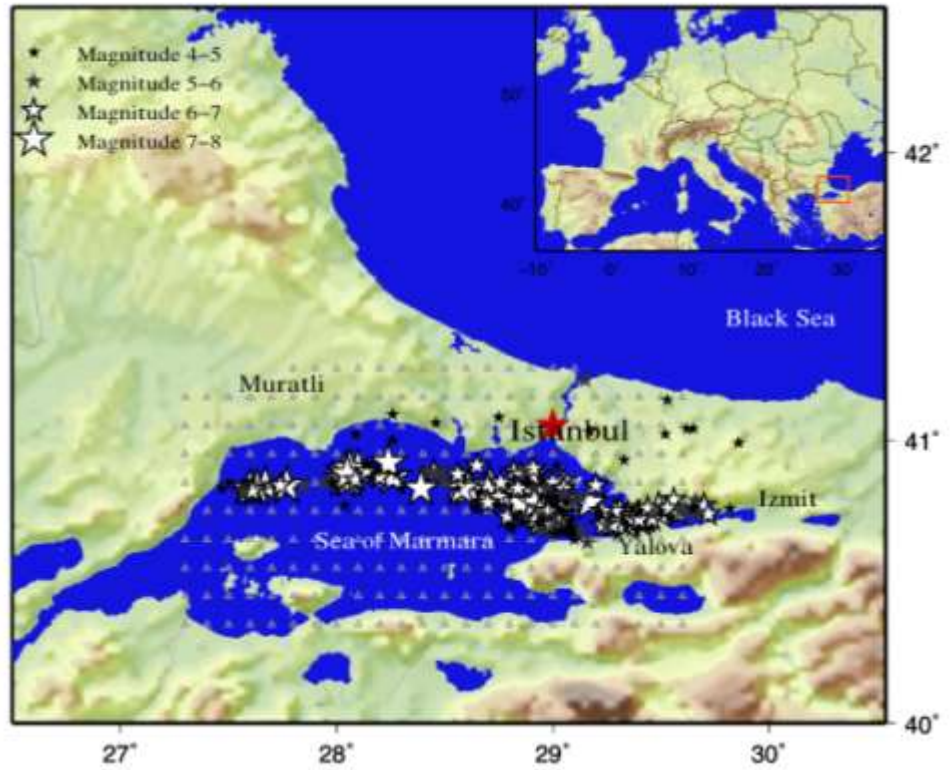
- User Information (Alarm)
- Seismological Network plus communication
- Methodology (Parameter)

Question:            Given a certain user requirement  
                              what is the best network configuration?  
                              what are the best parameters?

# Introduction

- The **simplest approach** to earthquake early warning (EEW) is **based on thresholds**: when the ground motion at a given number of stations of the network exceeds a given threshold, an alarm is declared
- Or, rephrased: What are
  - a) the optimal station locations,
  - b) the optimal thresholds,
  - c) the minimum necessary number of stations and, in our case, the benefit of a given number of ocean bottom stations?
- As an **example** to address these questions, we use the case of **Istanbul & the Sea of Marmara**

# Synthetic dataset



- Istanbul: seismic hazard determined by fault segments of North Anatolian fault below the Sea of Marmara
- 5 segments (Böse et al., 2008)
- Istanbul is the user site for EEW
- 180 earthquakes with  $4.5 \leq M \leq 7.5$  simulated with FINSIM (Beresnev & Atkinson, 1997) (extended to P-waves, Böse et al., 2008) on a grid of stations (150 events on 5 segments, 30 smaller events randomly distributed)

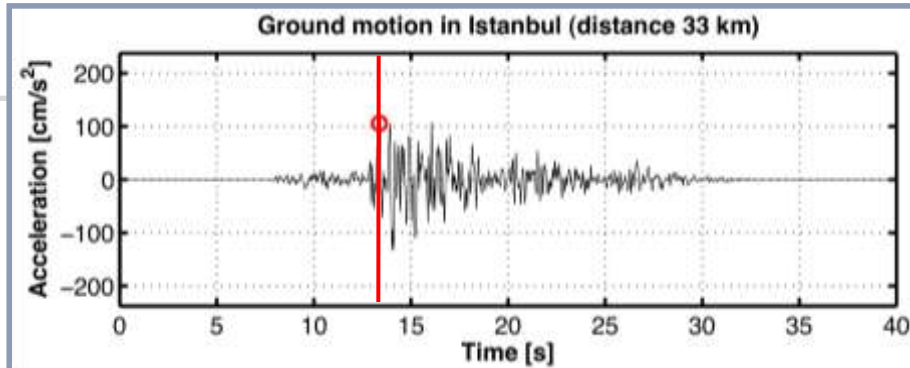
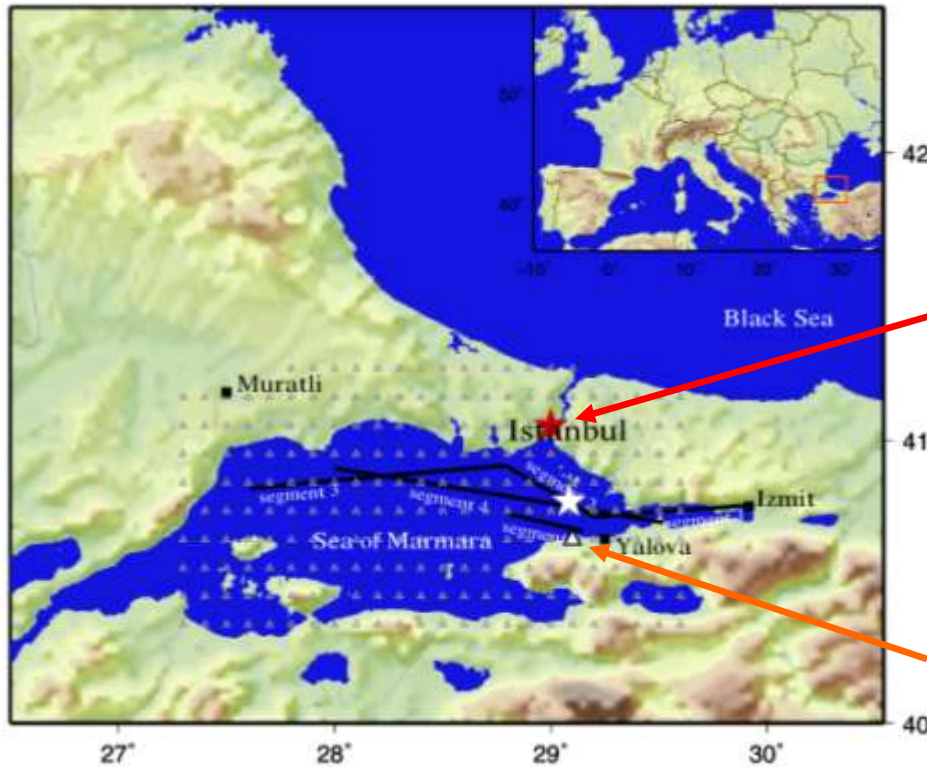
# Current early warning system



- Current EEW system implemented within the *Istanbul Earthquake Rapid Response and Early Warning System* (IERREWS, Erdik et al., 2003)
- 10 real-time stations along the shoreline of the Sea of Marmara (further 10 shall be added soon)
- 3 warn classes defined by thresholds 0.02g, 0.05g & 0.10g, which have to be exceeded at 3 stations within 5 sec

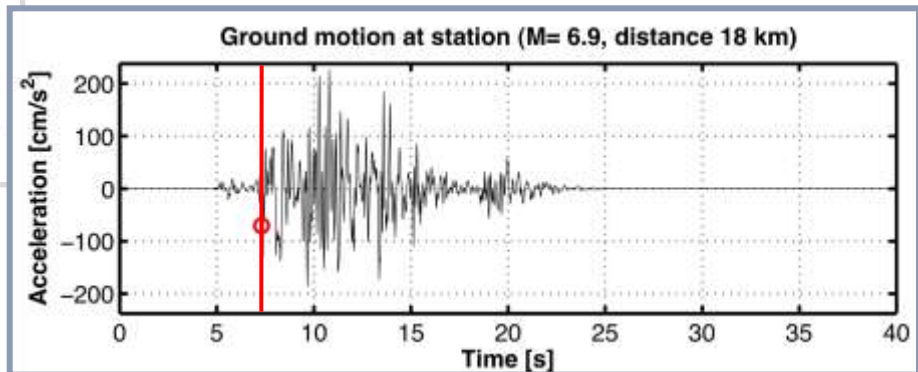
# Principle of thresholds-based system

Exceedance of threshold defining a given warn class in Istanbul (e.g. 0.1g)



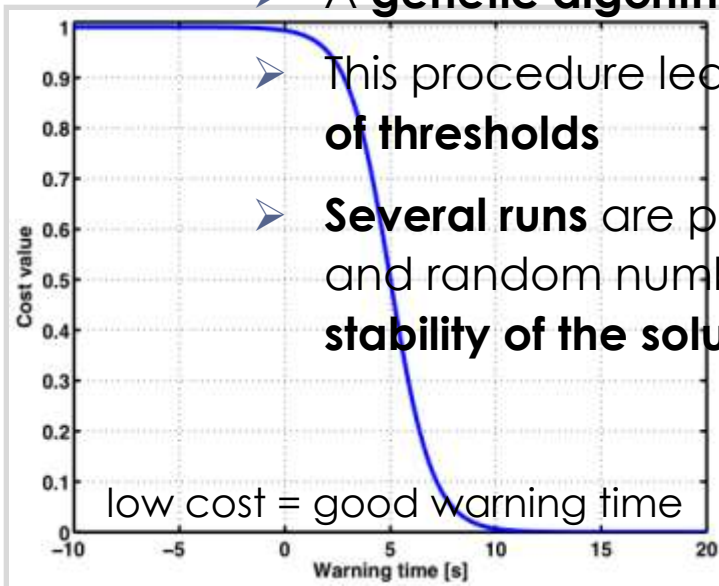
If waiting for 3 exceedances in 5 sec and if (in best case) 3 stations one close to the other in grid, minimum loss of 2-3 sec!

Exceedance of given threshold (e.g.) 0.05g



# Optimization approach

- **Start** with an **random station configuration** of a given number (e.g. 10) on grid and 3 thresholds in the range 0.01g – 0.32g
- **Warning times** for correctly classified events **are determined**
- **Warning times** are **evaluated** with a cost function based on a **sigmoid** centered around a certain  $t_{center}$  (e.g. 5 sec)
- A **genetic algorithm** is used to minimize the cost (micro-GA)



- This procedure leads to **stability of thresholds**
- **Several runs** are performed and random number generation ensures **stability of the solution**

$$\text{cost} = \sum_{i=1}^{N_{evt}} W_i \left\{ (1 - K) [1 - \text{sigm}(t_{warn,i}, t_{center}, S)] + K \right\}$$

**Minimization of cost** function → simultaneous **maximization** of number of **correctly classified events** and their **warning times!**

# Optimization approach

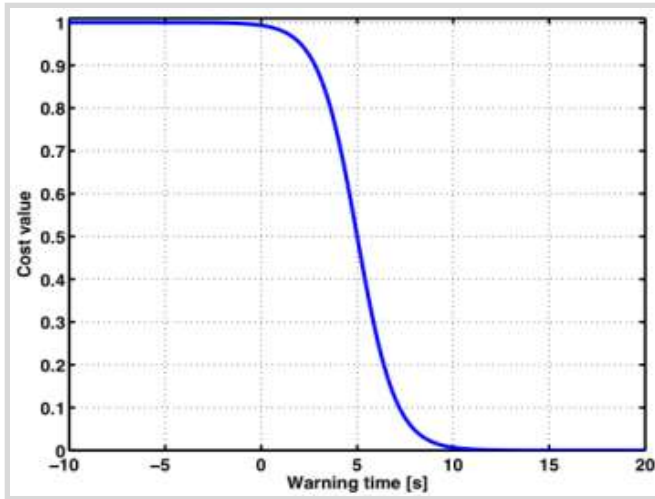
- **Two subgrids** where stations can be placed in the GA: stations **(a) on land** and **(b) in the Sea of Marmara**
- This way, the **benefit** of adding a certain **number of ocean bottom seismometers** (OBS) (and their best positions!) can be easily evaluated

## Classification of events:

- **Thresholds** GA used in current EEW system defined **without a direct link to ground motion** to be expected at the **user site** (Istanbul)!
  - **Class I:** PGA in Istanbul  $\geq 0.02g$
  - **Class II:** PGA in Istanbul  $\geq 0.05g$
  - **Class III:** PGA in Istanbul  $\geq 0.10g$
- **lowest possible rate of missed and false alarms!**
- Simulations in the database are for rock (NEHRP-B) sites!

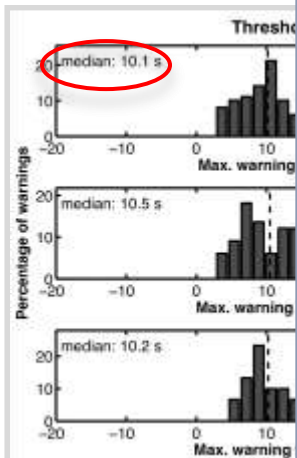


# Problem: how to set reasonable $t_{\text{center}}$ ?



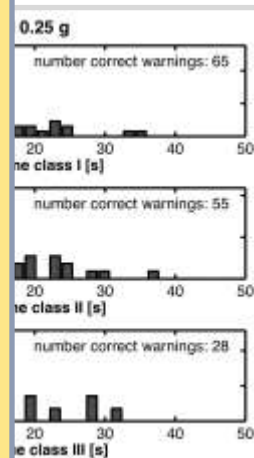
- **Sigmoid function:** a center time has to be chosen
- **Question:** what is the range of warning times that are reasonable to be expected?
- **Possible answer** from the **distribution of maximum possible warning times** (for fixed threshold, choosing for each event the station location on the grid where the threshold is first exceeded)

Max.  $t_{\text{warn}}$  dist



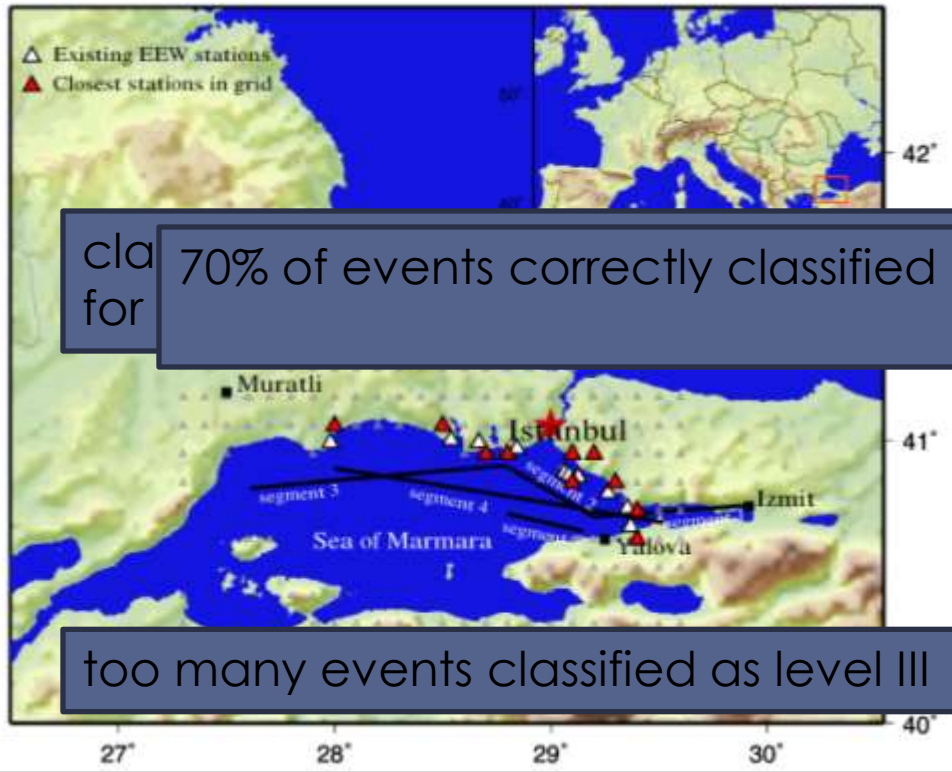
Chosen  $t_{\text{center}}$  in our runs:

- **If warning already after first exceedance:**
  - $t_{\text{center}} = [8 \ 8 \ 5]$  sec for level [I II III] (only land)
  - $t_{\text{center}} = [9 \ 9 \ 9]$  sec for level [I II III] (land & OBS)
- **If warning after three exceedances within 5 sec:**
  - $t_{\text{center}} = [6 \ 6 \ 3]$  sec for level [I II III] (only land)
  - $t_{\text{center}} = [8 \ 8 \ 5]$  sec for level [I II III] (land & OBS)
- **Spread factor S** → max. indiv. cost reached for  $t_{\text{warn}} = 0$  sec



# Evaluation of current system

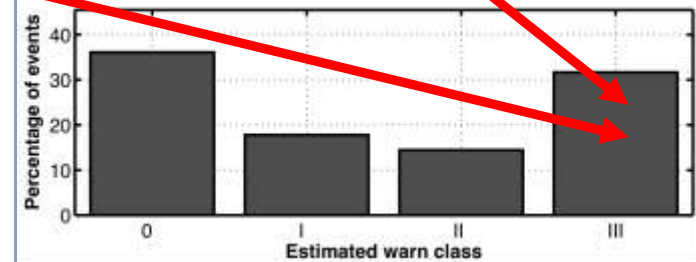
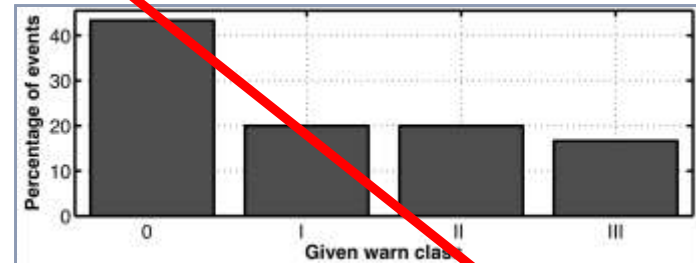
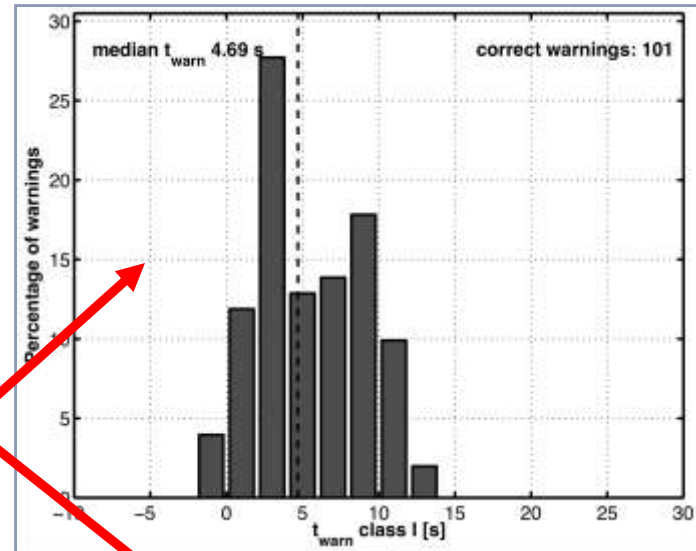
Thresholds: 0.02g (L1) 0.05g (L2) 0.10g (L3)



cla  
for 70% of events correctly classified

too many events classified as level III

**warning after three exceedances in 5 sec**

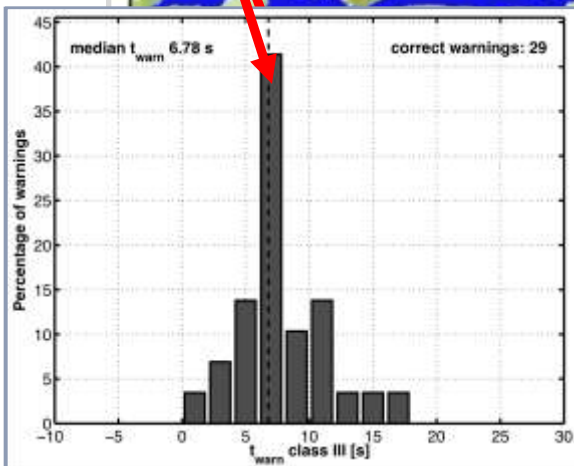


# Optimization: warning on 1<sup>st</sup> exceedance

## Only land stations

0.04g (L1) 0.12g (L2) 0.18g (L3)

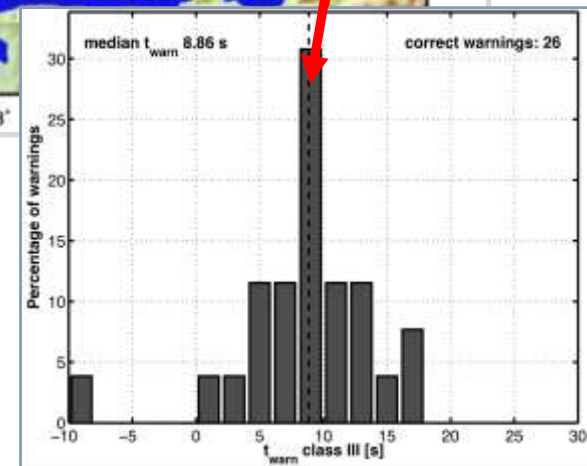
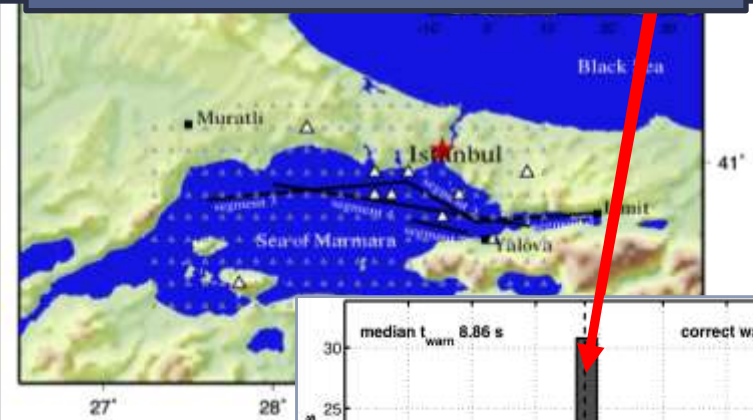
Thresholds higher than for current system



## 7 land stations, 3 OBS

0.06g (L1) 0.15g (L2) 0.30g (L3)

Thresholds higher than if only land stations are considered (especially class III)



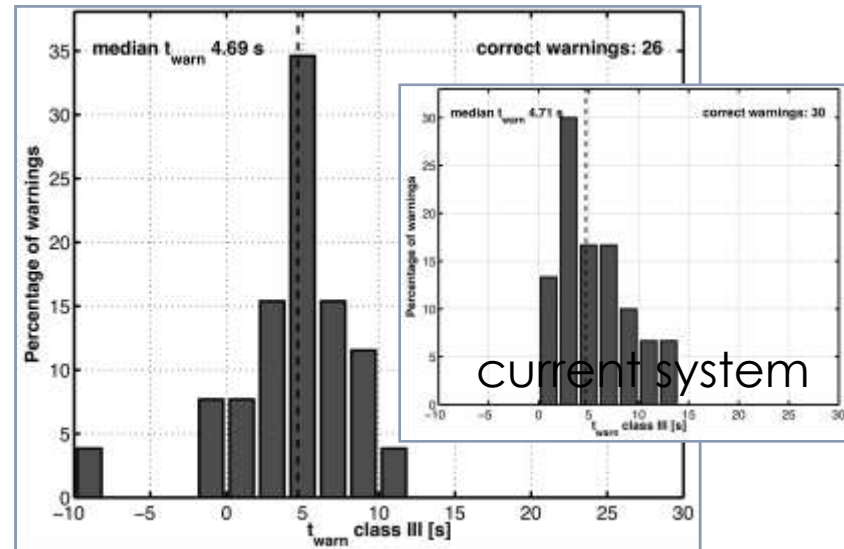
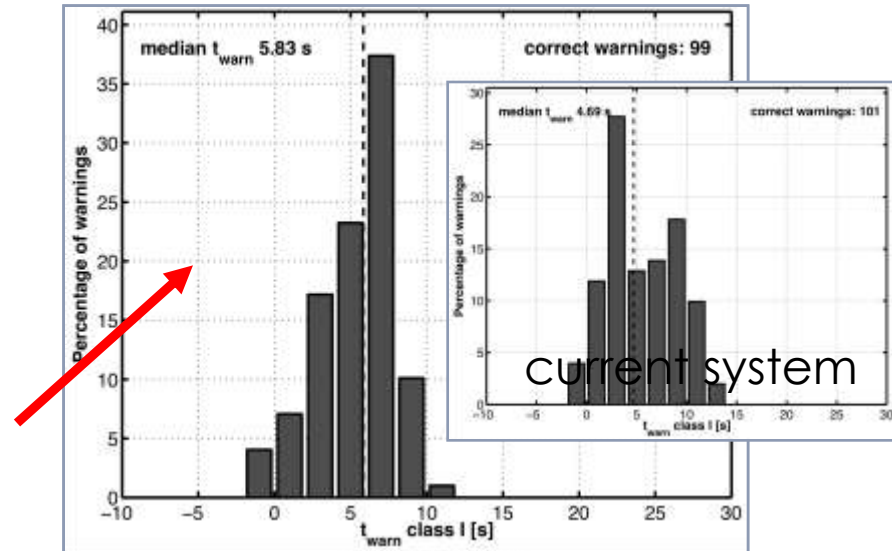
Partial mimicking of current system: warning on first exceedance

# Full optimization: 10 land stations

Thresholds: 0.03g (L1) 0.07g (L2) 0.17g (L3)



**Full mimicking of current system:  
warning after three exceedances in 5 sec**



# Full optimization: 7 land stations, 3 OBS

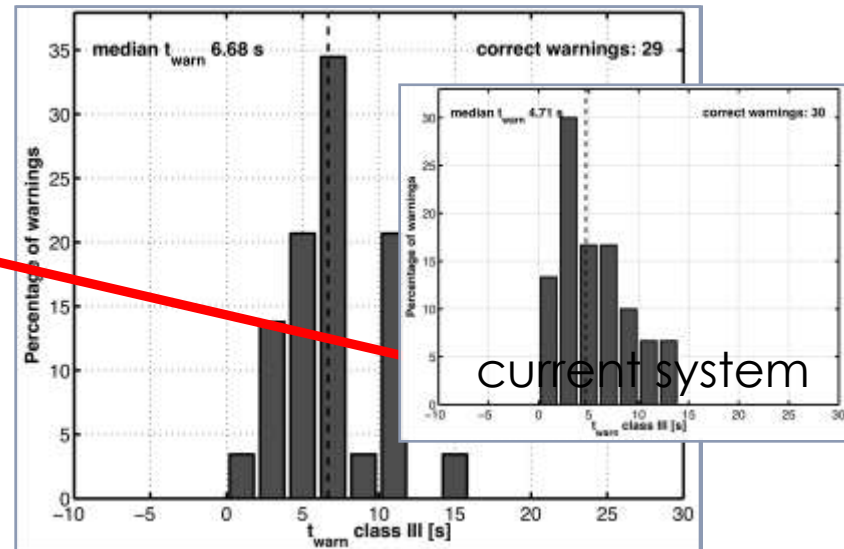
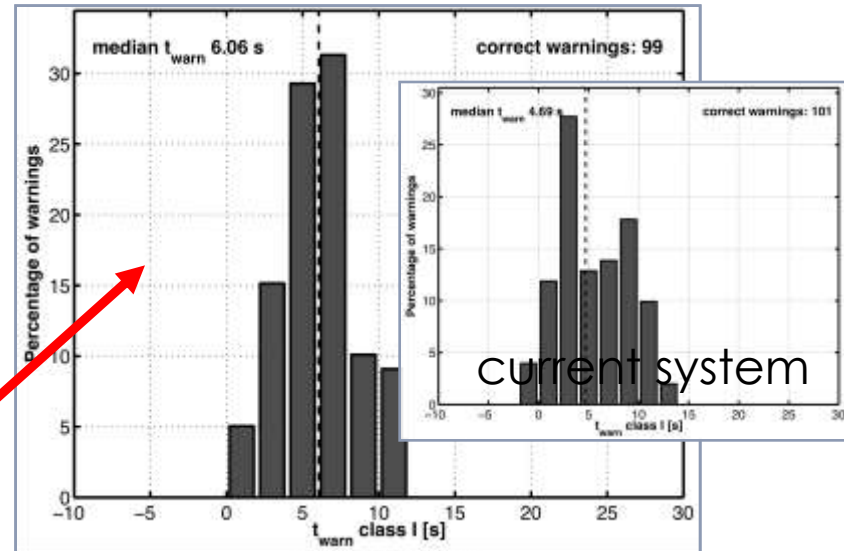
Thresholds: 0.03g (L1) 0.07g (L2) 0.17g (L3)

**Thresholds identical** as with optimized land station system,  $t_{\text{warn}}$  **gain** of roughly **2 sec**, especially for class III

87% of events correctly classified

all class III events except one correctly classified!

**Full mimicking of current system: warning after three exceedances in 5 sec**



# Conclusions

- The presented methodology can **optimize the seismic network (sites) and the parameter** for early warning.
- Optimization approach as such **not limited to threshold-based systems**, but might also be applicable when using e.g. predominant period as indicator for earthquake magnitude
- **The current Istanbul EEW system performs quite well**. There is **however room for improvement**, as the optimization shows:
  - *by increasing class III threshold to avoid class III false alarms*
  - *by slightly modifying the station distribution*
- **Using three OBS** would generally **increase the available warning times** by 2 – 3 sec on average (especially noticeable for class III events)