



Real-time, probabilistic and evolutionary earthquake location for seismic early warning

by **Claudio Satriano (I)**, Anthony Lomax (III) and Aldo Zollo (II)

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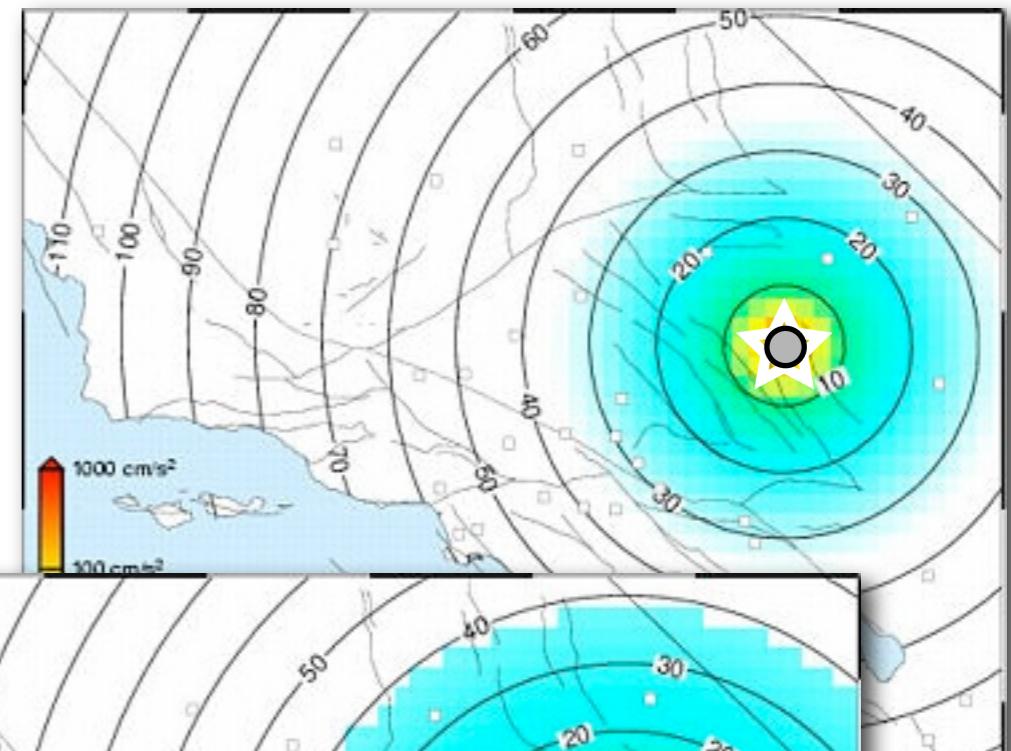
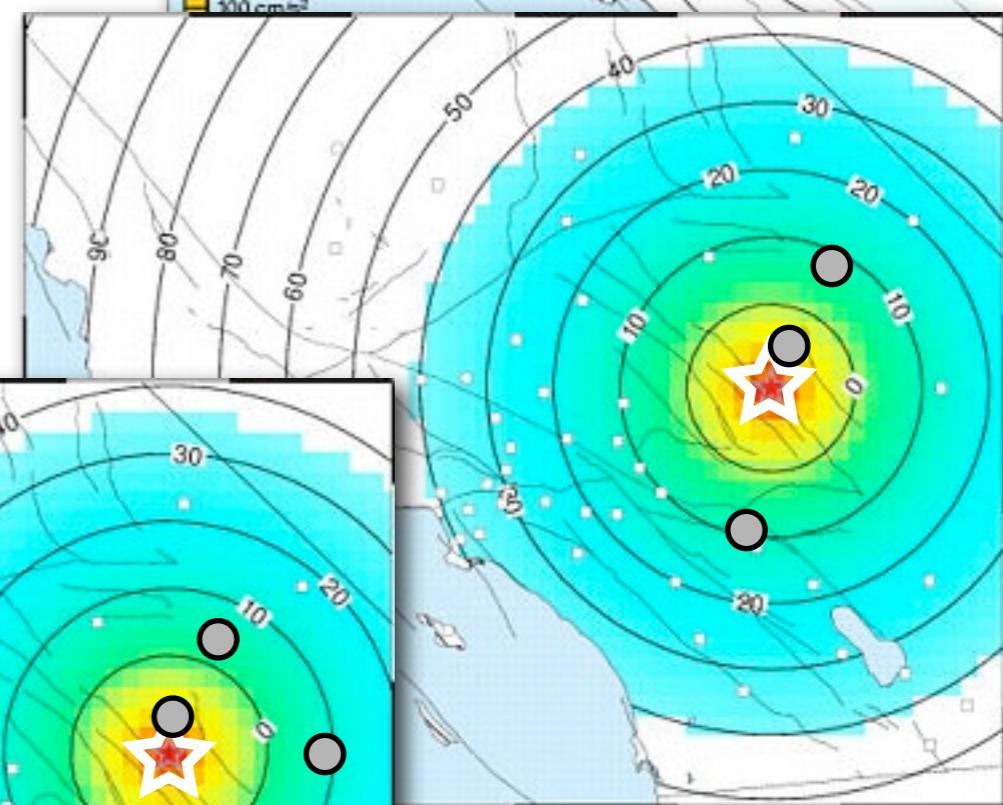
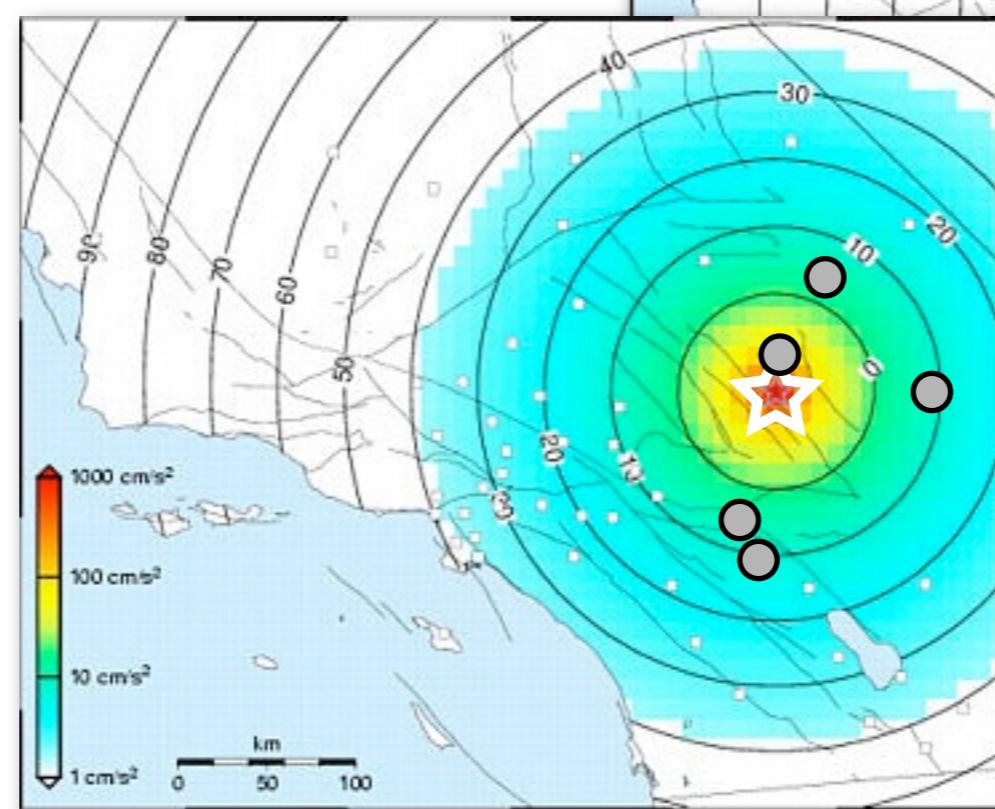
(III) Anthony Lomax Scientific Software, France

Introduction

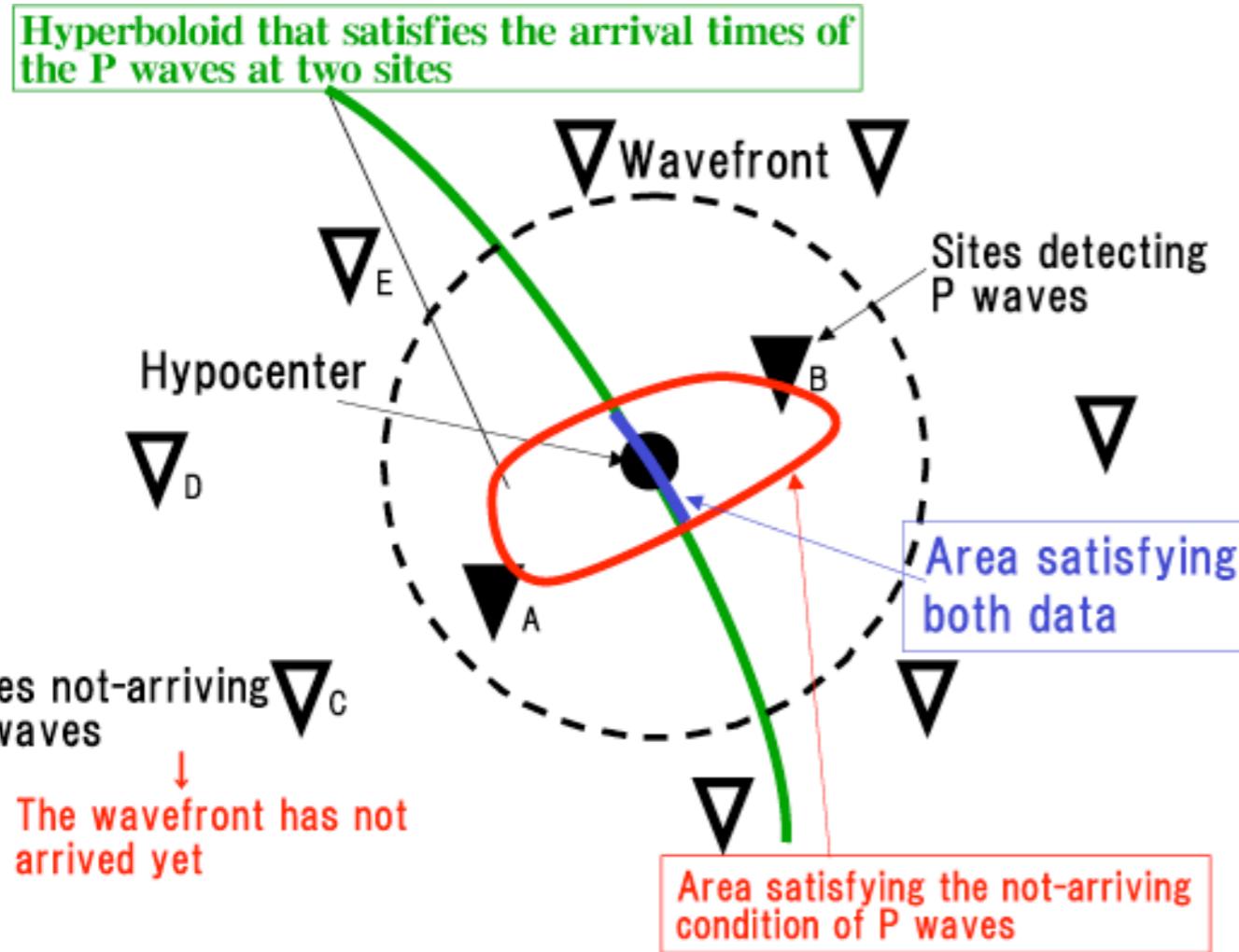
- A regional early warning system is based on the ability of a seismic network to provide estimates of the location and size of a potentially destructive earthquake within a few seconds after the event is first detected.
- This information is then used to characterize the earthquake, and to estimate its severity for the selected target in order to take mitigating actions.

ElarmS

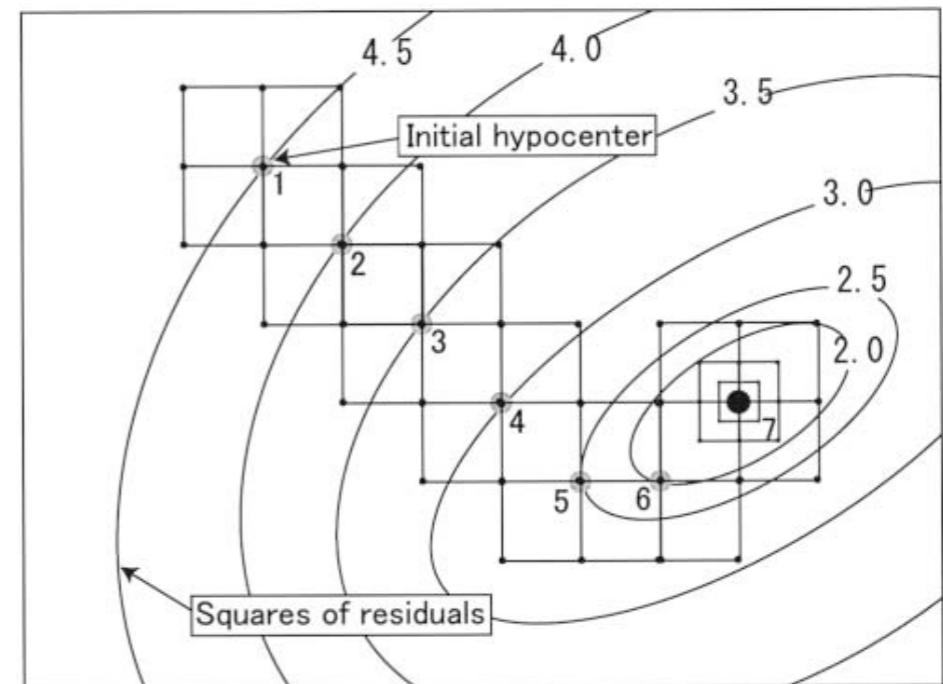
- Earthquakes are located using the arrival times of P-waves.
- When the first station triggers an event is located at that station with a depth typical of events in the region.
- The earthquake is then located between the first two, and then the first three stations to trigger.
- Once four stations have triggered a grid search method is used to locate the event, minimizing the misfit between predicted and observed arrival times.



Real-time location at NIED, Japan



$$T_{\text{now}} - T_i(\mathbf{x}, t) < 0$$



Real-Time Earthquake Location (RTLoc)

Our methodology is related to that of Horiuchi et al. [2005], which we extend and generalize by:

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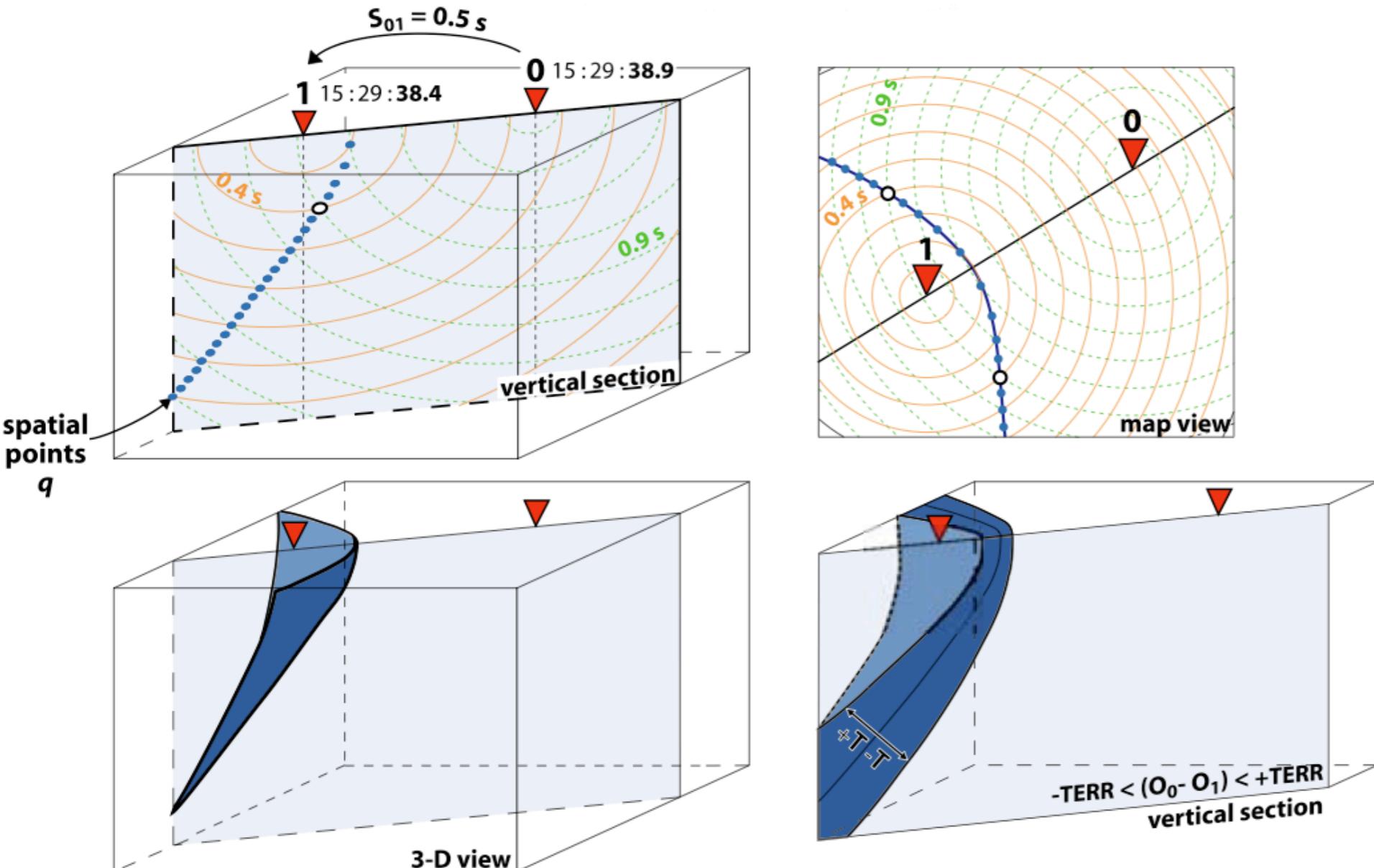
- a. starting the location procedure after only one station has triggered
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- b. using the Equal Differential Time (EDT) approach throughout to incorporate the triggered arrivals and the not-yet-triggered stations
- c. estimating the hypocenter probabilistically as a *pdf* instead of as a point
- d. applying a full, non-linearized, global-search for each update of the location estimate.

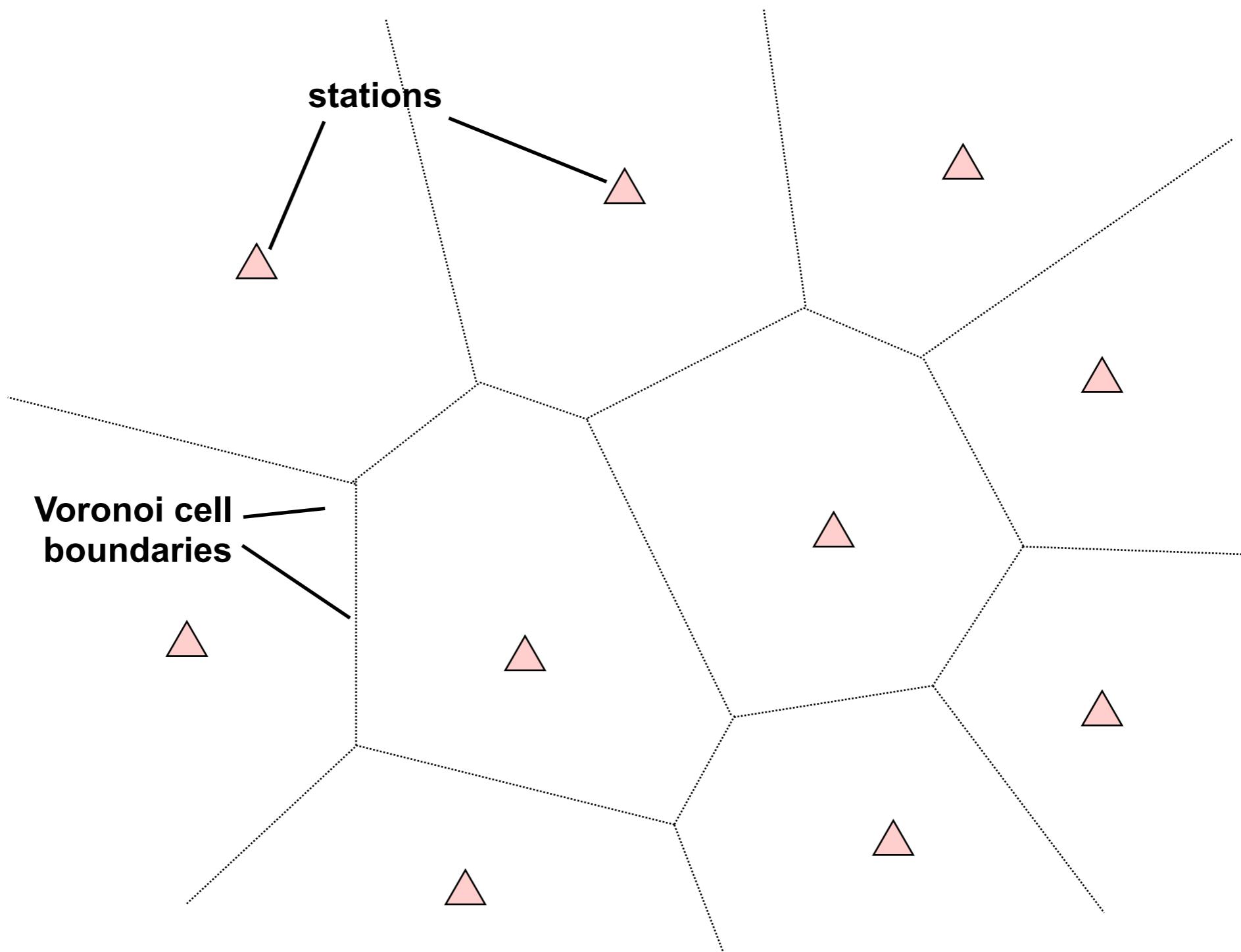
Equal Differential Time (EDT) approach



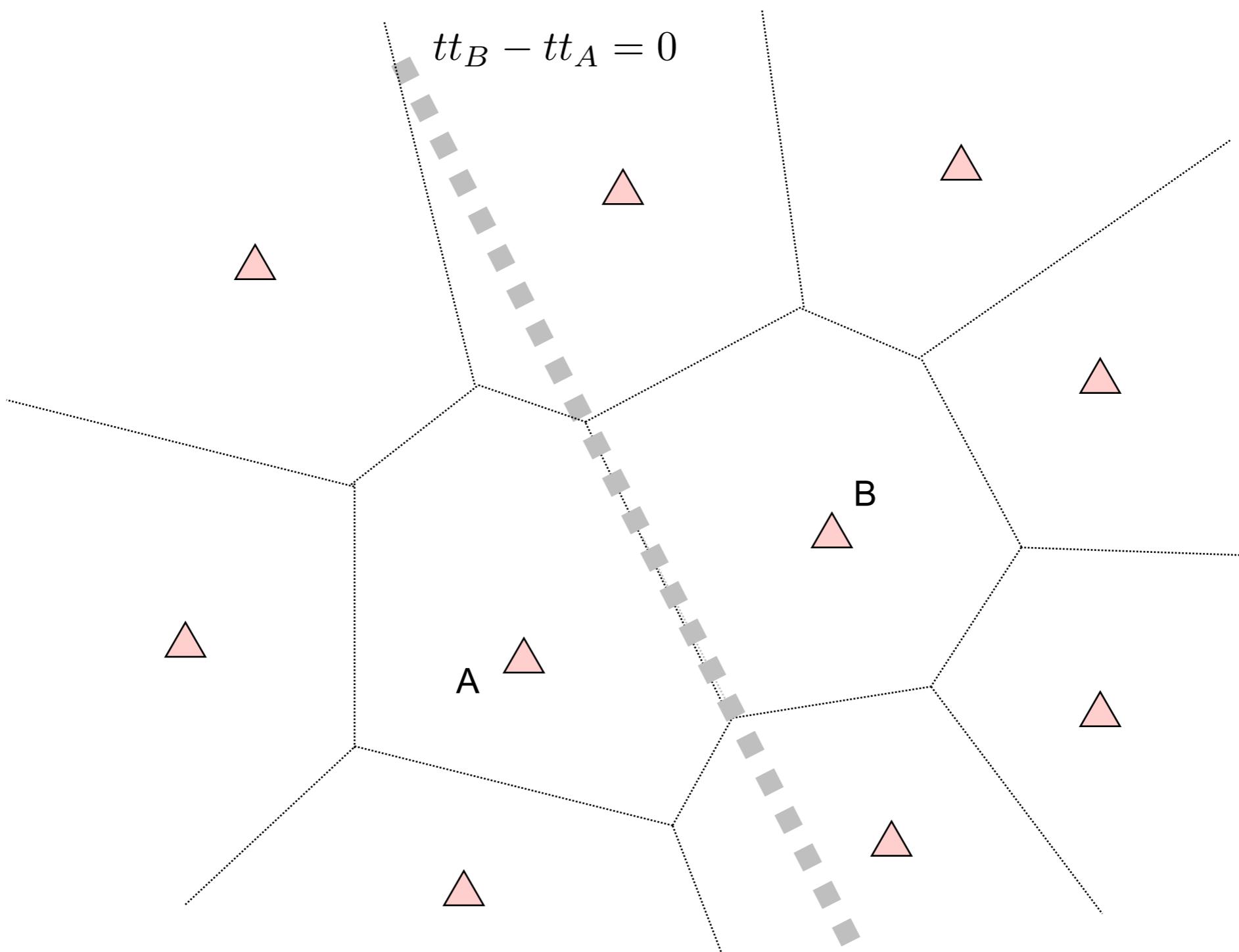
If the hypocenter is exactly determined, the difference between calculated travel times tt_0 and tt_1 from the hypocenter to two stations S_0 and S_1 is equal to the difference between the observed arrival times t_0 and t_1 at the two stations, since the observed arrival times share the common earthquake origin time:

$$tt_1 - tt_0 = t_1 - t_0$$

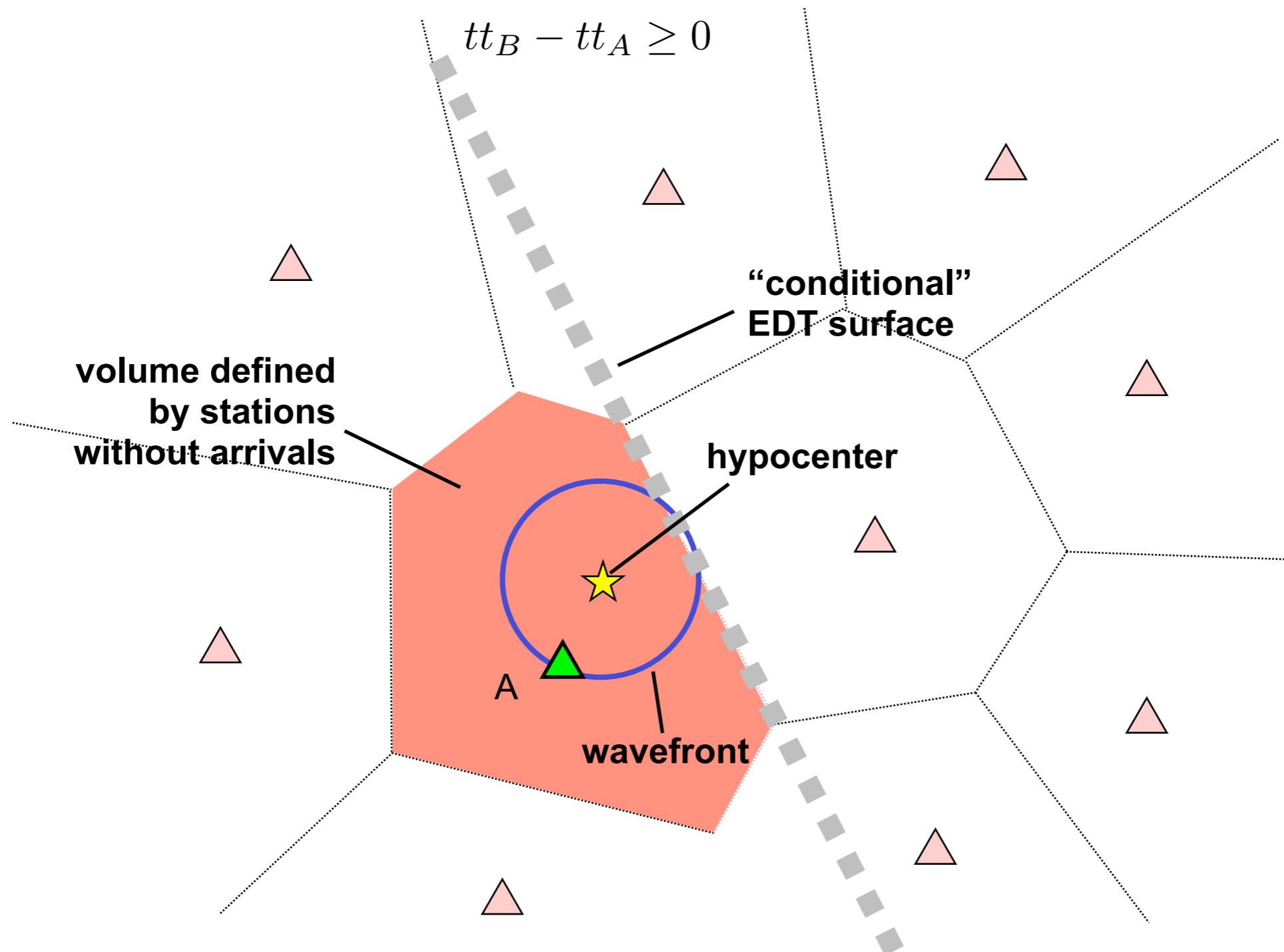
Evolutionary Earthquake Location - 1/7



Evolutionary Earthquake Location - 2/7

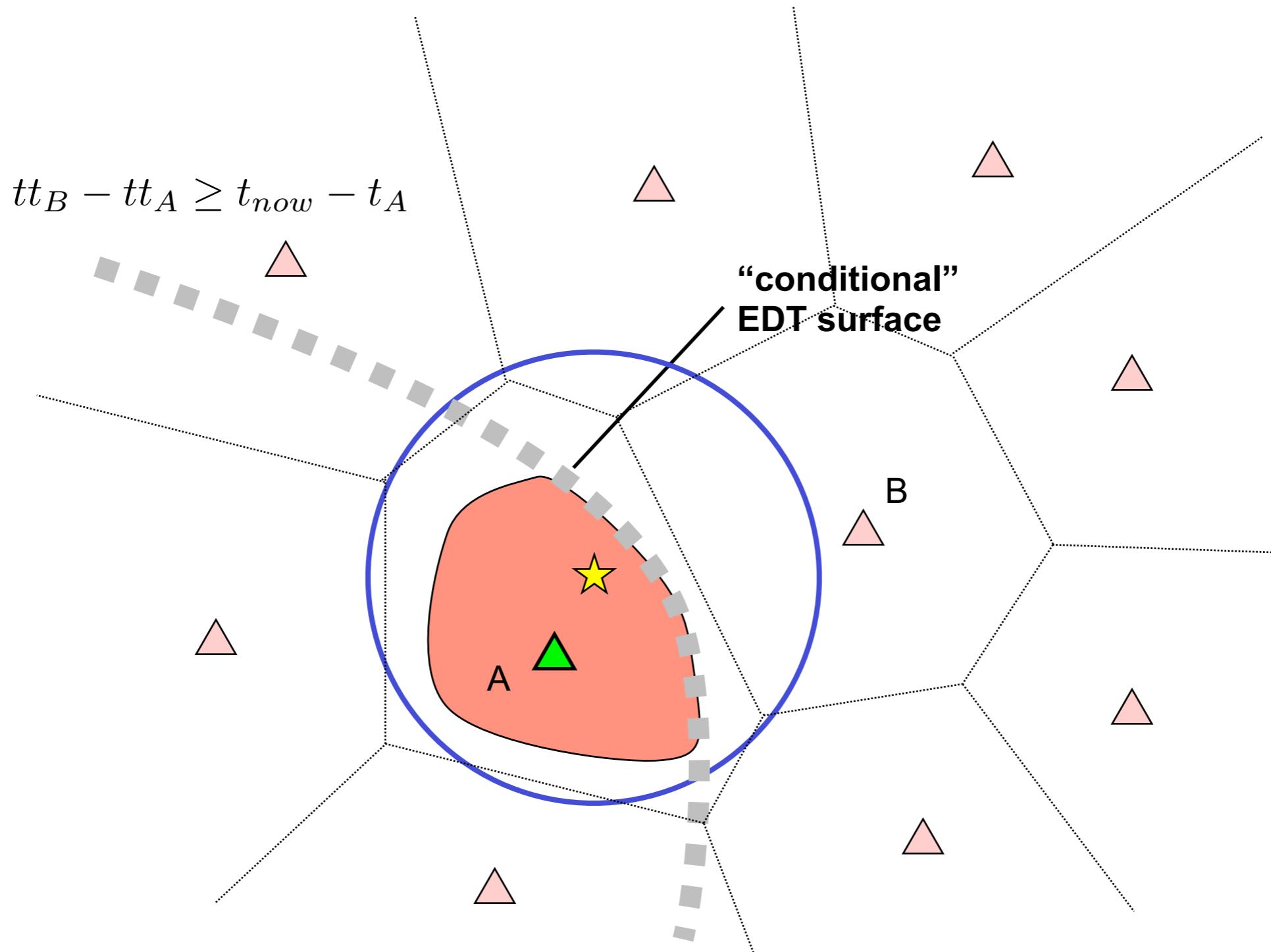


Evolutionary Earthquake Location - 3/7



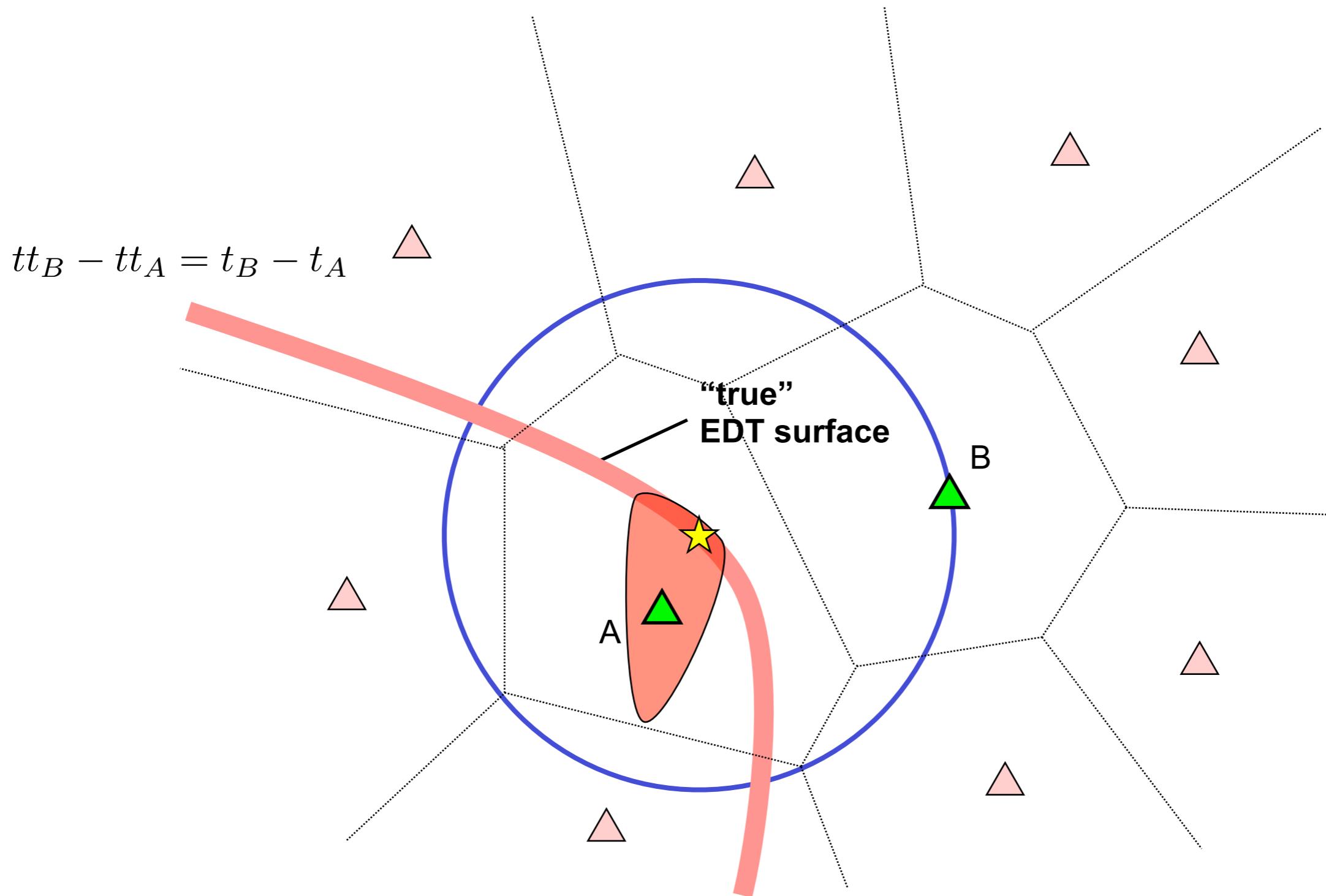
First station detects arrival
constraint is Voronoi cells

Evolutionary Earthquake Location - 4/7



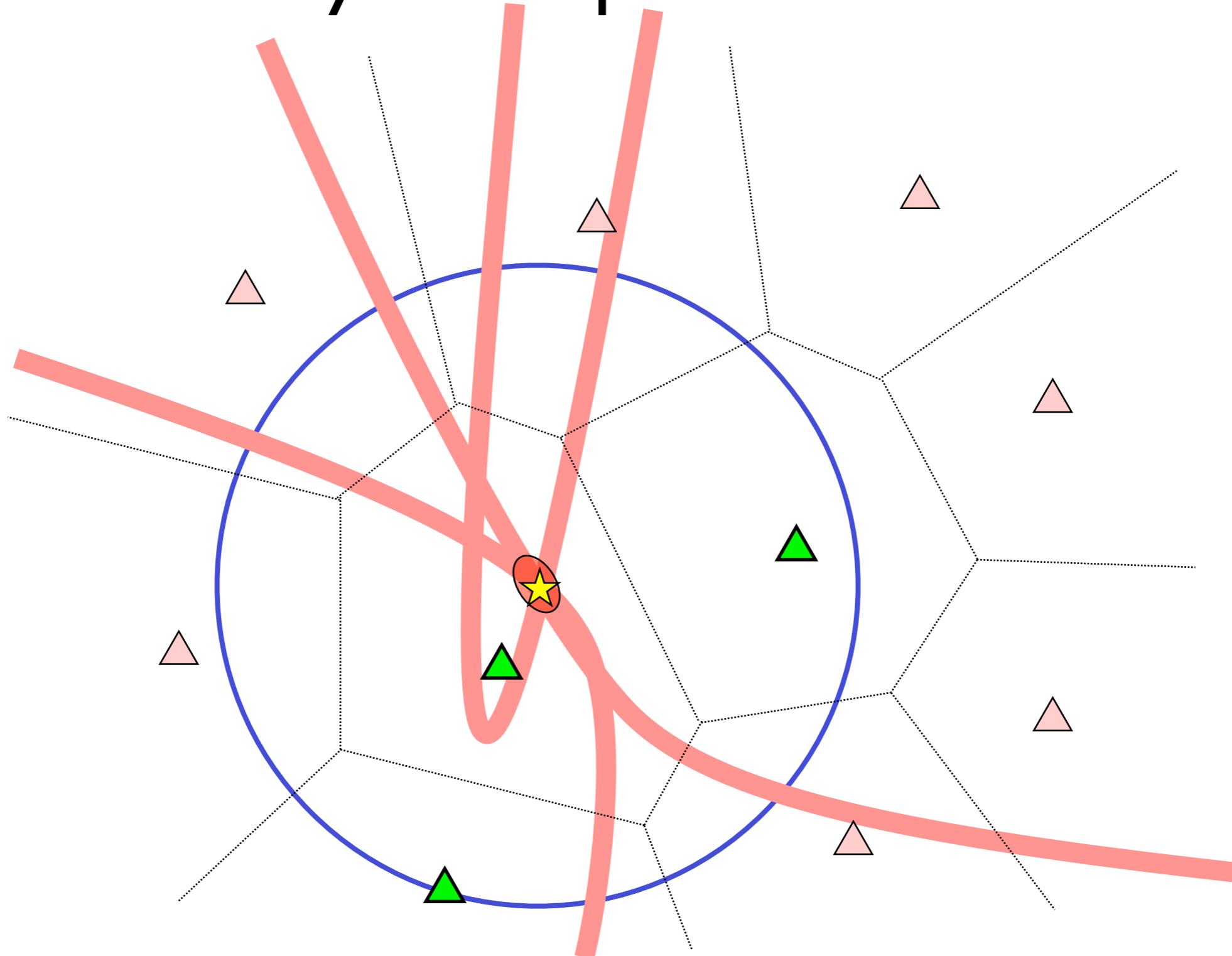
Wavefront expands
EDT surfaces deform, constraint improves

Evolutionary Earthquake Location - 5/7



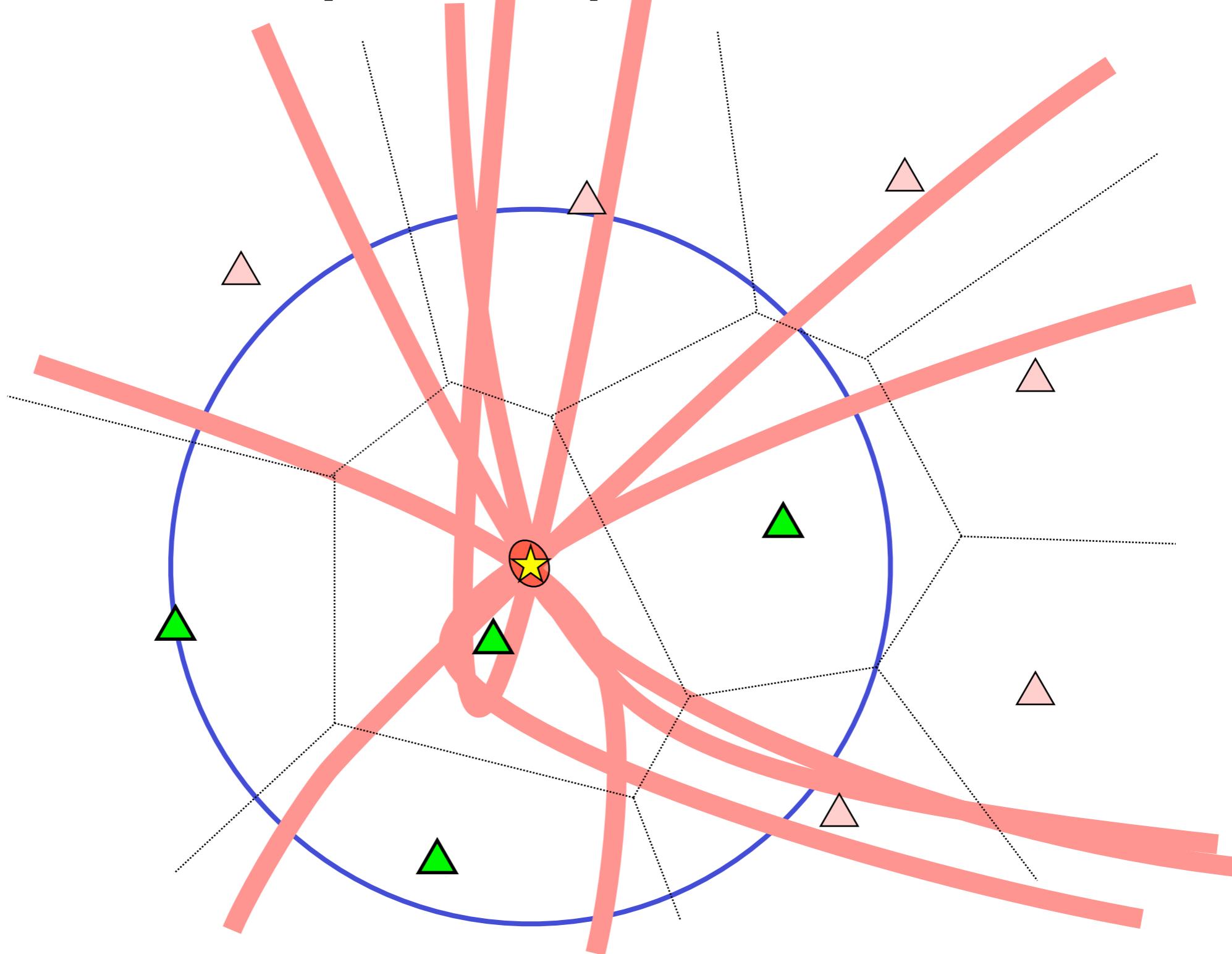
Second station detects arrival
constraint includes EDT surface

Evolutionary Earthquake Location - 6/7



Third station detects arrival
constraint is mainly EDT surfaces

Evolutionary Earthquake Location - 7/7



Fourth station detects arrival
location is well constrained

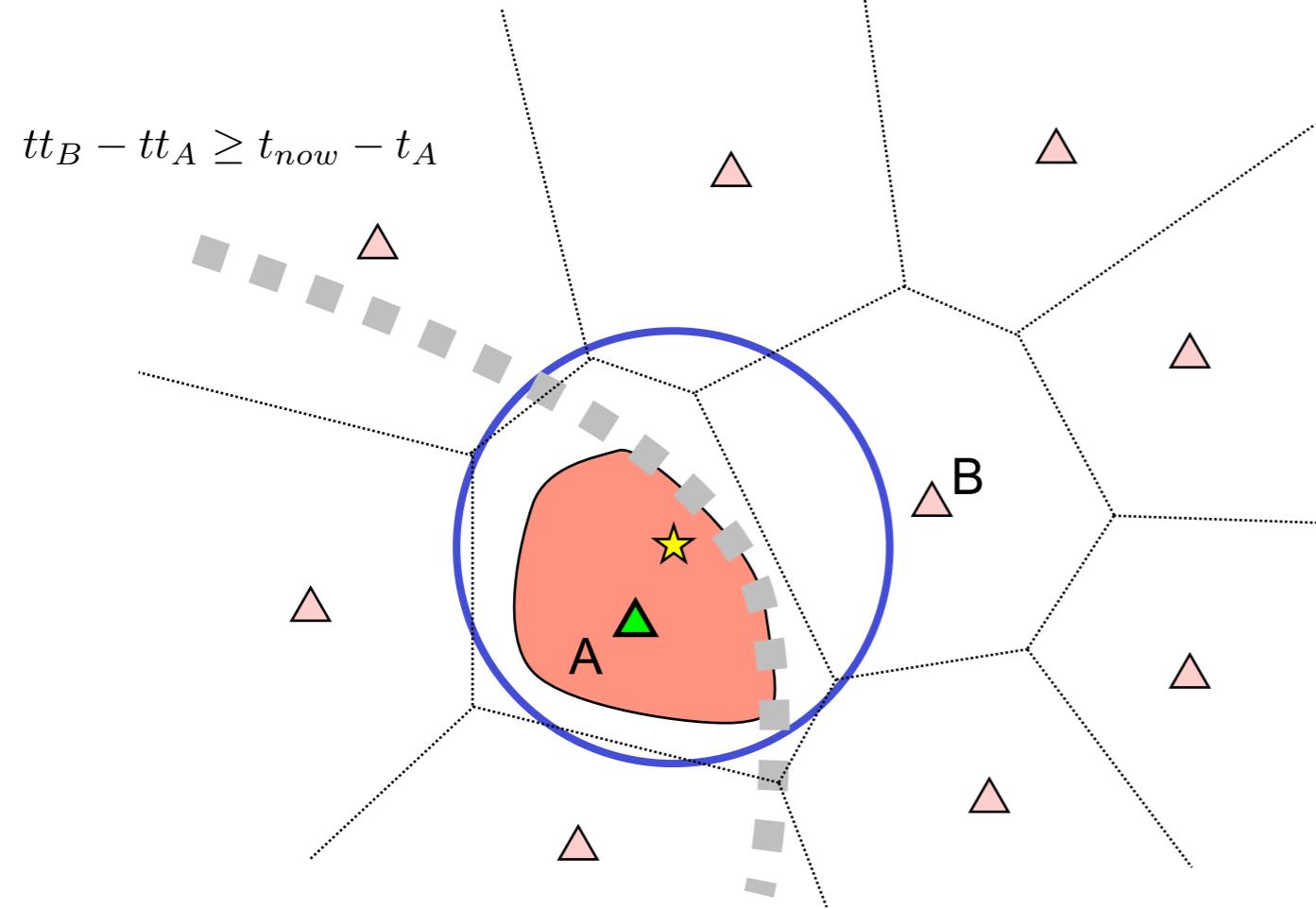
RTLoc:Algorithm (1/2)

We consider N operational stations (S_0, \dots, S_N), a **gridded search volume** V containing the network and target earthquake source regions, and **pre-computed travel times** from each station to each grid point (i,j,k) in V computed for a given velocity model.

When the first station S_n triggers, we compute for each grid point the quantity:

$$(p_n)_{i,j,k} = \begin{cases} 1 & \text{if } (tt_{Sk} - tt_{Sn})_{i,j,k} \geq \delta t_{n,k} \\ 0 & \text{if } (tt_{Sk} - tt_{Sn})_{i,j,k} < \delta t_{n,k} \end{cases}; k \neq n$$

$$\delta t_{n,k} = t_{now} - t_{Sn}$$



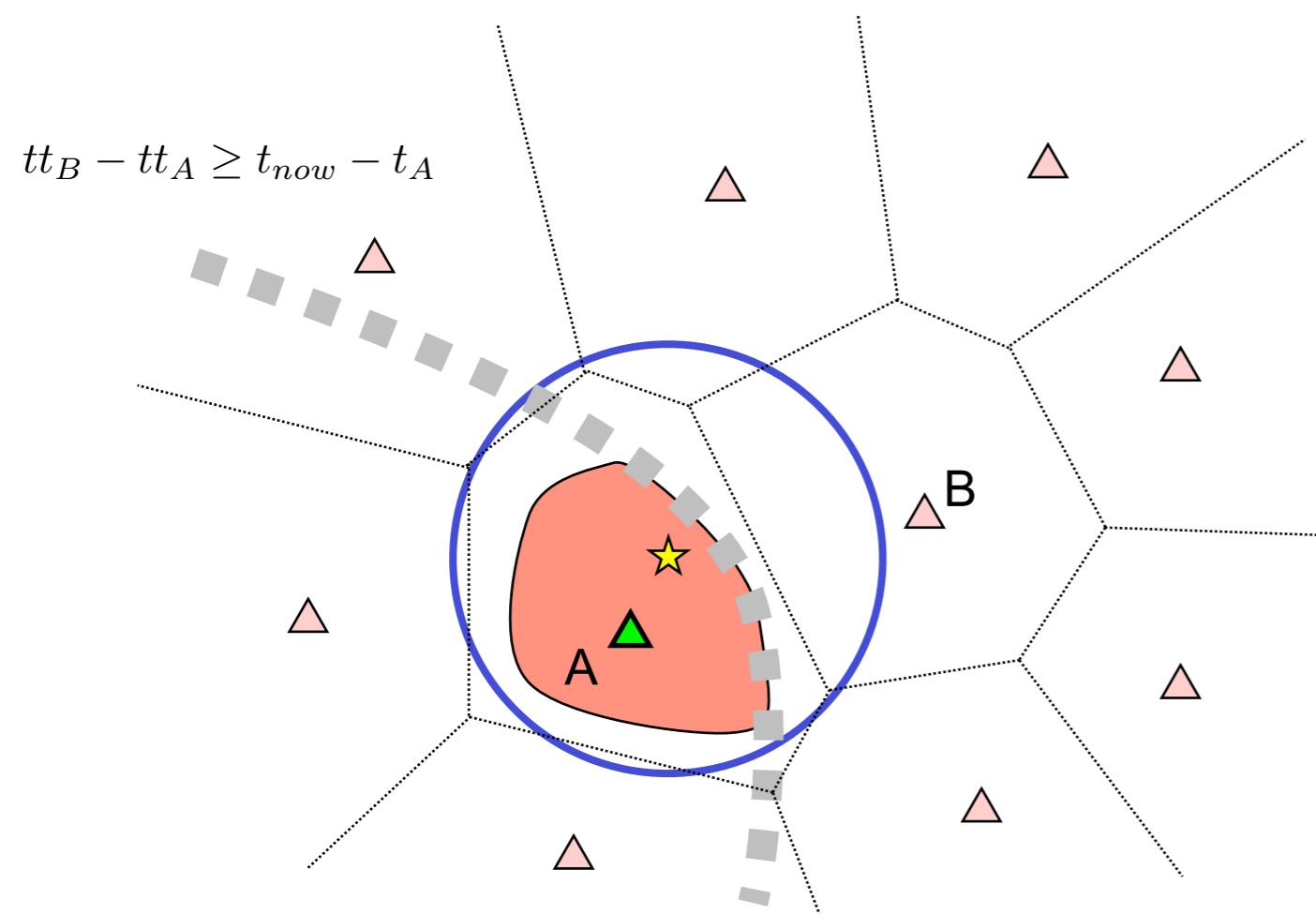
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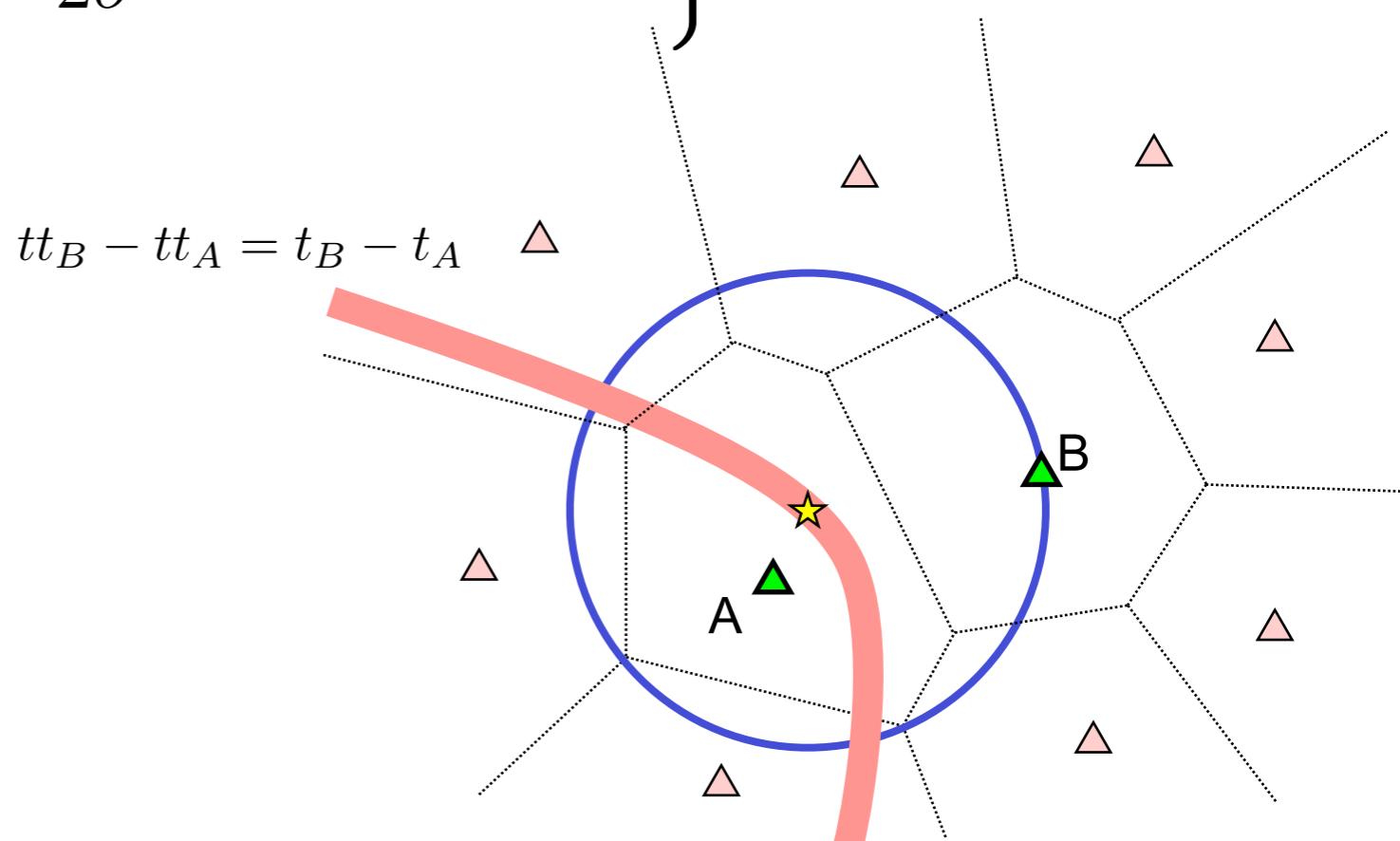


When a new station triggers, we re-evaluate $(pm)_{i,j,k}$ for all the pairs S_n (triggered) - S_k (not-yet-triggered).

RTLoc:Algorithm (2/2)

For each pair S_n, S_m of triggered stations, we compute at each grid point (i, j, k) , the quantity:

$$(q_m)_{i,j,k} = \exp \left\{ -\frac{[(tt_{Sm} - tt_{Sn}) - (t_{Sm} - t_{Sn})]^2_{i,j,k}}{2\sigma^2} \right\}; m \neq n$$

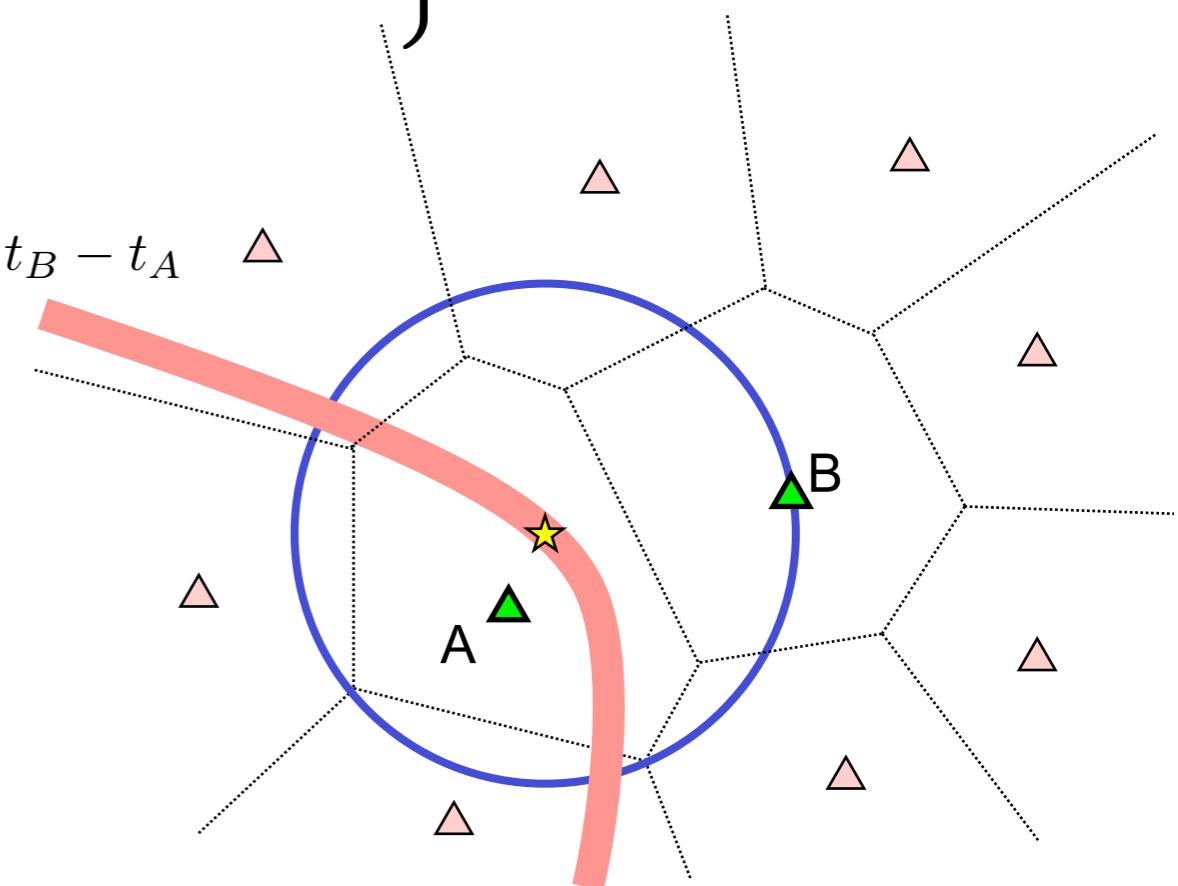


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$$tt_B - tt_A = t_B - t_A$$



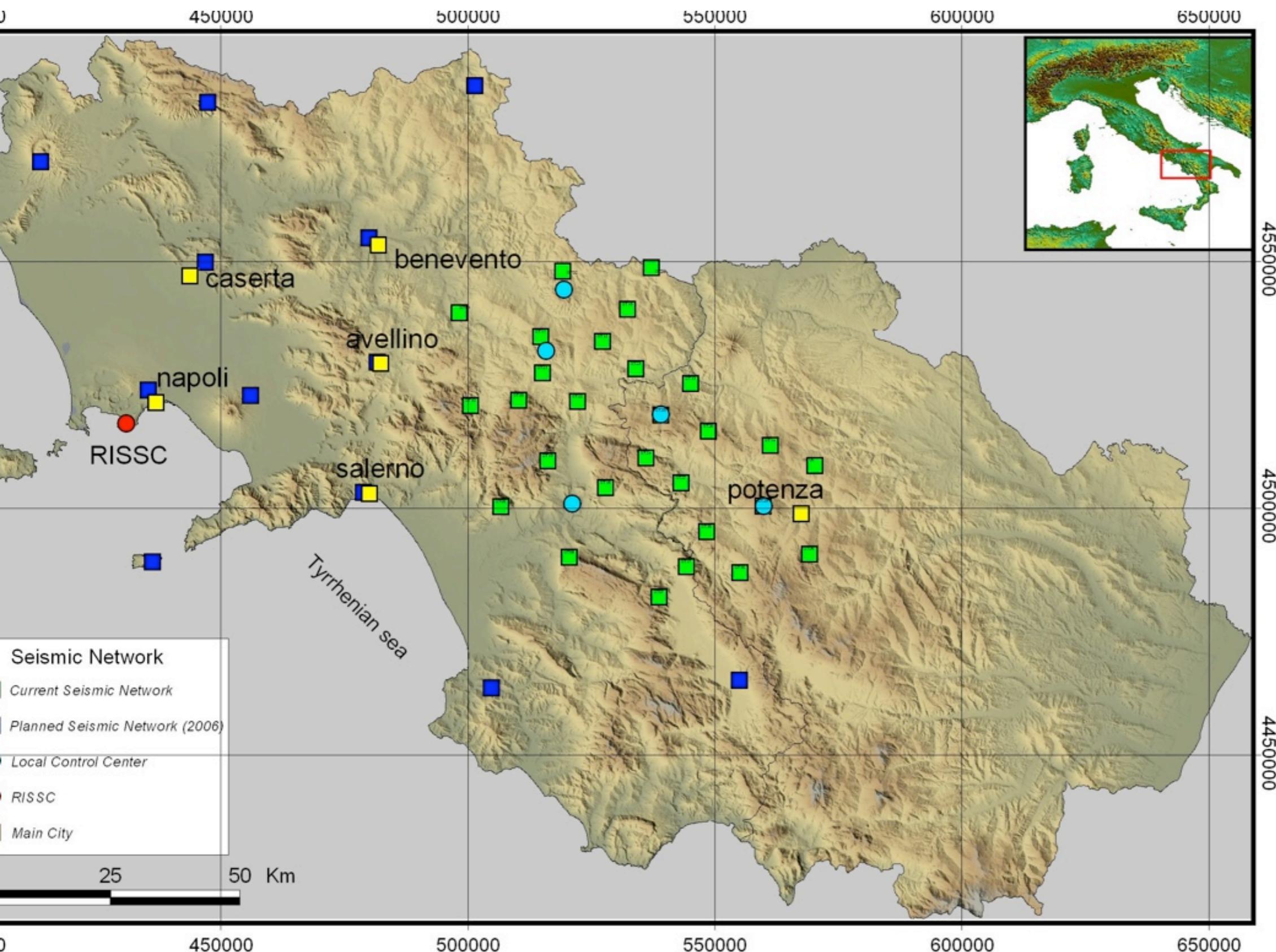
Eventually, for each grid point we define:

$$P_{i,j,k} = \frac{1}{M} \left[\sum_n (p_n)_{i,j,k} + \sum_m (q_m)_{i,j,k} \right]$$

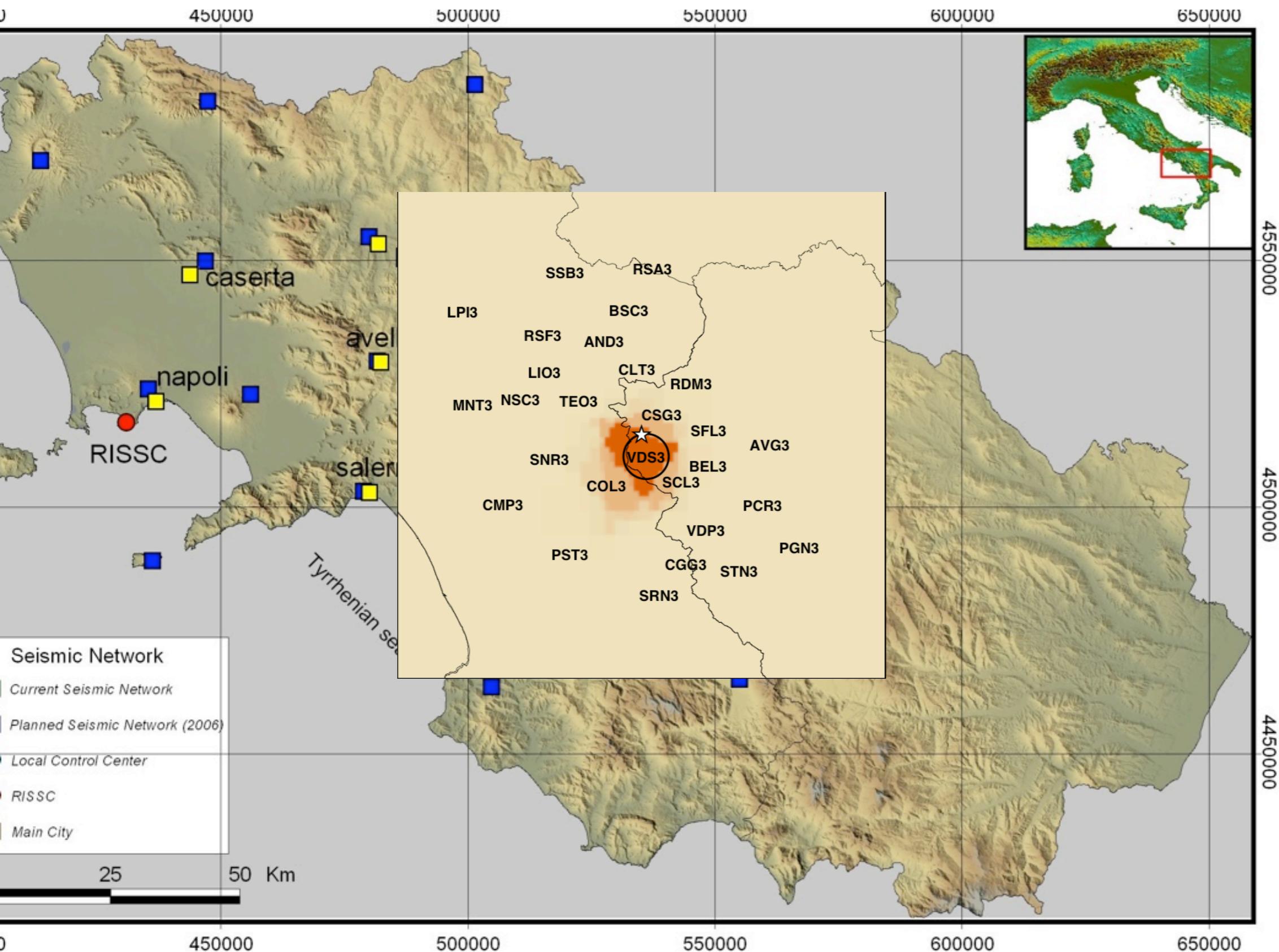
$$Q_{i,j,k} = (P_{i,j,k})^N$$

where M is the number of equations.

The quantity $Q_{i,j,k}$ forms a relative probability density function (with values between 0 and 1) for the hypocenter location within the grid cell (i, j, k) .

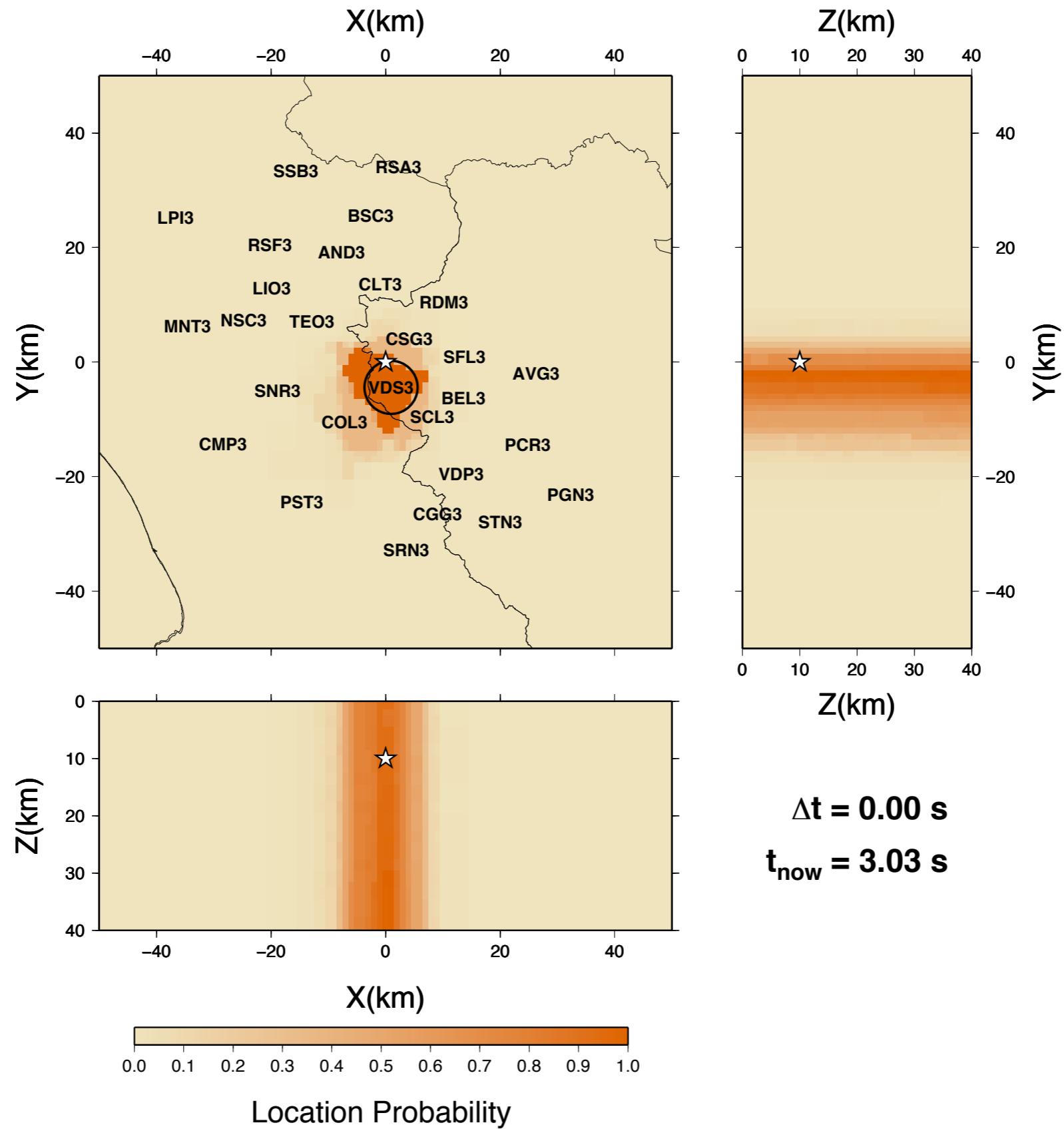


The Irpinia Seismic Network (ISNet)

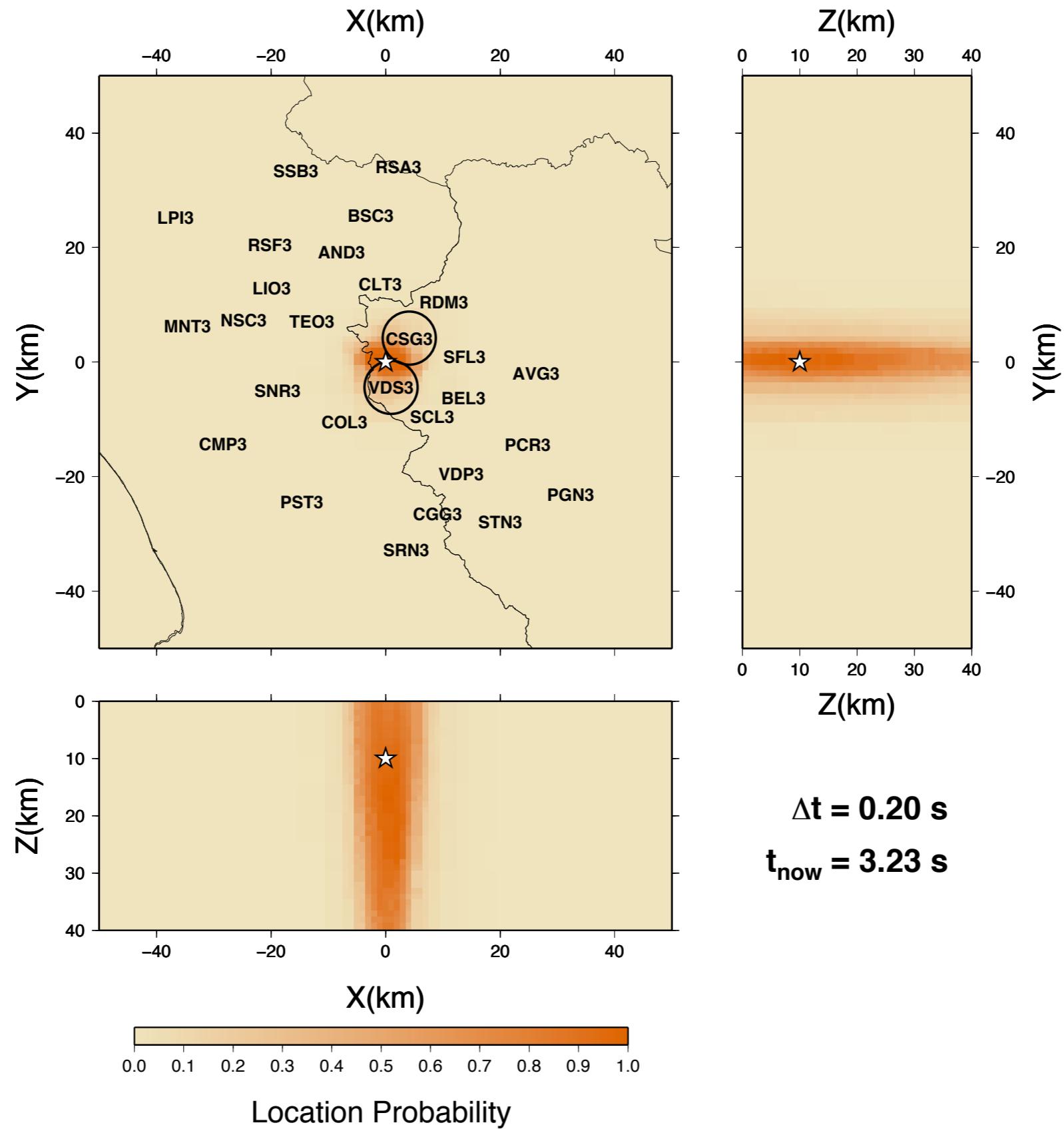


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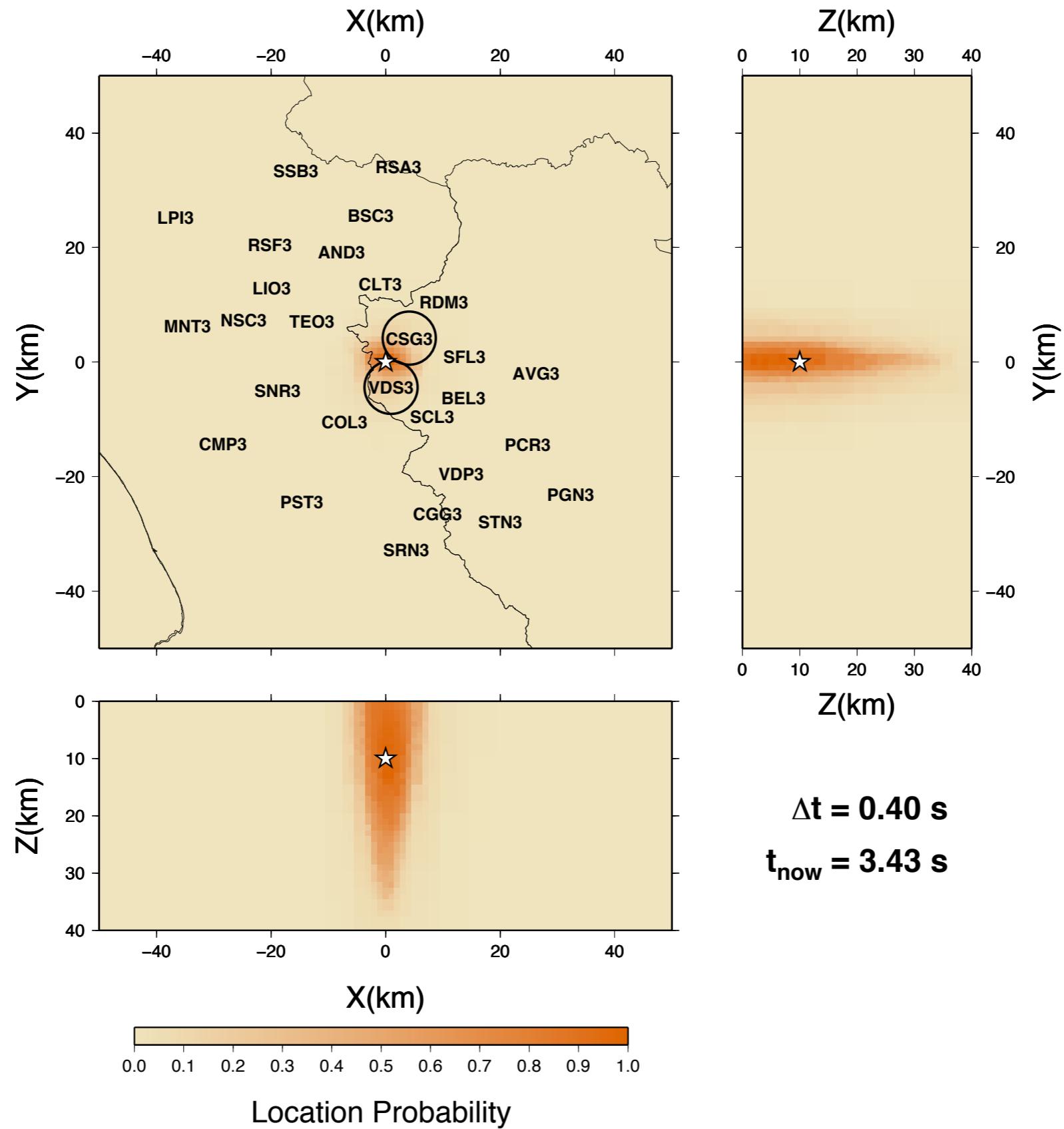
RTLoc test at the ISNet



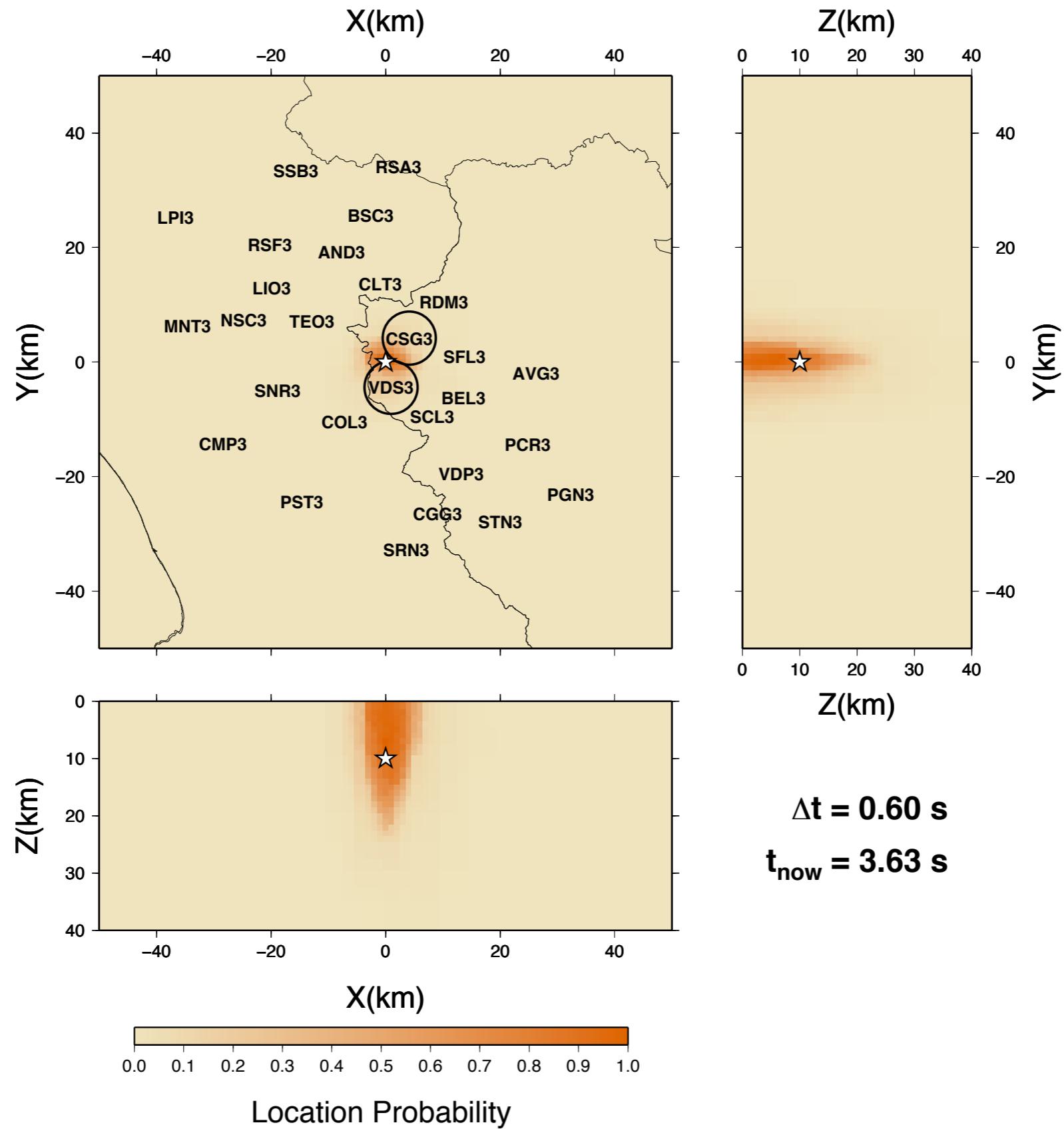
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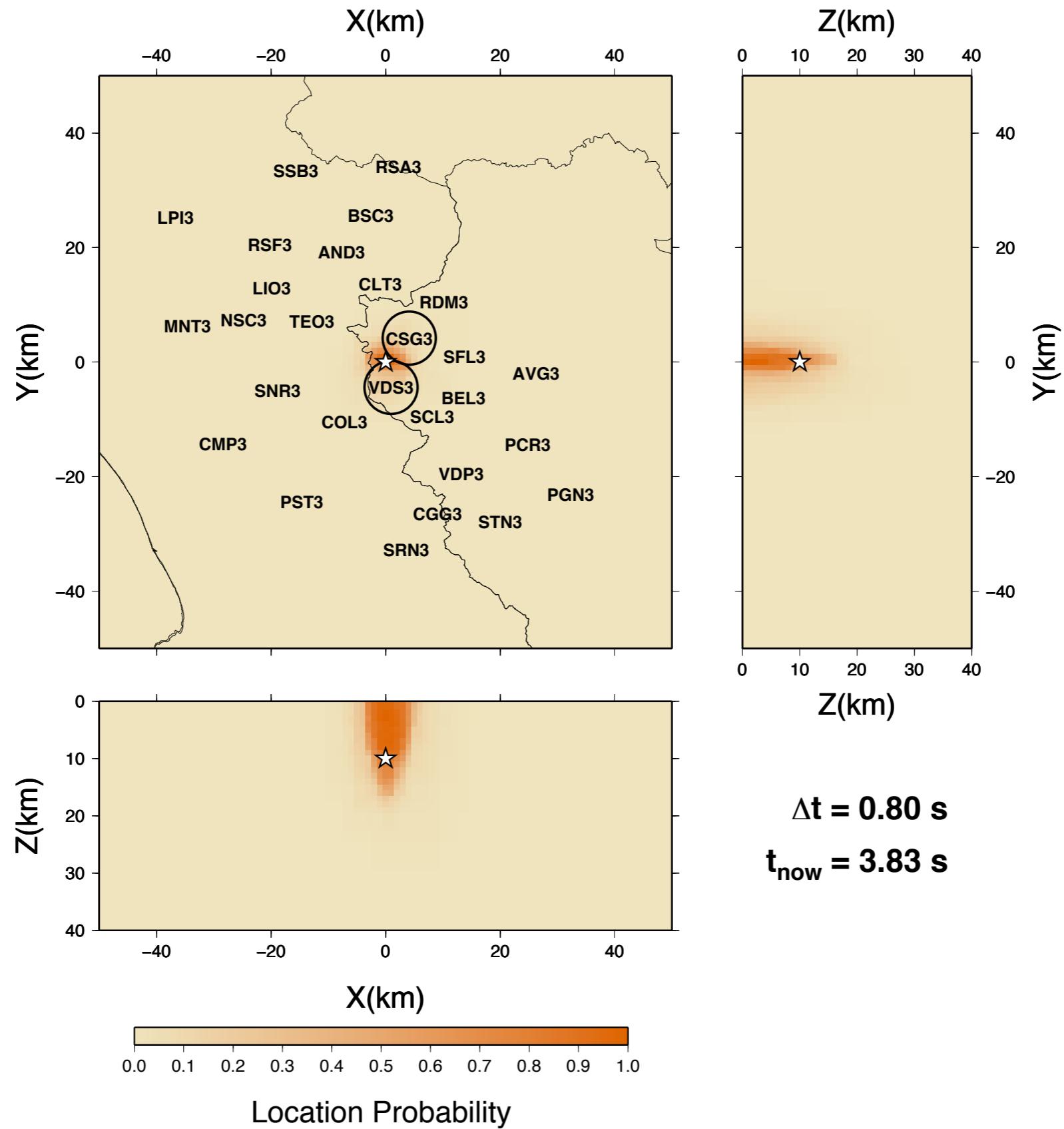
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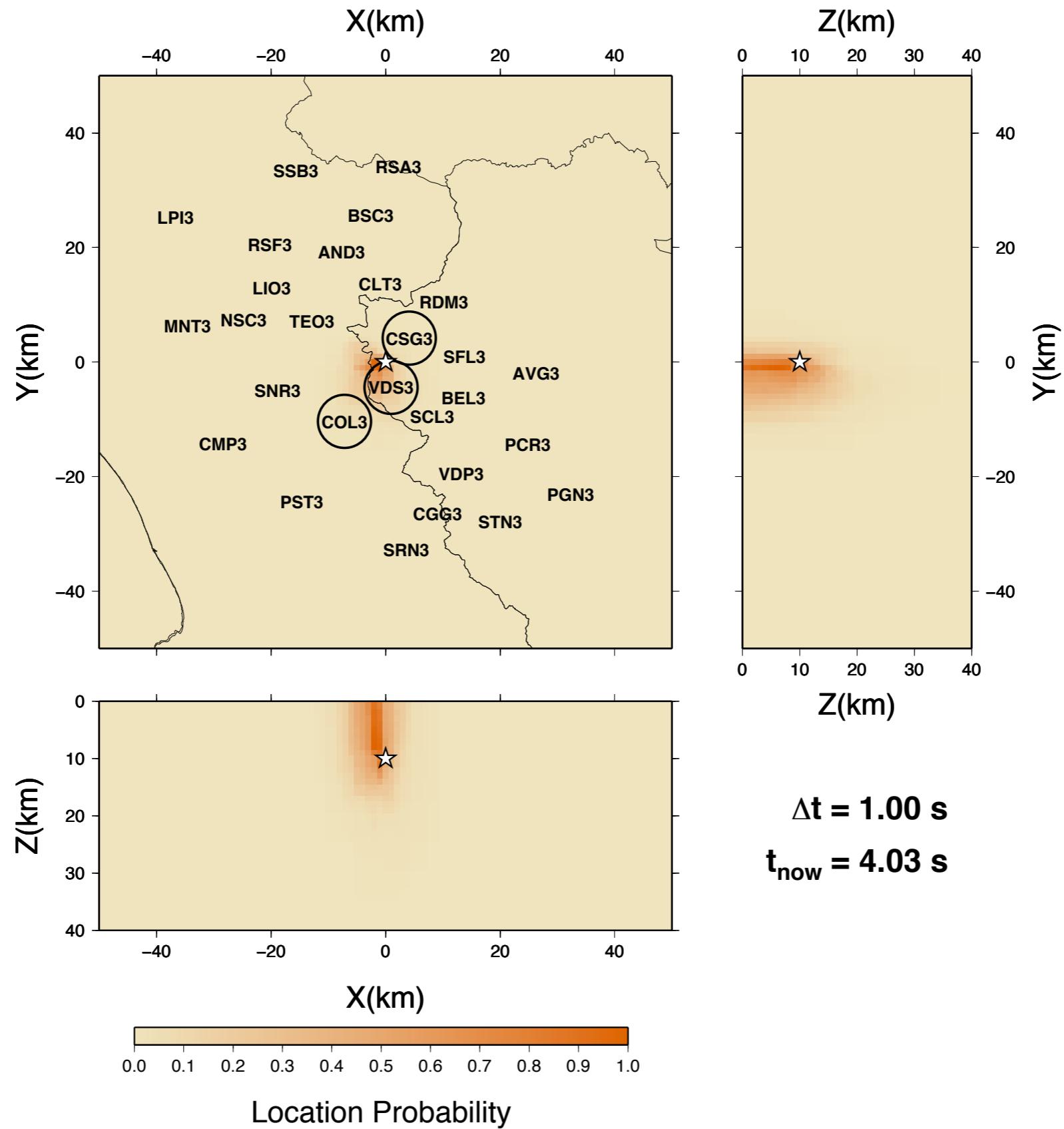
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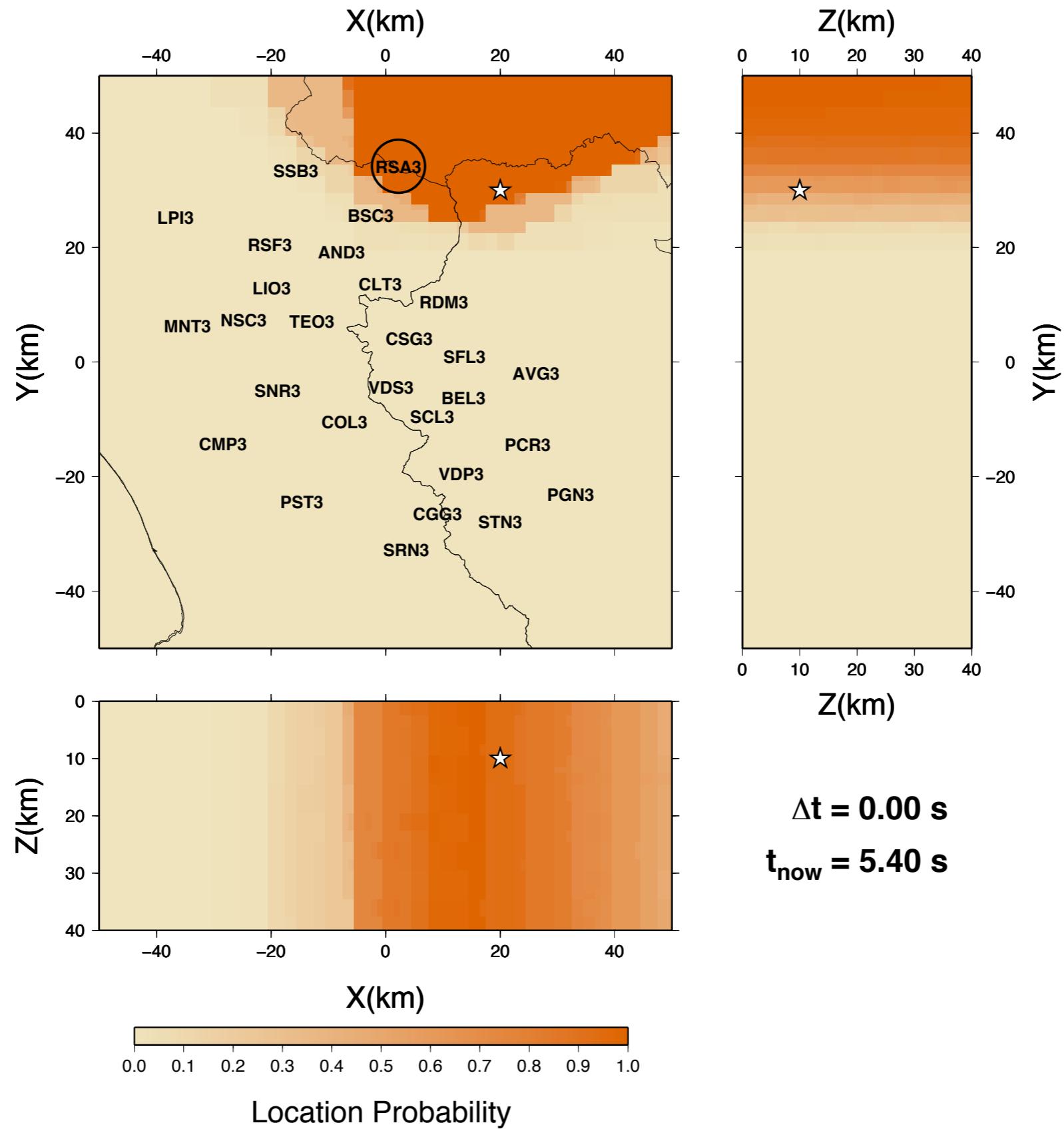
RTLoc test at the ISNet



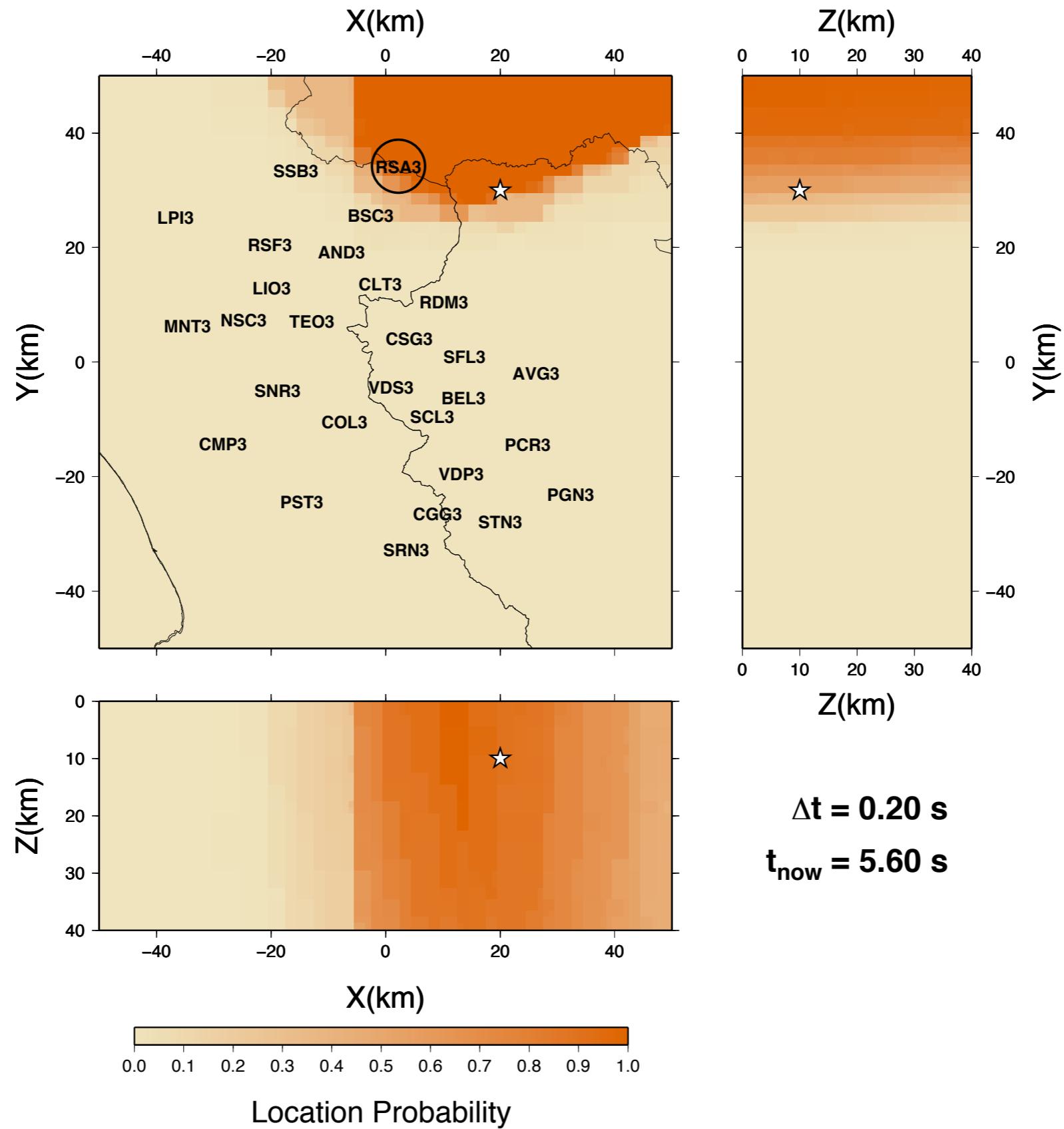
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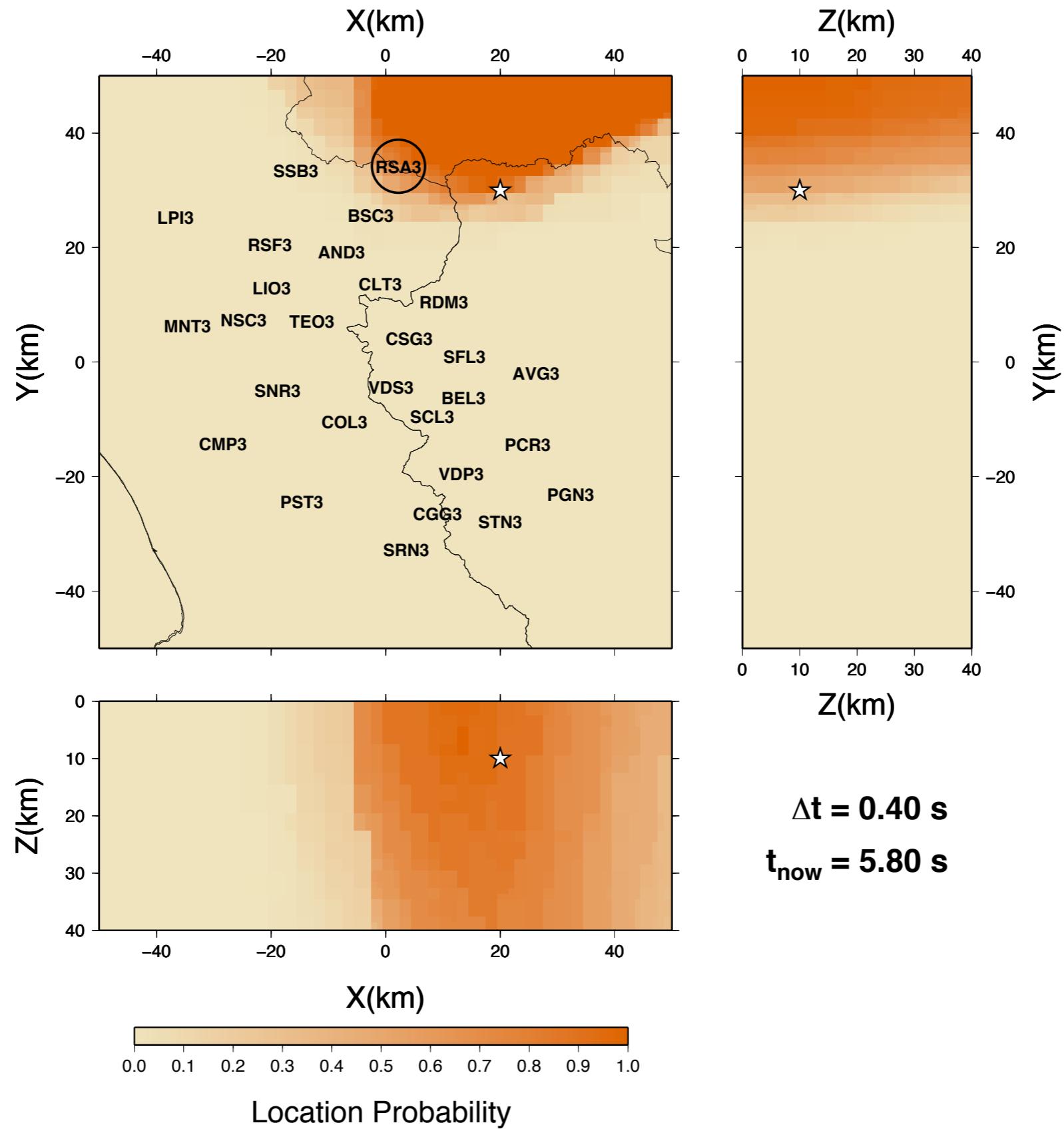
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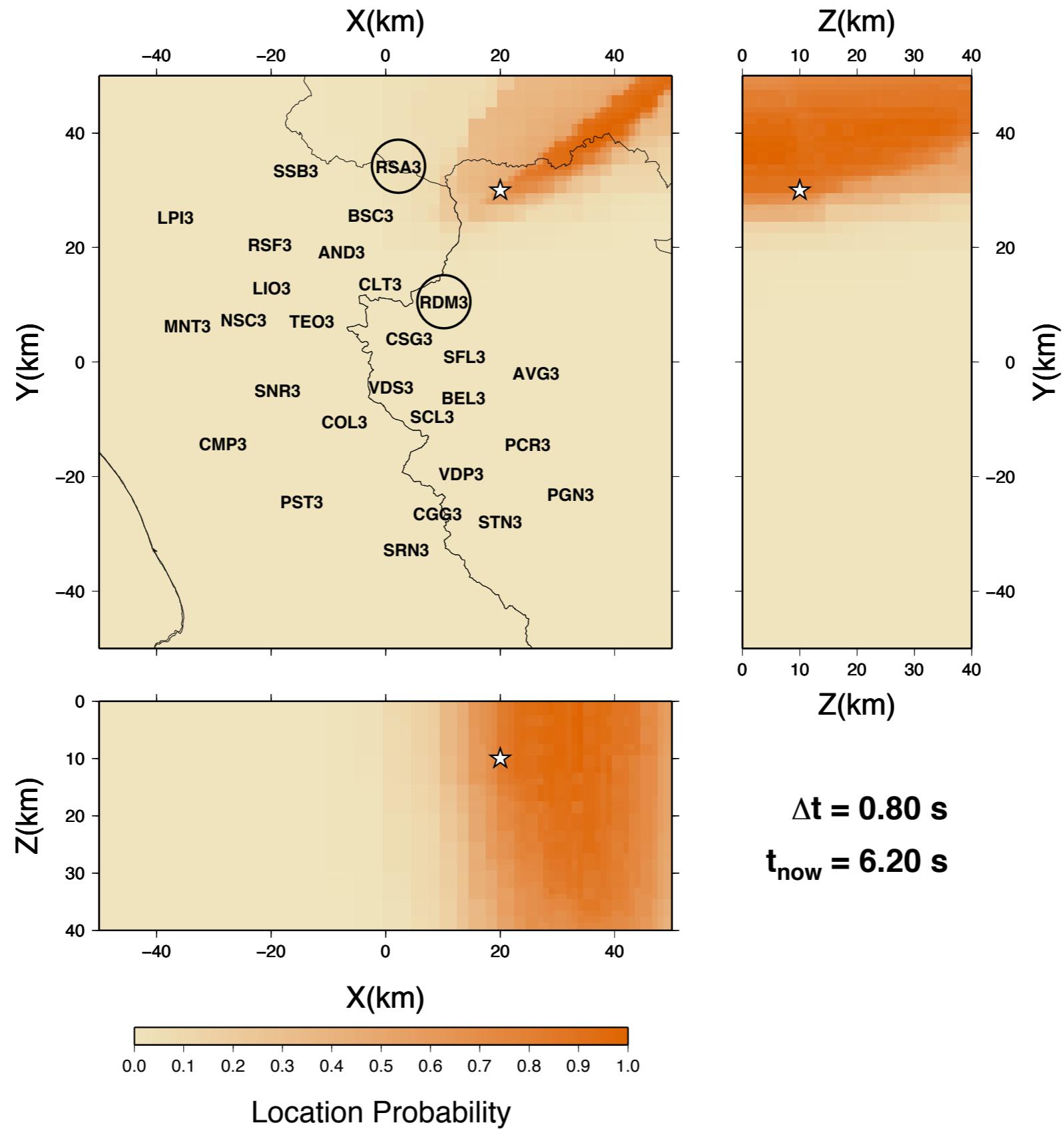
RTLoc test at the ISNet



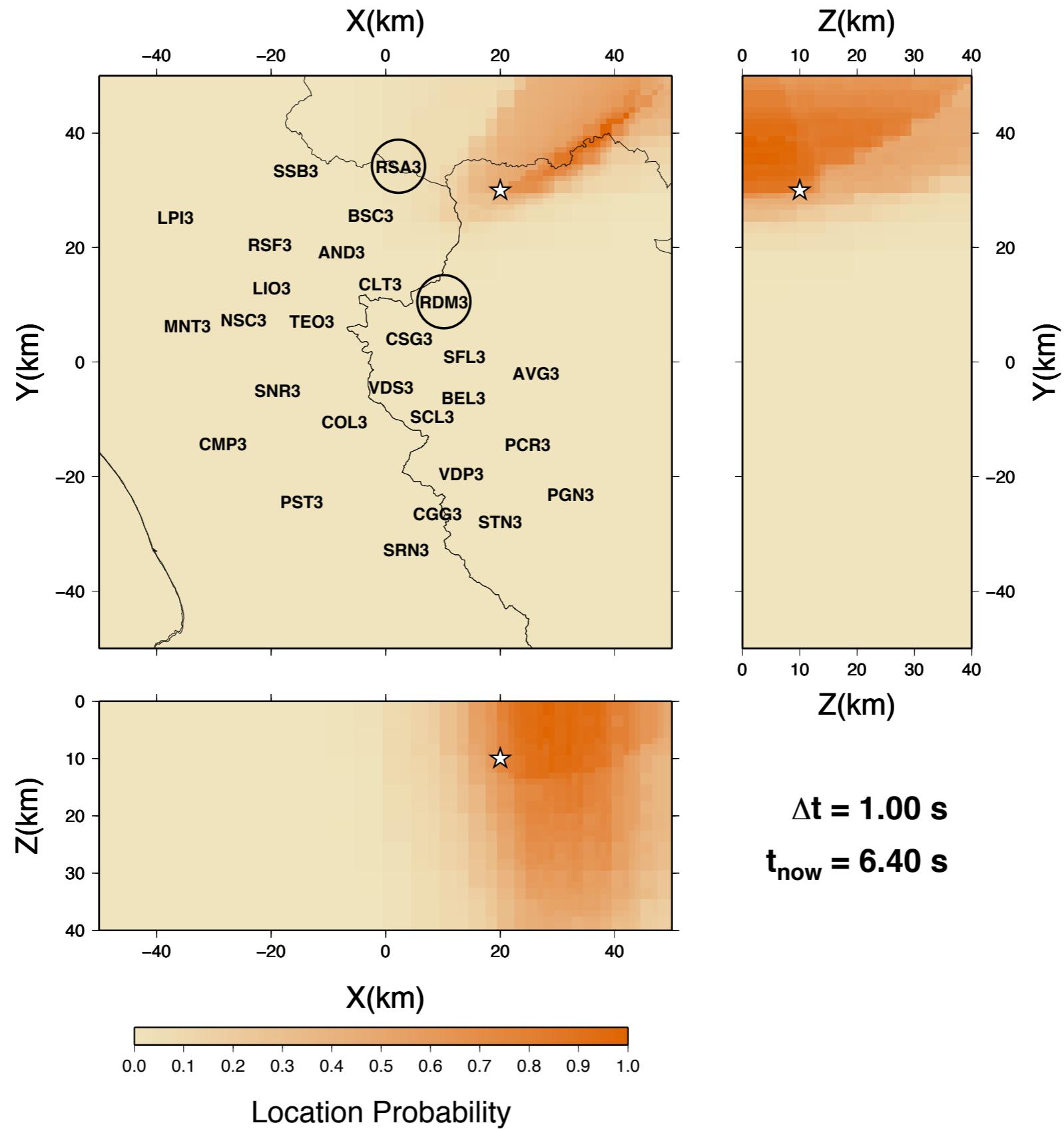
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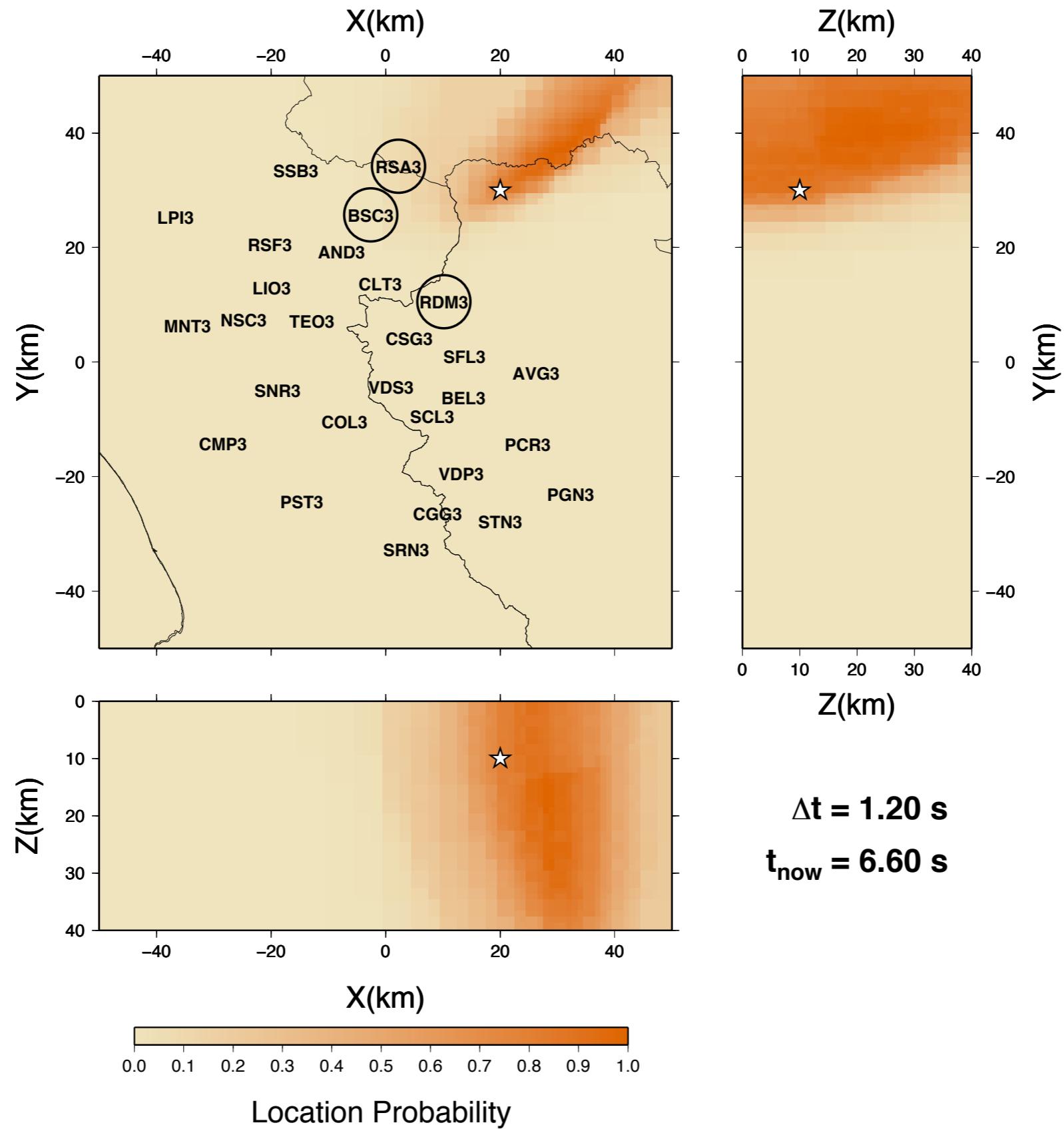
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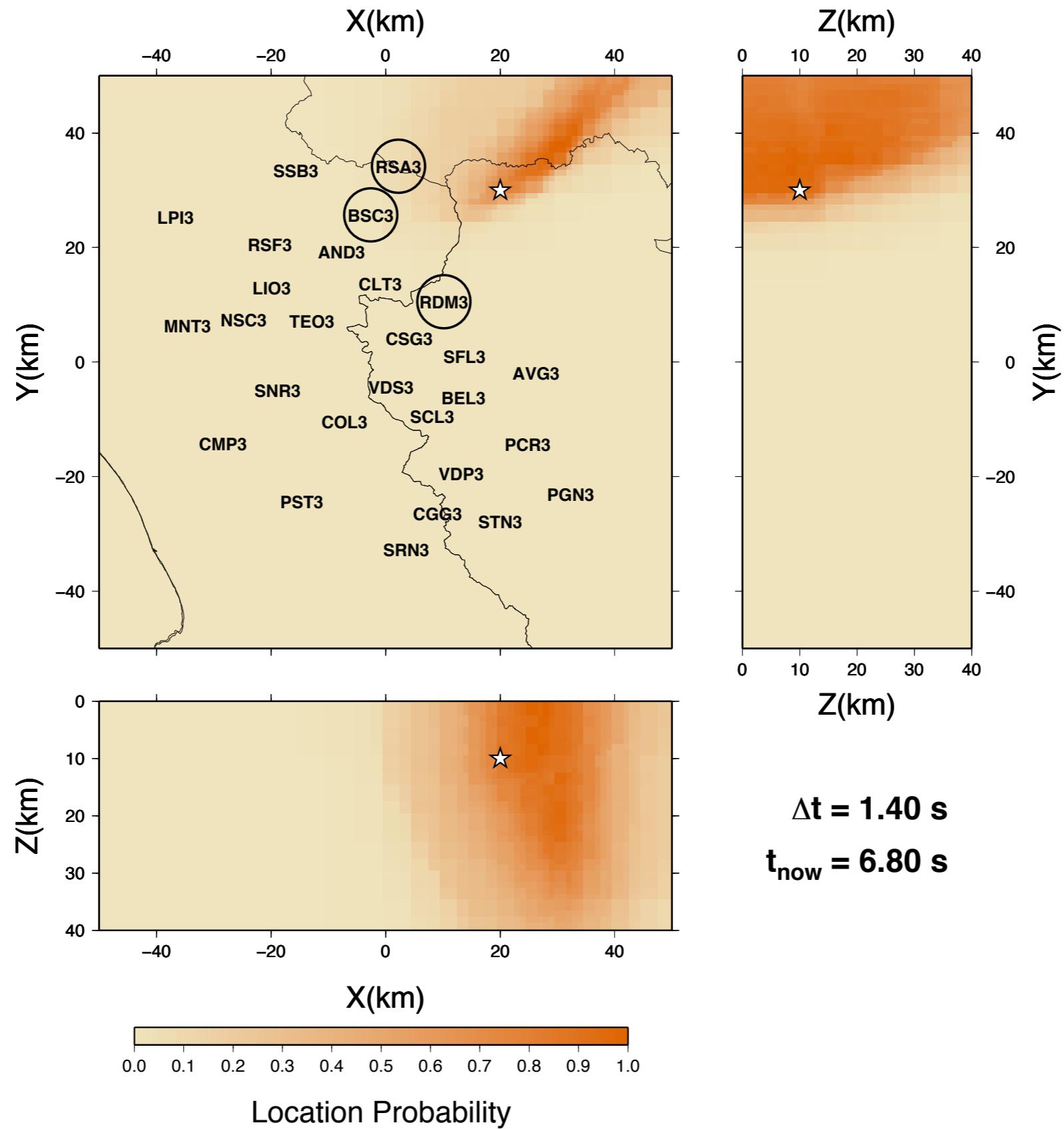
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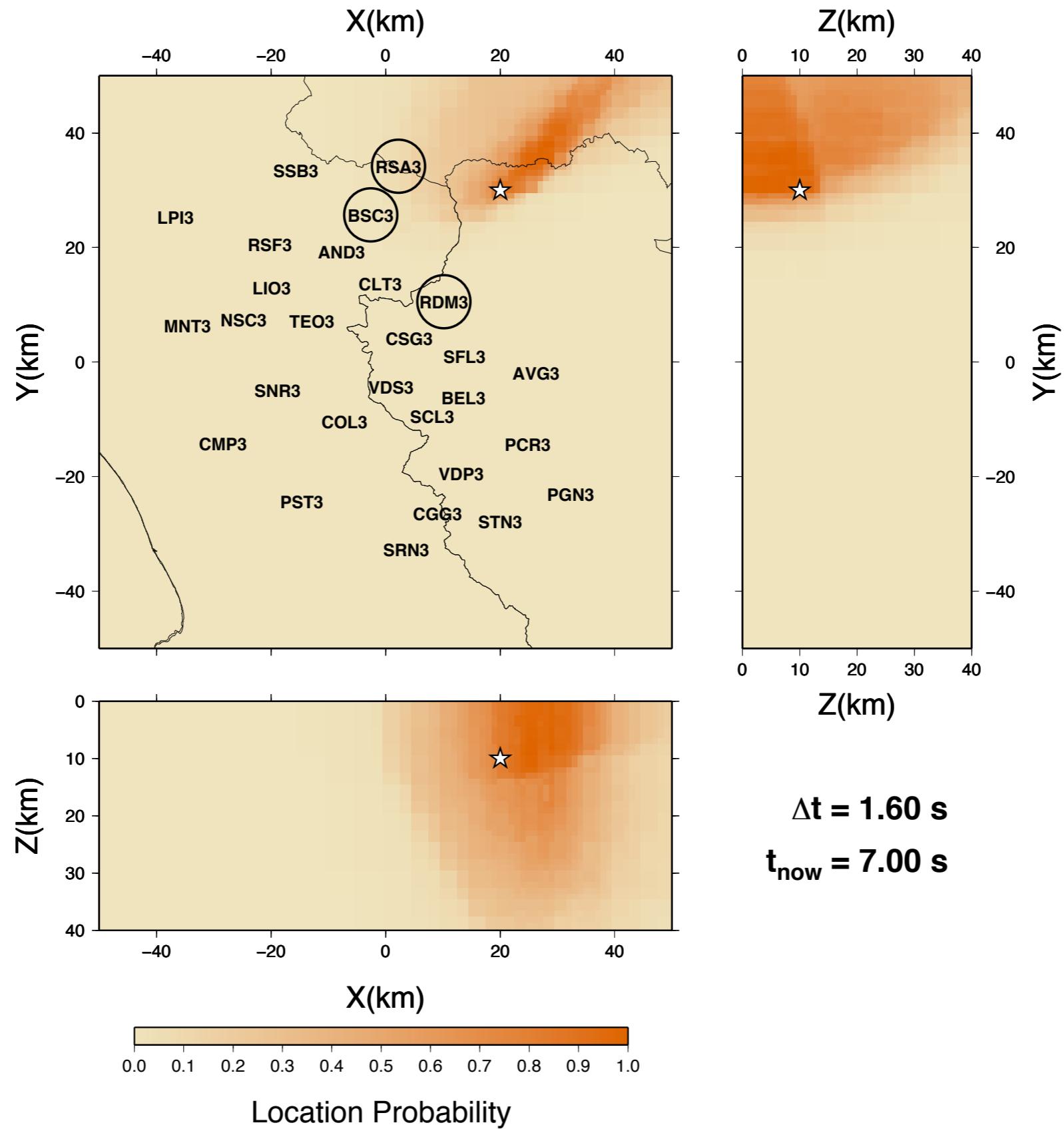
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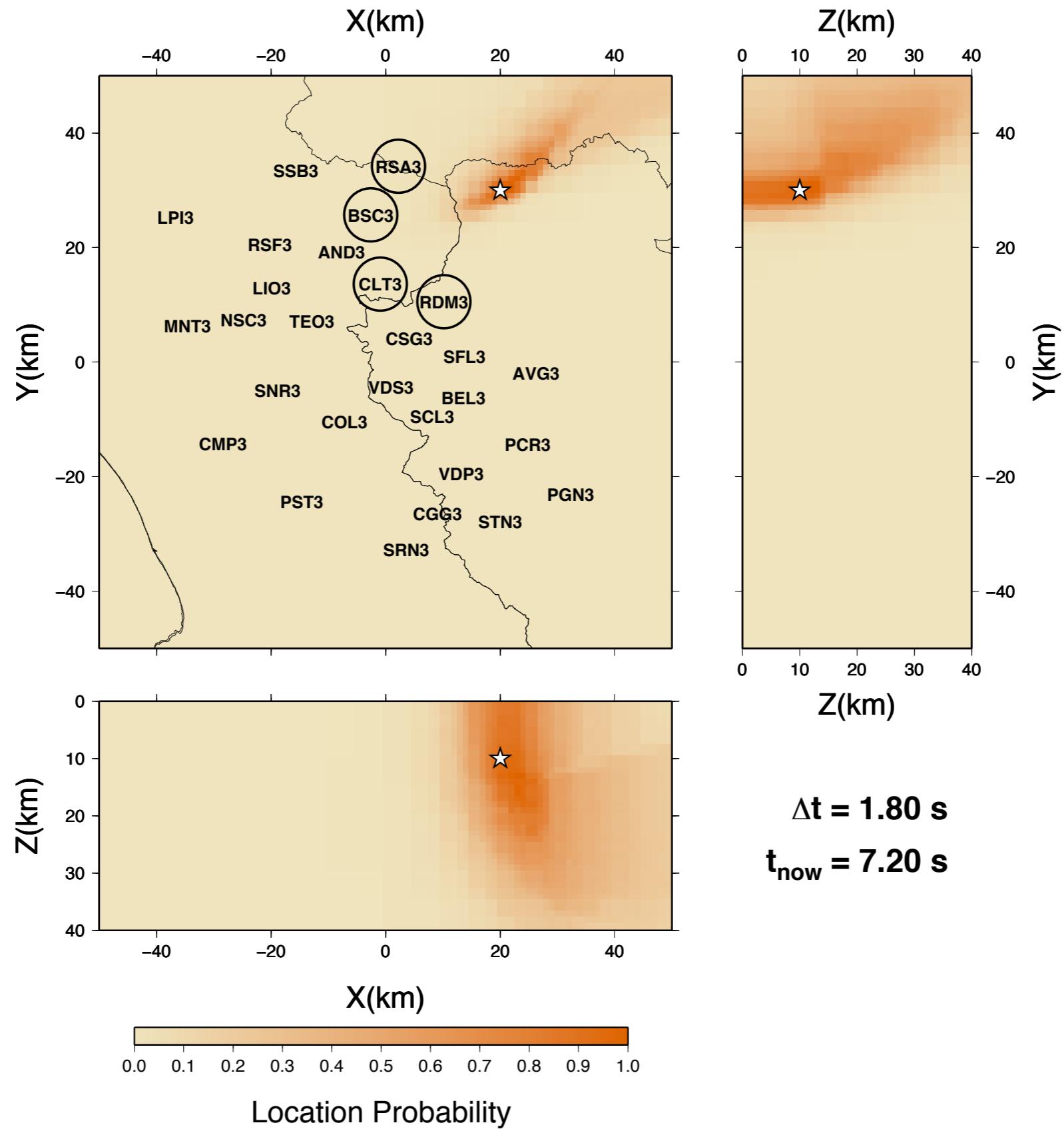
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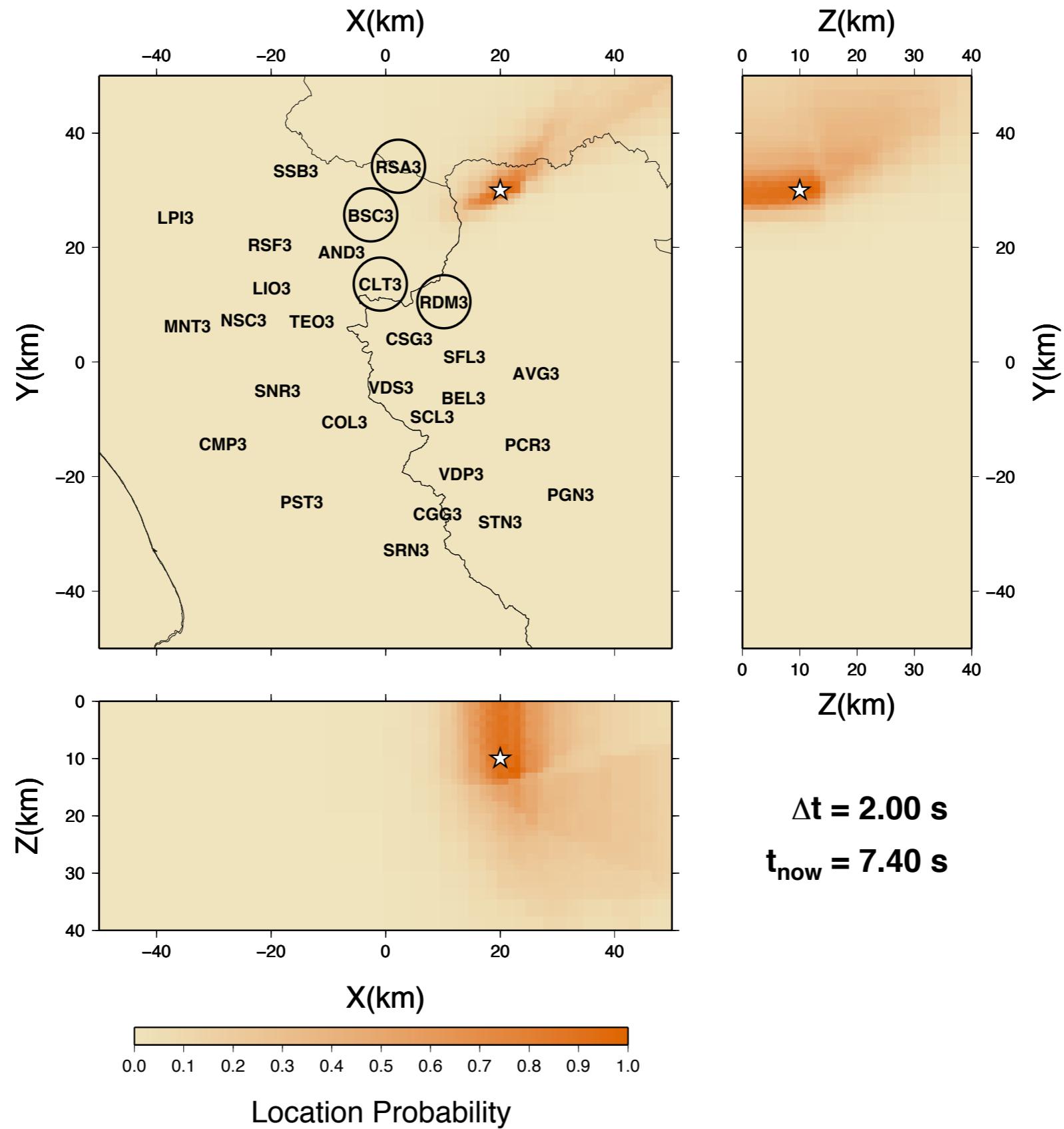
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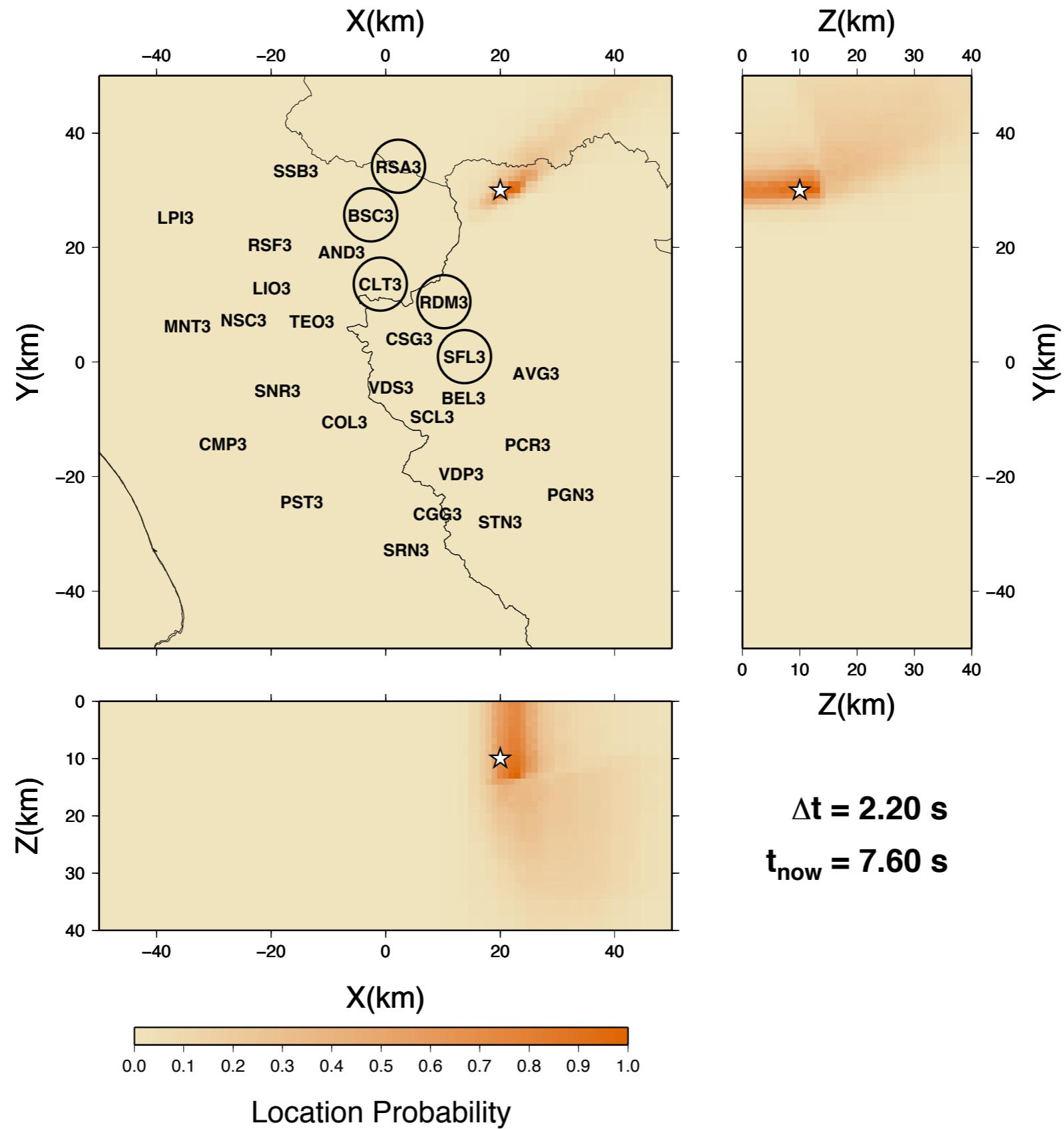
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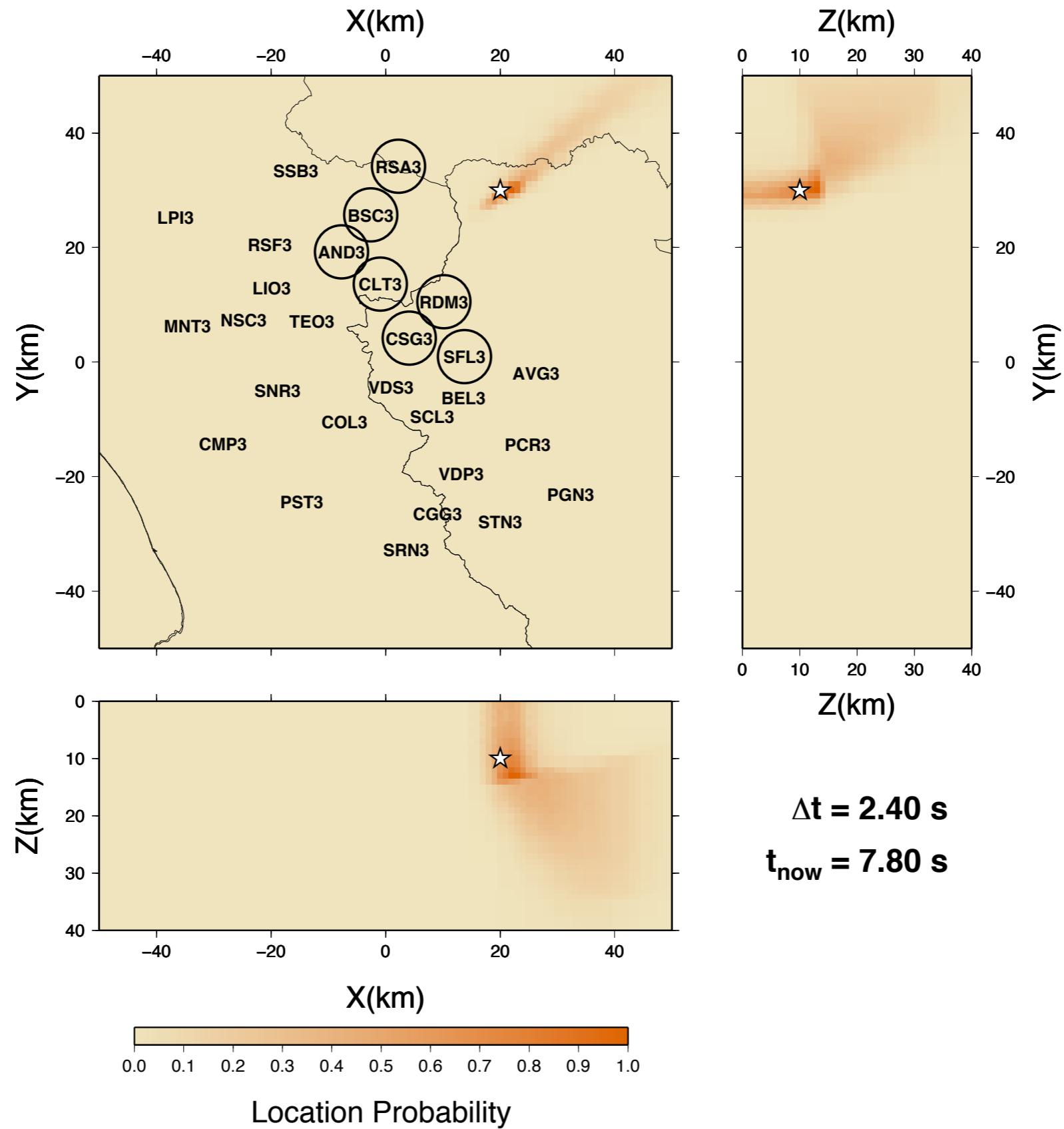
RTLoc test at the ISNet



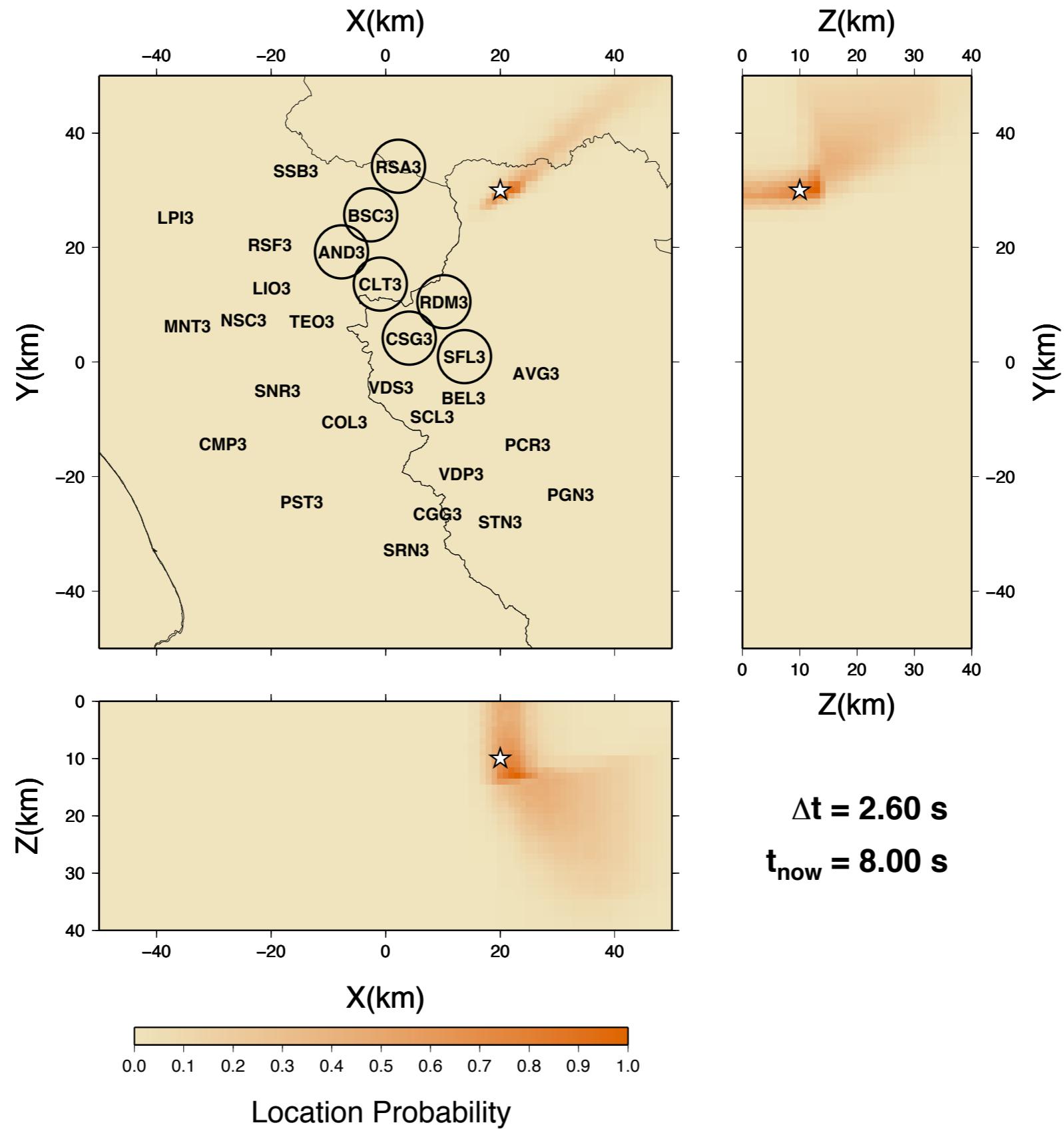
RTLoc test at the ISNet



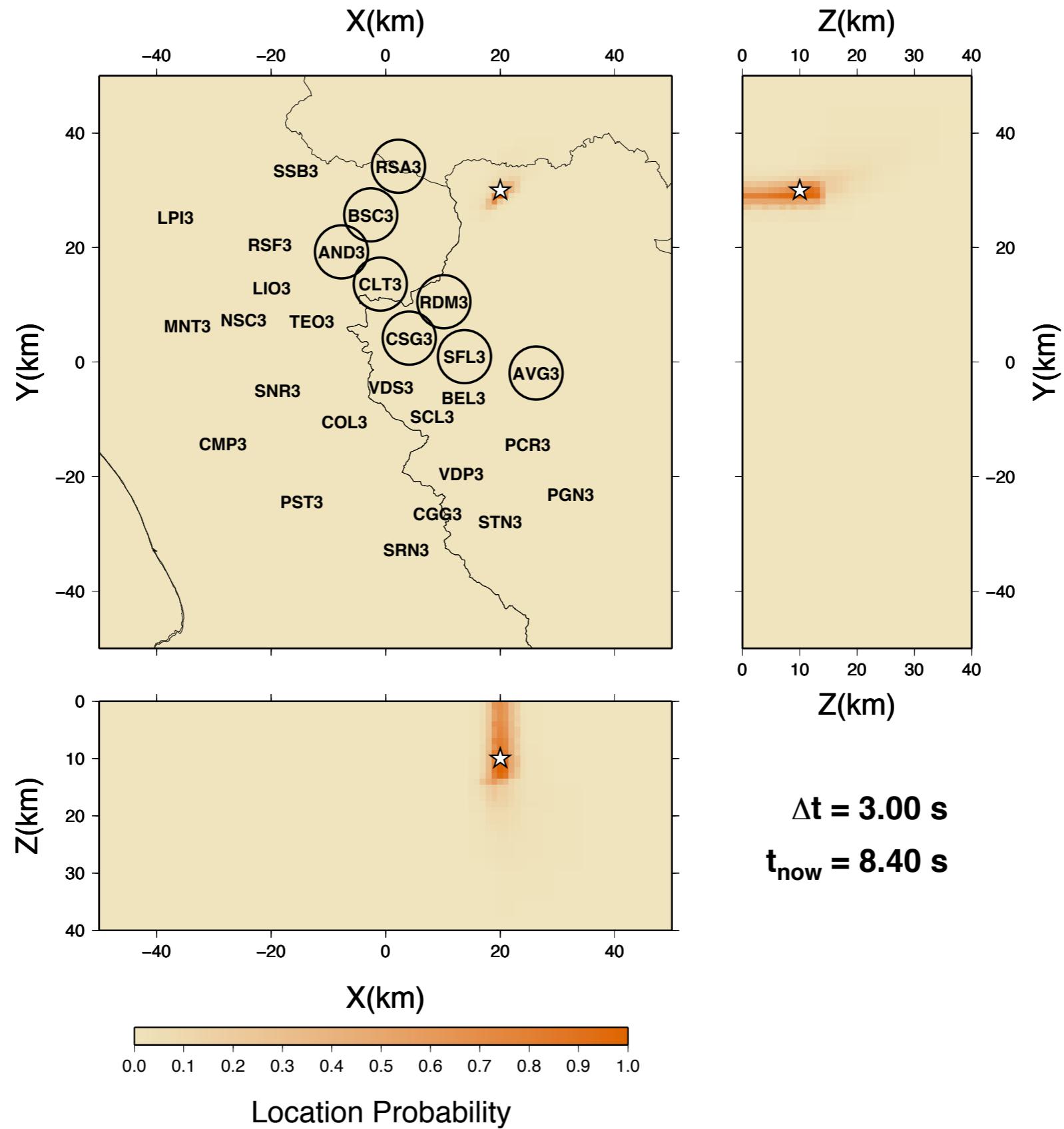
RTLoc test at the ISNet



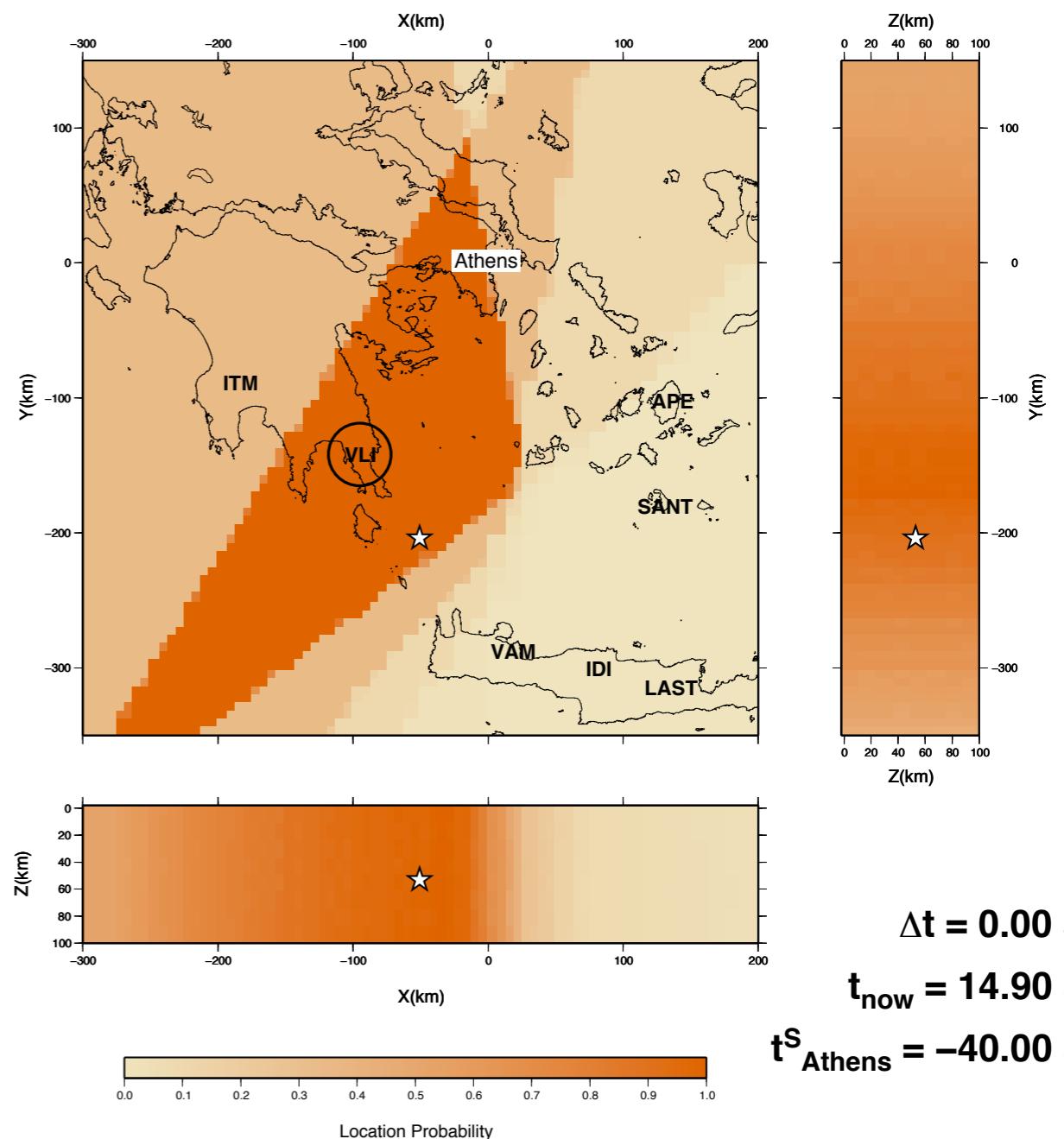
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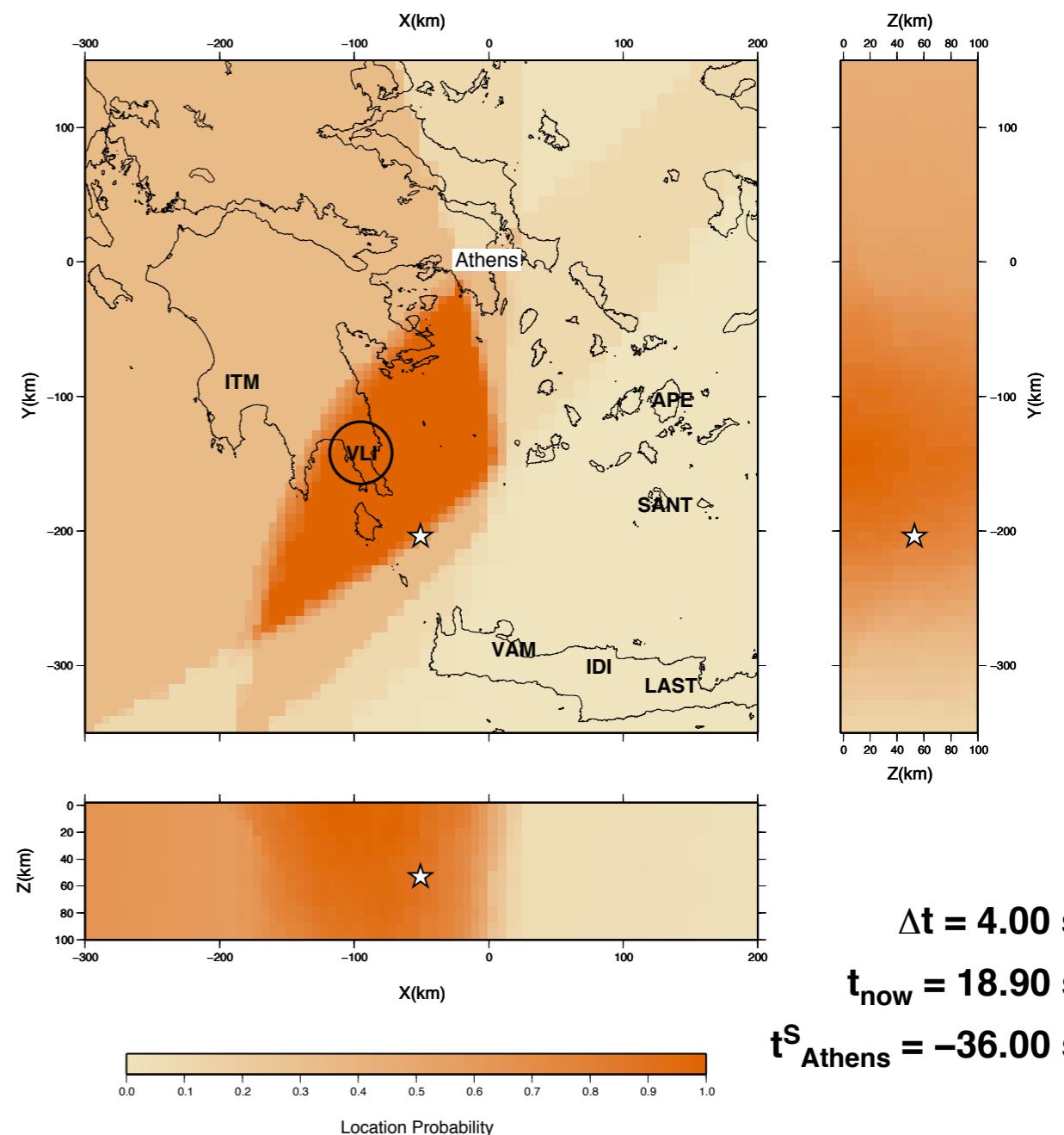


Magnitude 6.8 - SOUTHERN GREECE, 2006 January 8 11:34:55 UTC



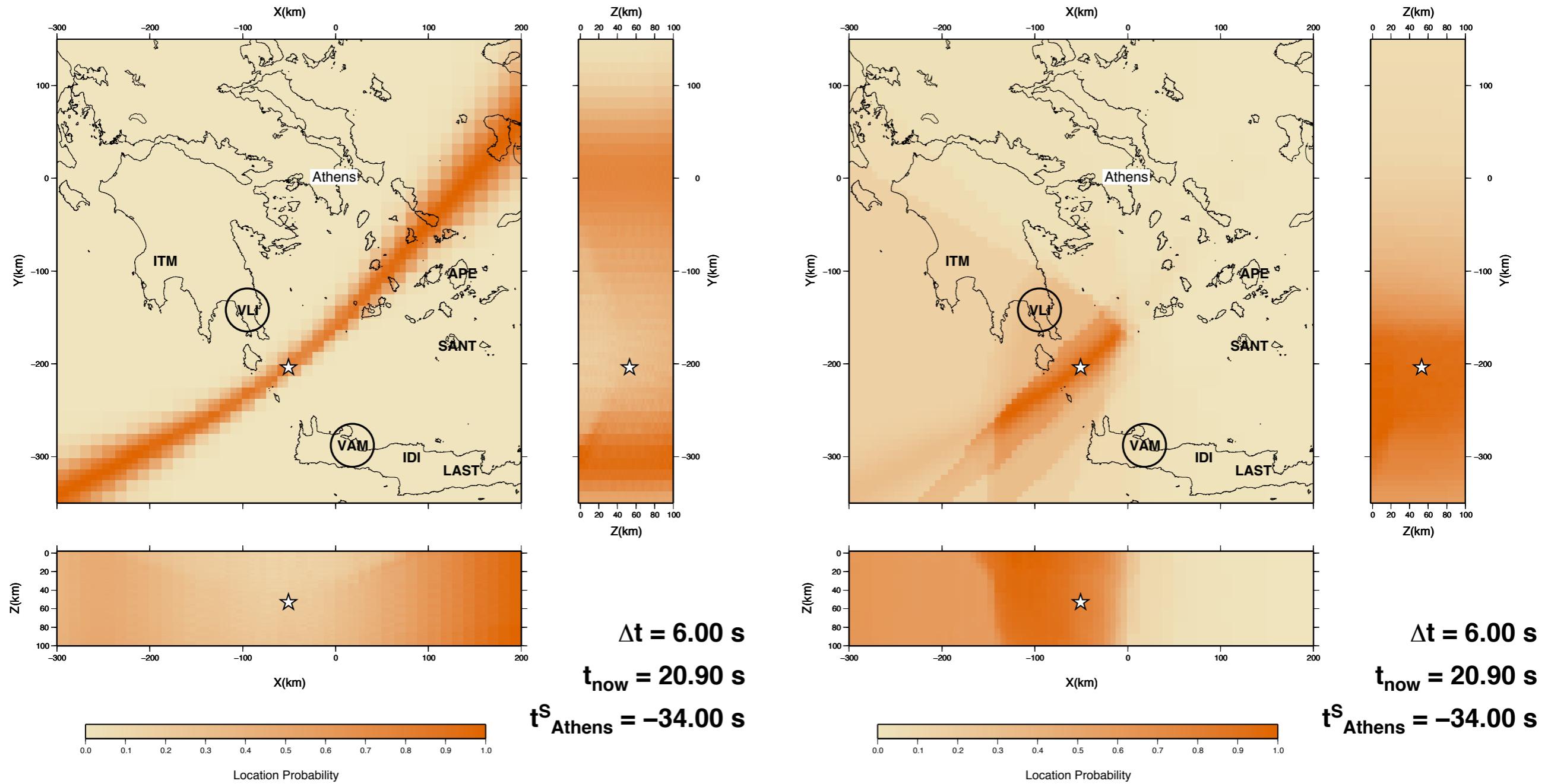
RTLoc

Magnitude 6.8 - SOUTHERN GREECE, 2006 January 8 11:34:55 UTC



RTLoc

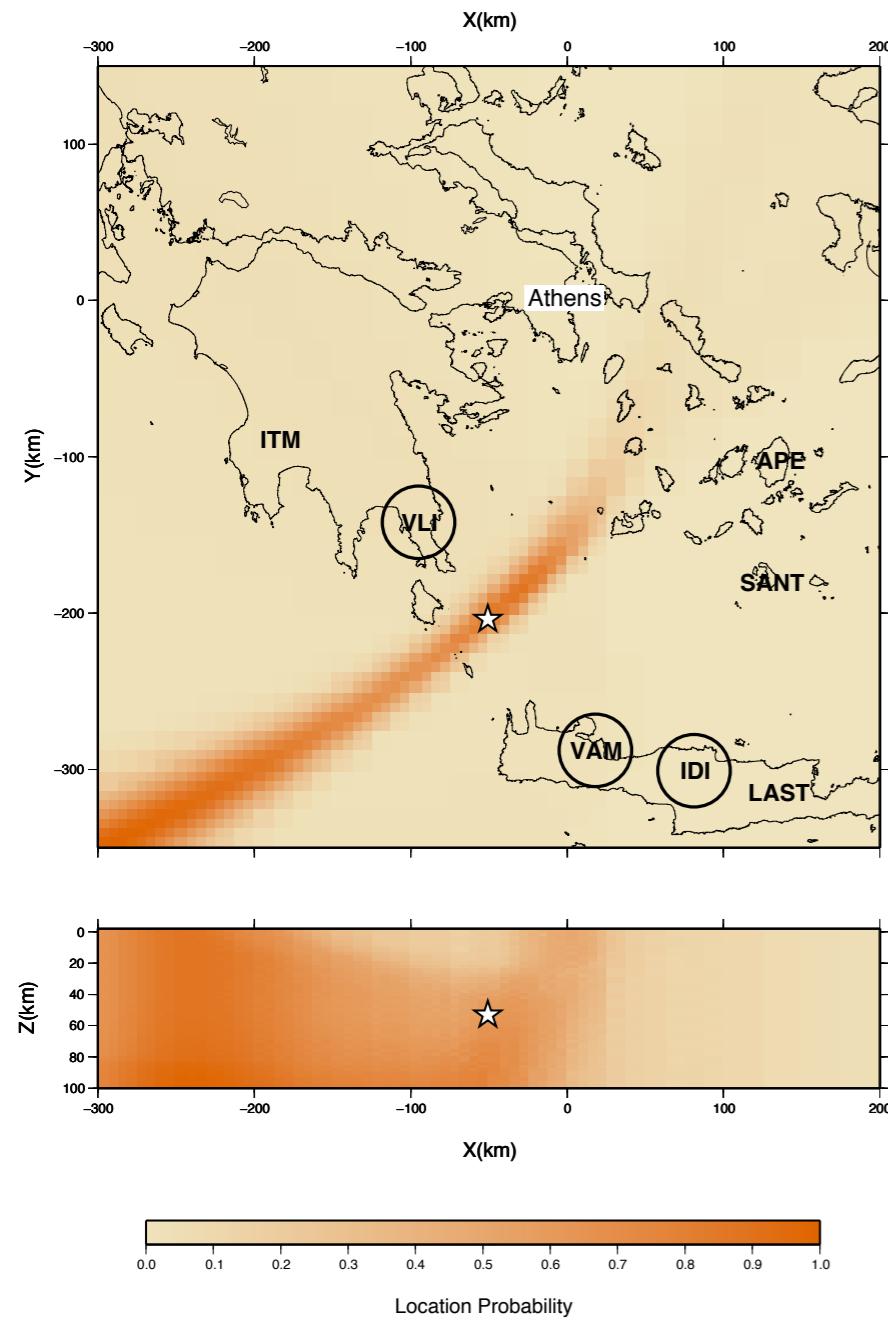
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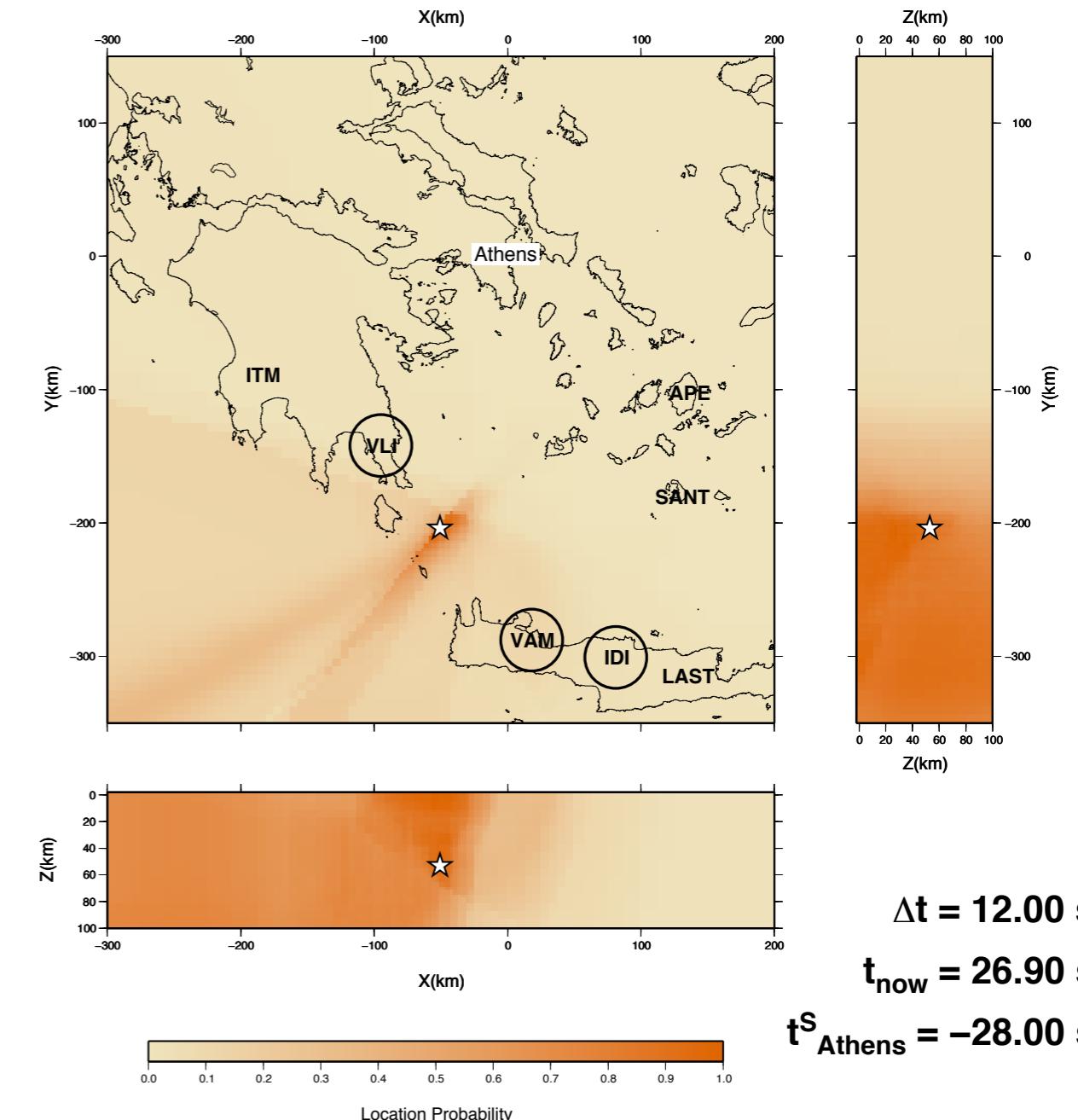
NLLoc
Lomax, et al., 2000

C. Satriano - 2007/07/11

Magnitude 6.8 - SOUTHERN GREECE, 2006 January 8 11:34:55 UTC

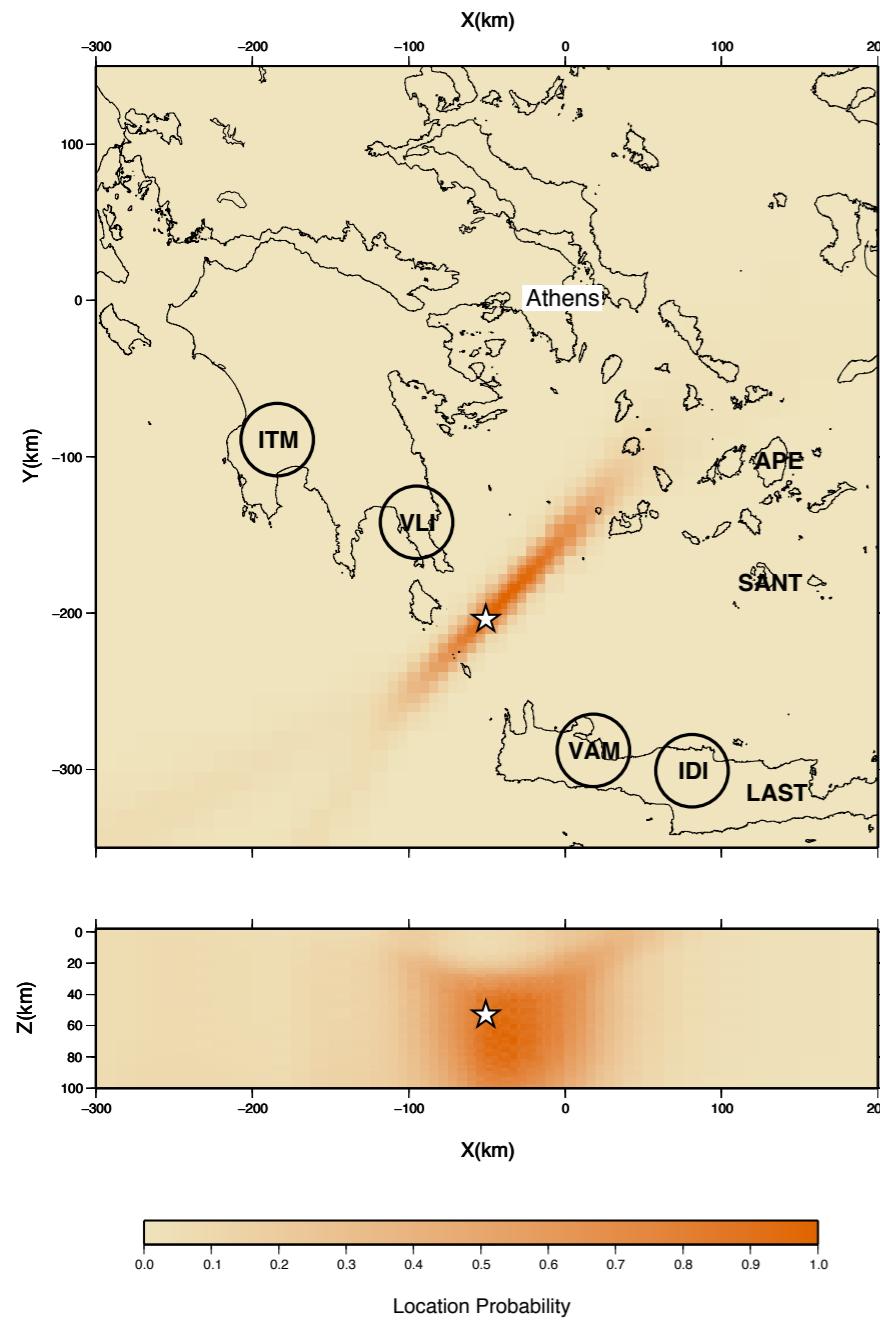


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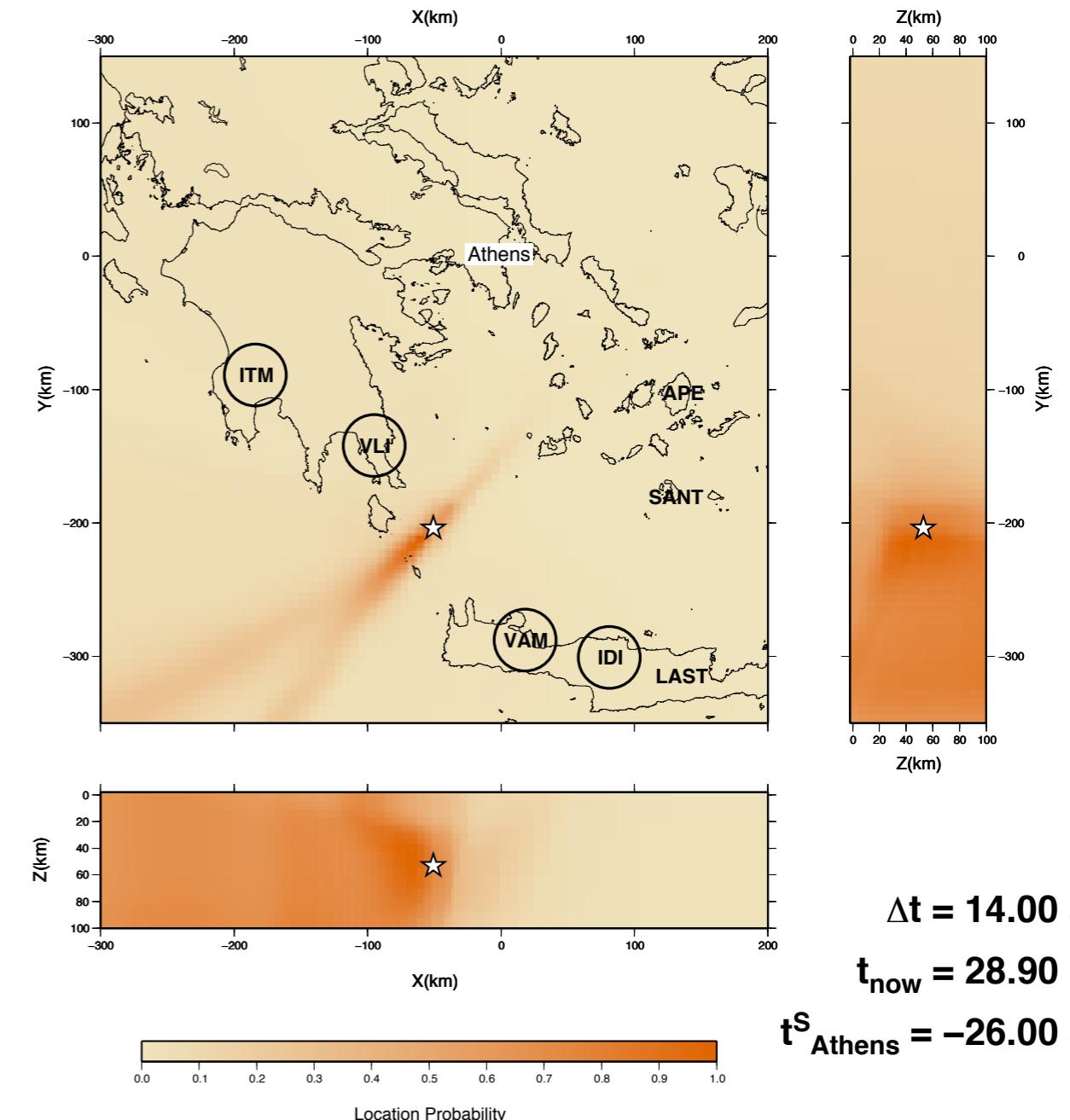
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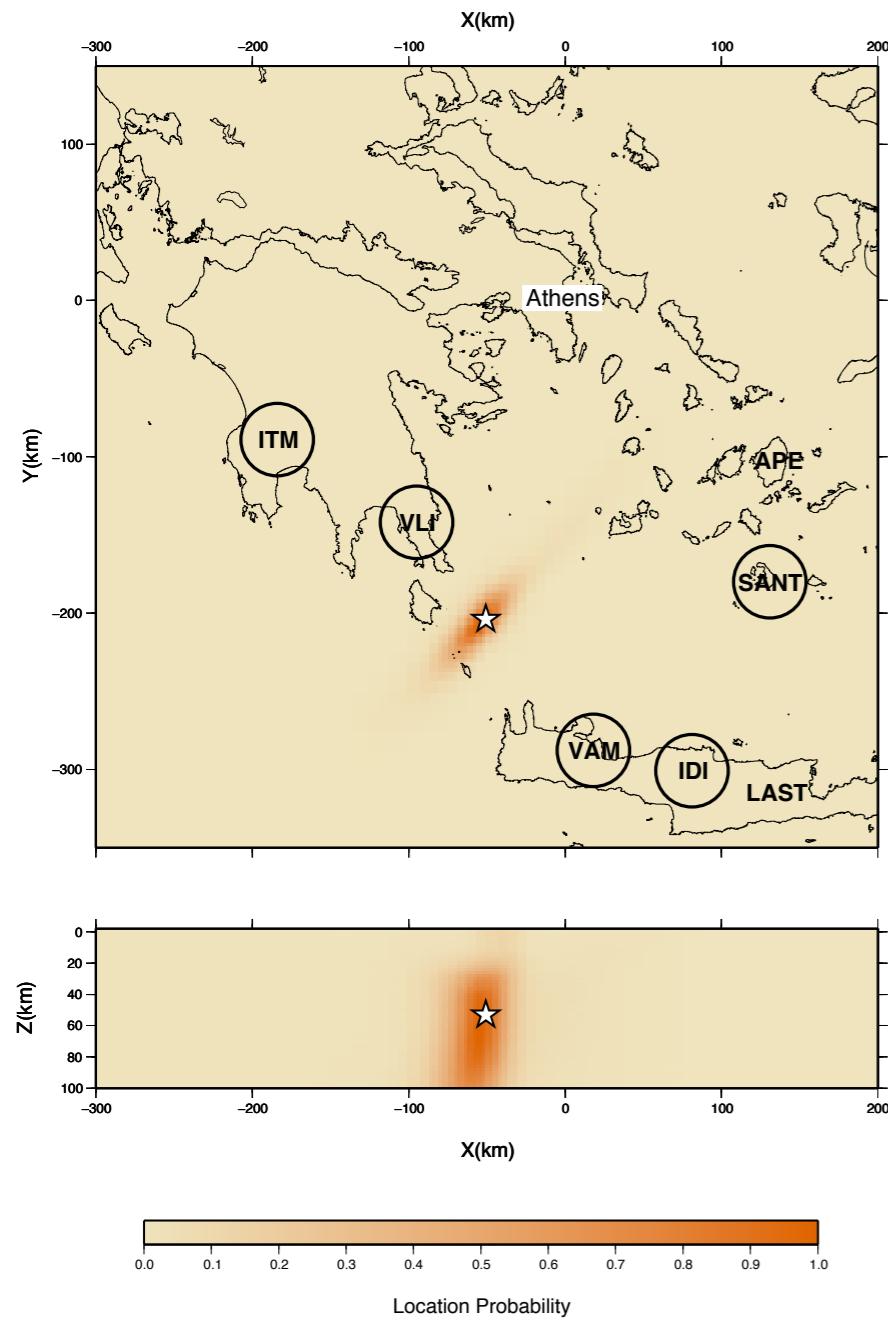
$\Delta t = 14.00 \text{ s}$
 $t_{\text{now}} = 28.90 \text{ s}$
 $t_{\text{Athens}}^S = -26.00 \text{ s}$

NLLoc

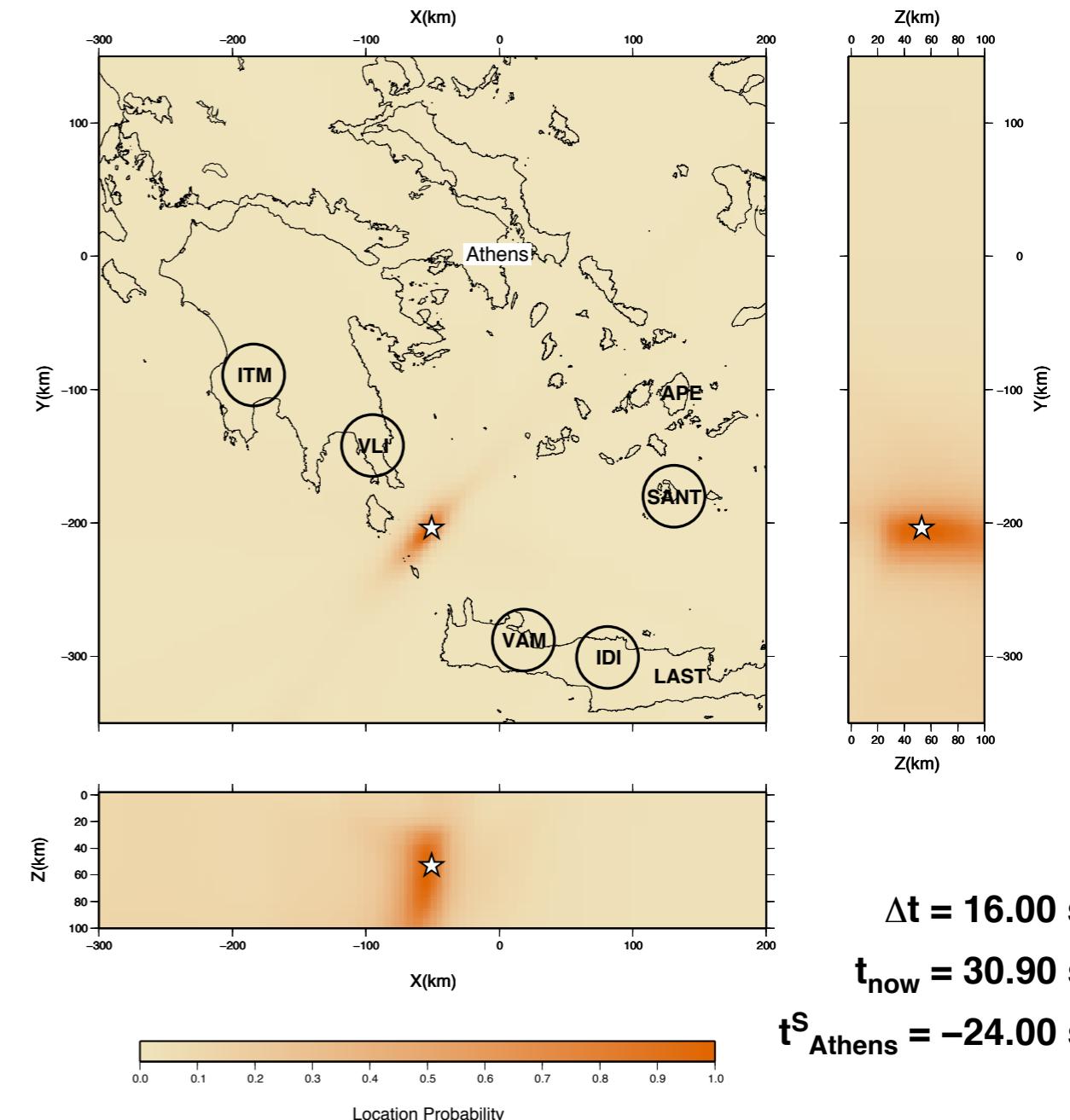


RTLoc

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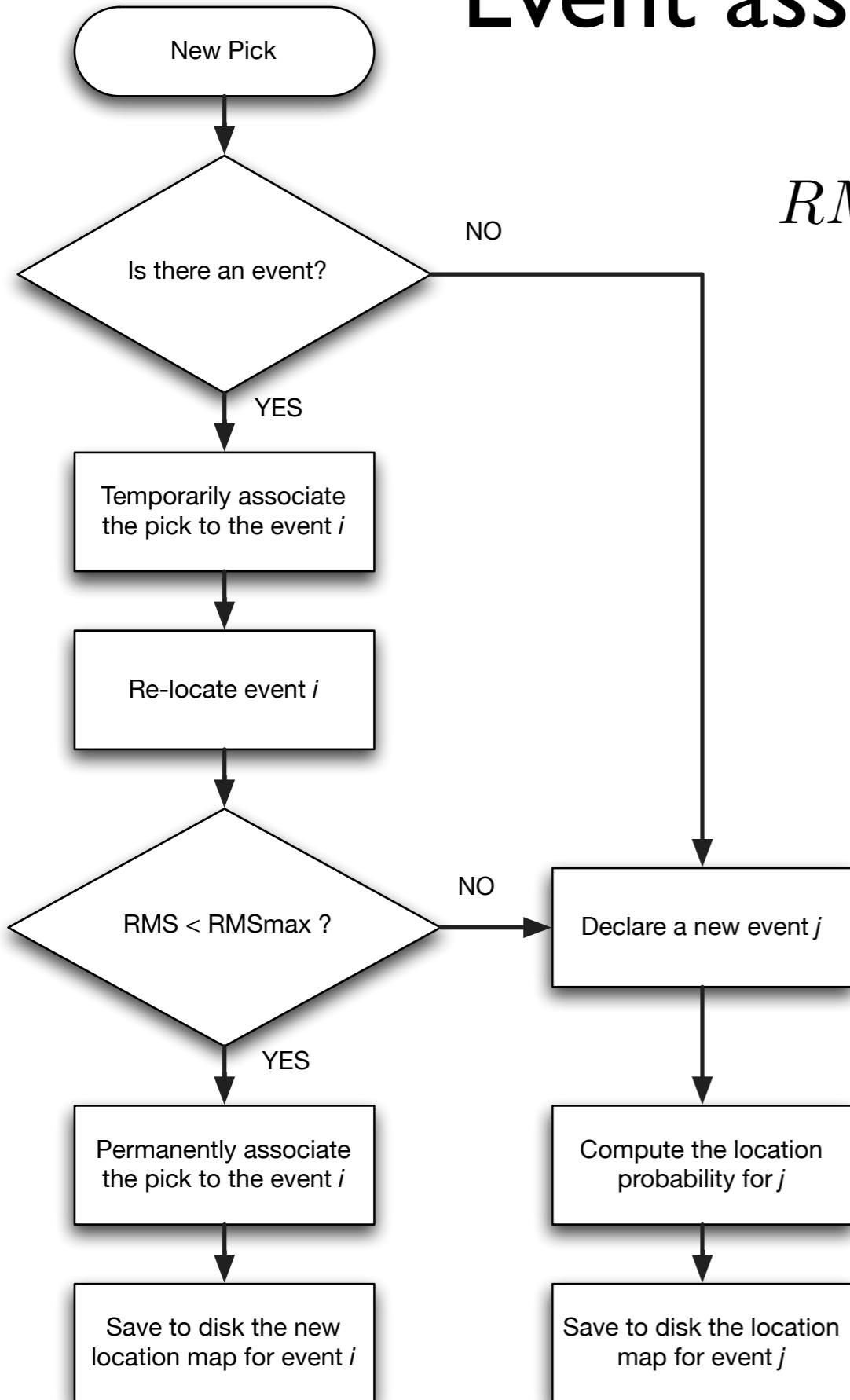
$\Delta t = 16.00 \text{ s}$
 $t_{\text{now}} = 30.90 \text{ s}$
 $t_{\text{Athens}}^S = -24.00 \text{ s}$



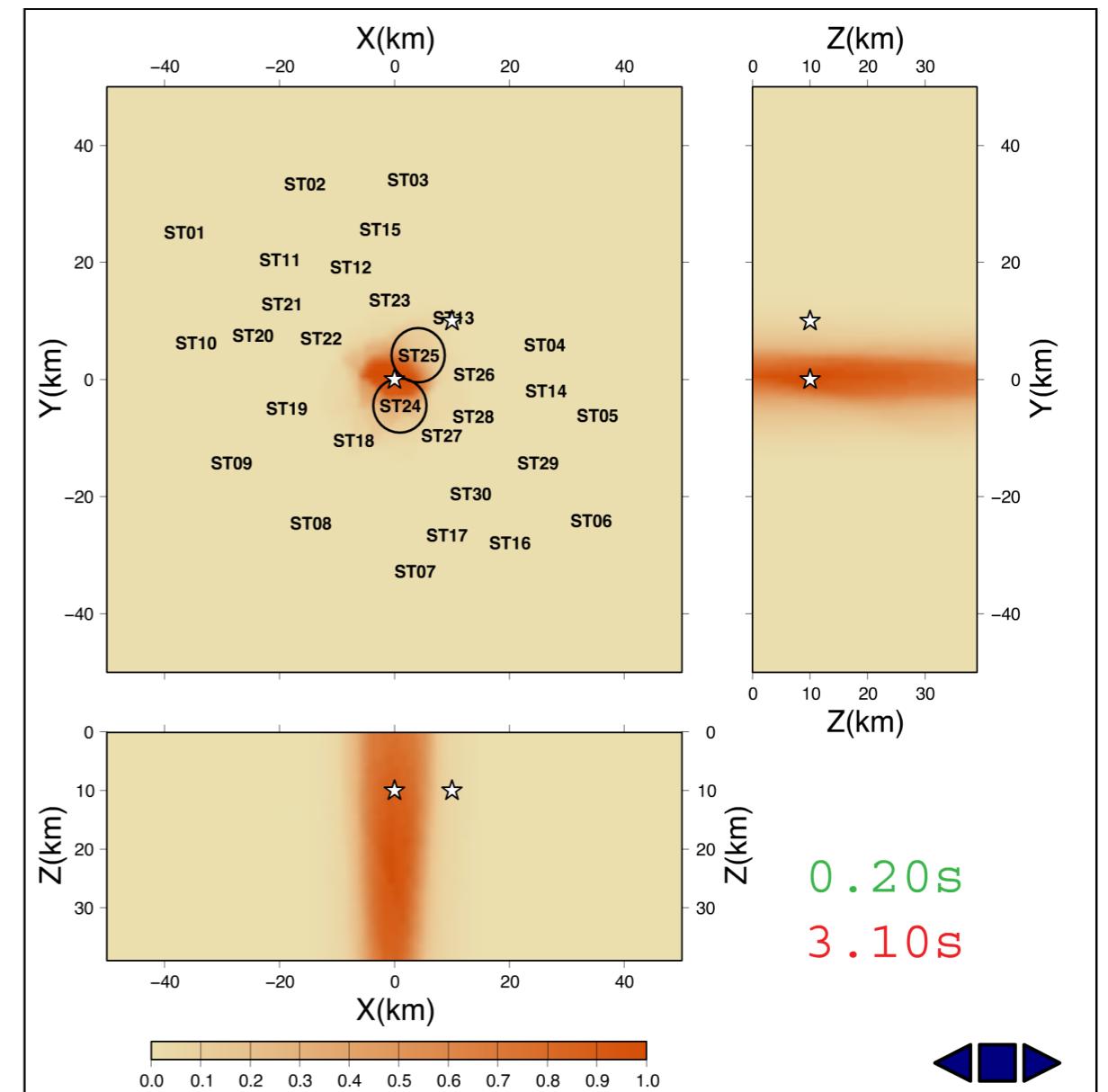
RTLoc

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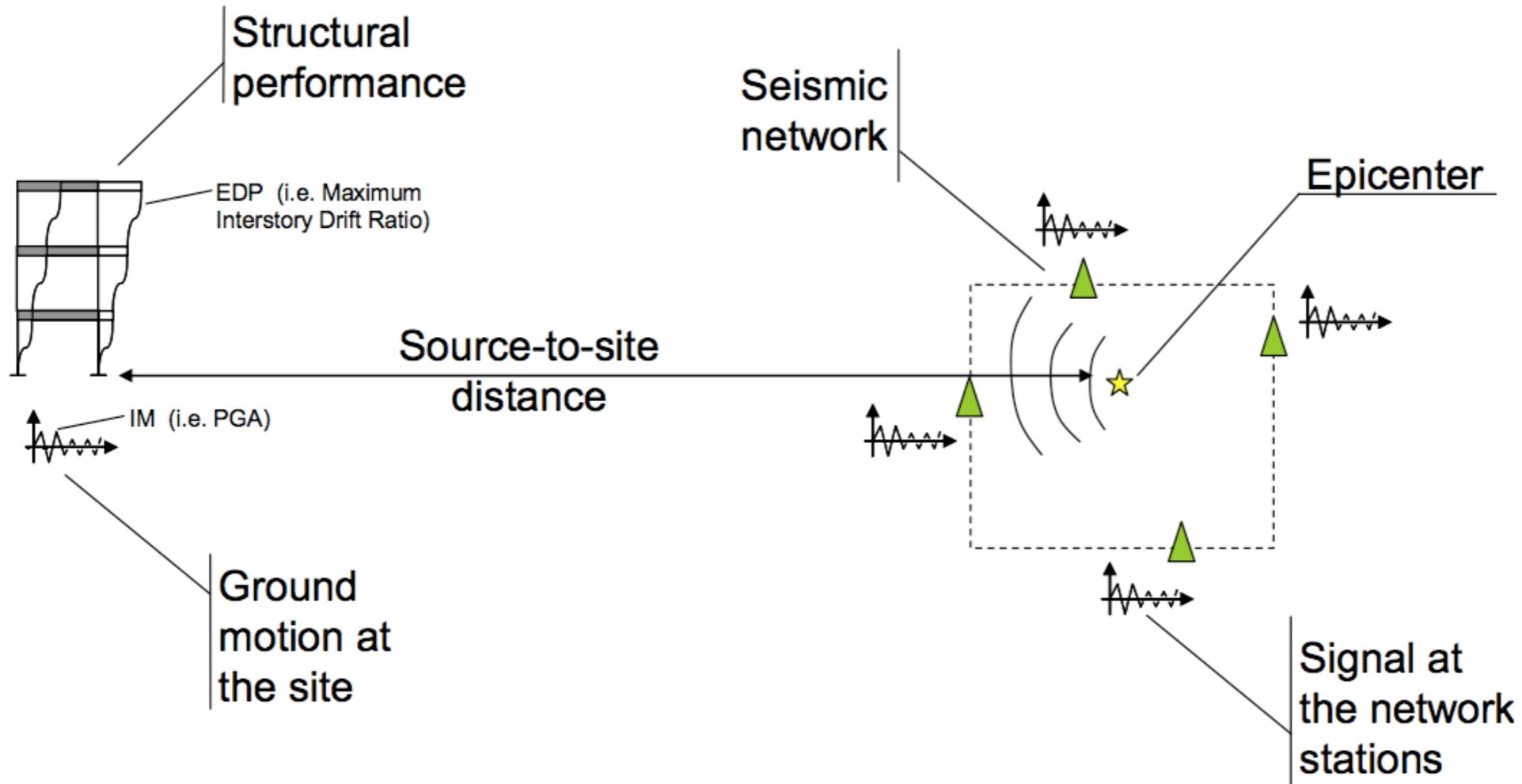
Event association (binding)



$$RMS_{Si} = \frac{1}{M} \sum_{j=1}^M [(tt_{Si} - tt_{Sj}) - (t_{Si} - t_{Sj})]^2$$

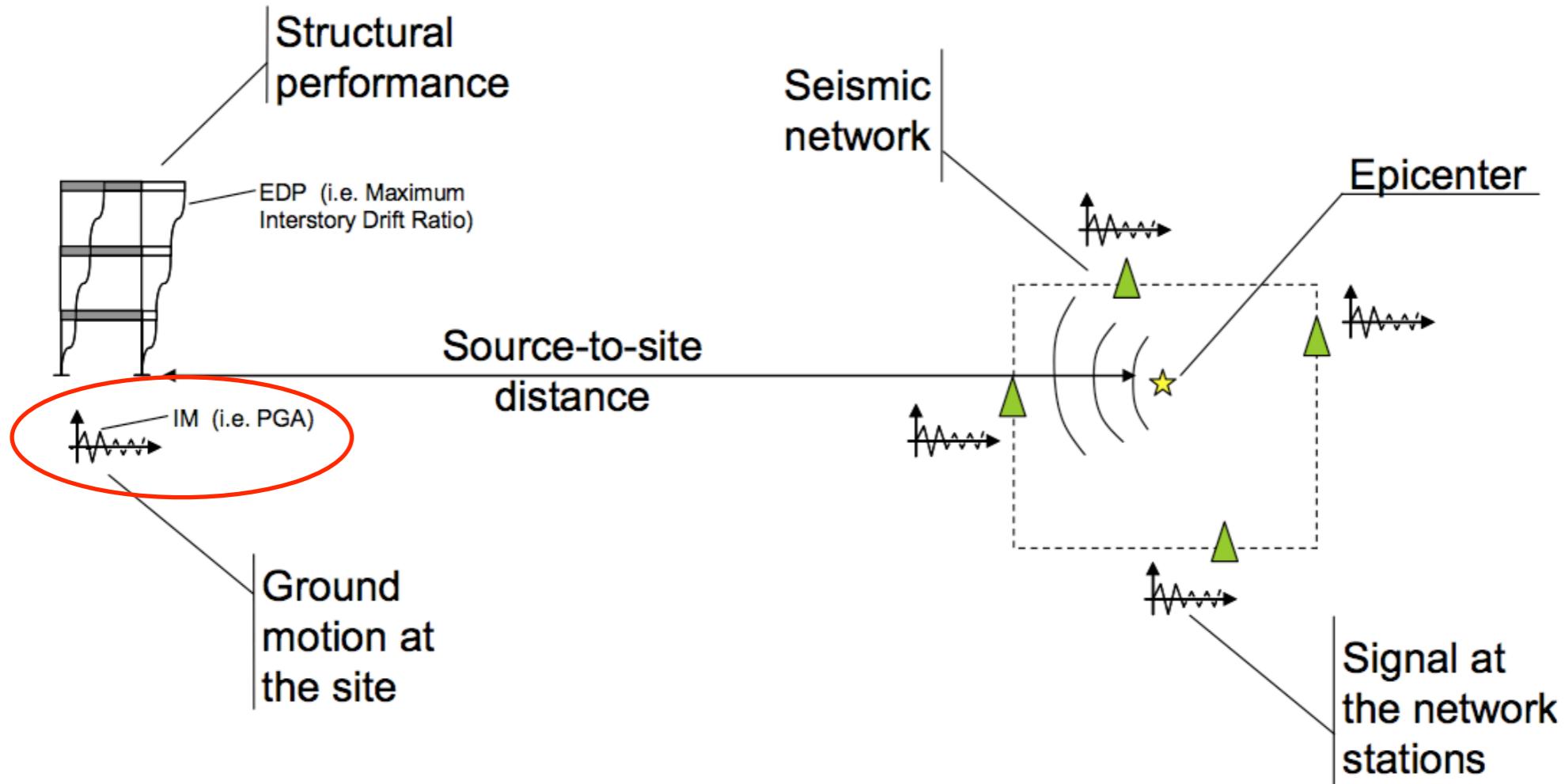


Real-Time Hazard Evaluation/Mitigation



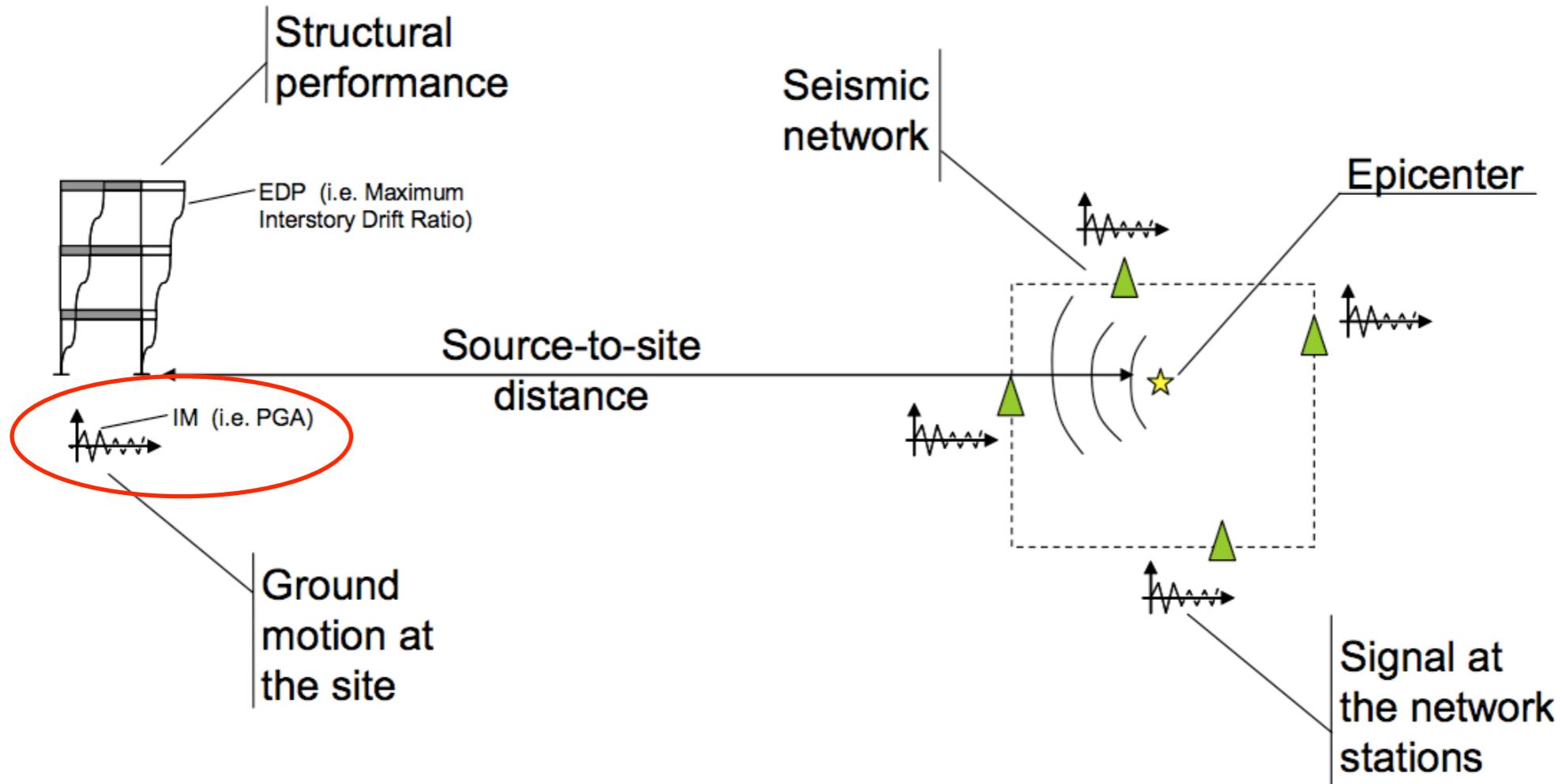
$$\hat{f}_{PGA}(pga) = \int_M \int_R f_{PGA|M,R}(pga|m, r) \hat{f}_M(m) \hat{f}_R(r) dm dr$$

Real-Time Hazard Evaluation/Mitigation



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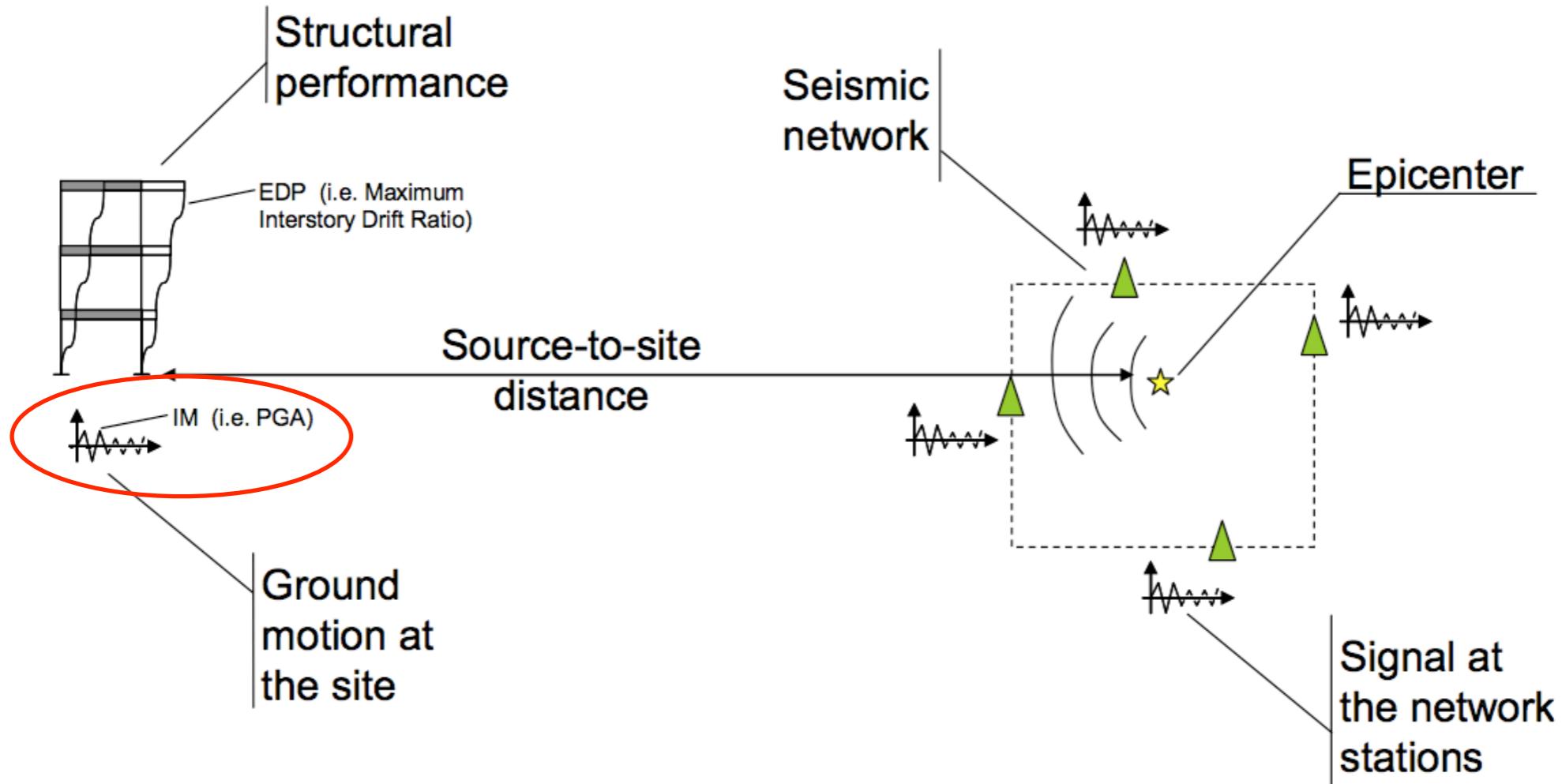
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EEW
(function of time)

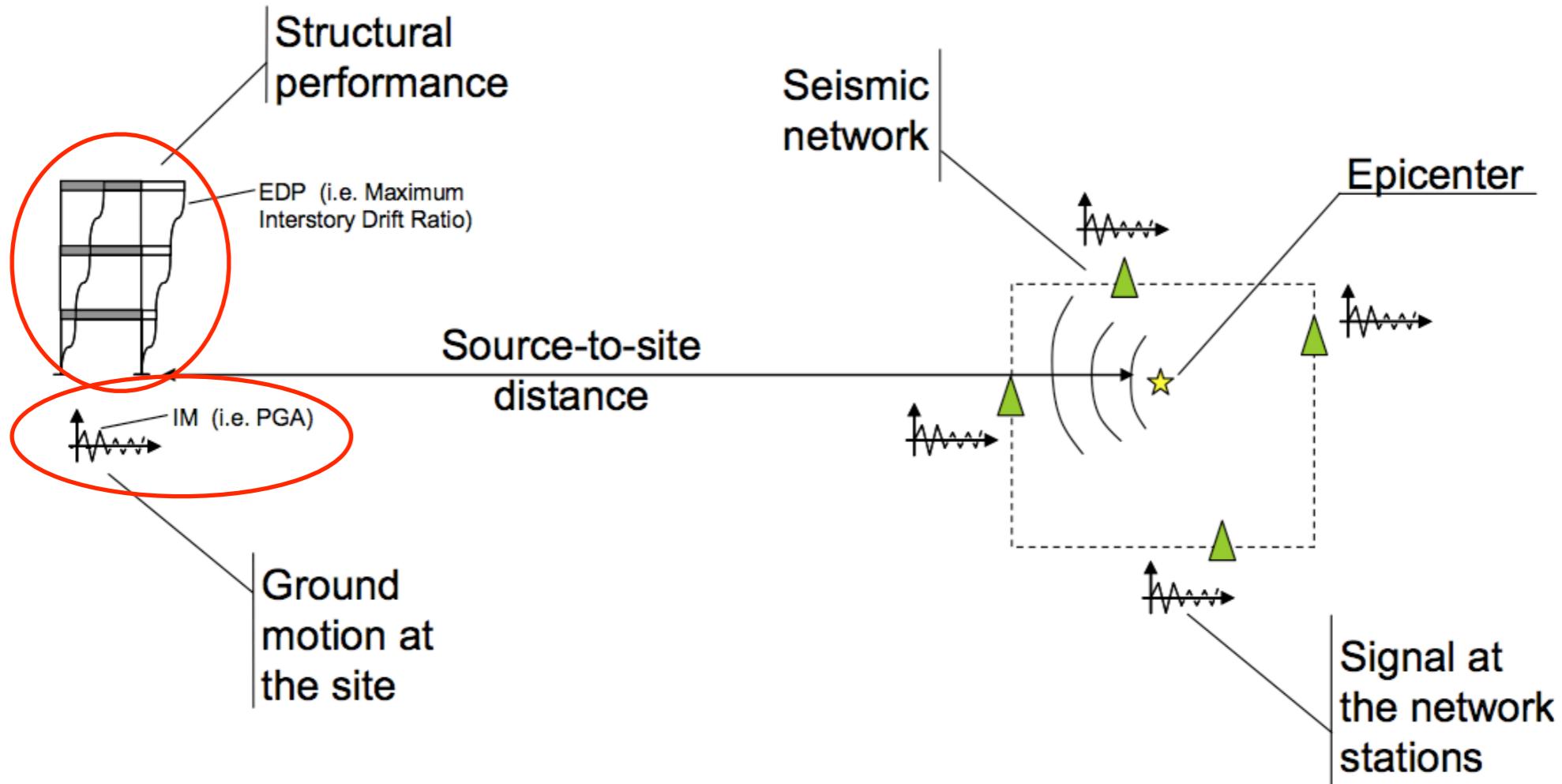
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Attenuation Law **EEW**
(function of time)

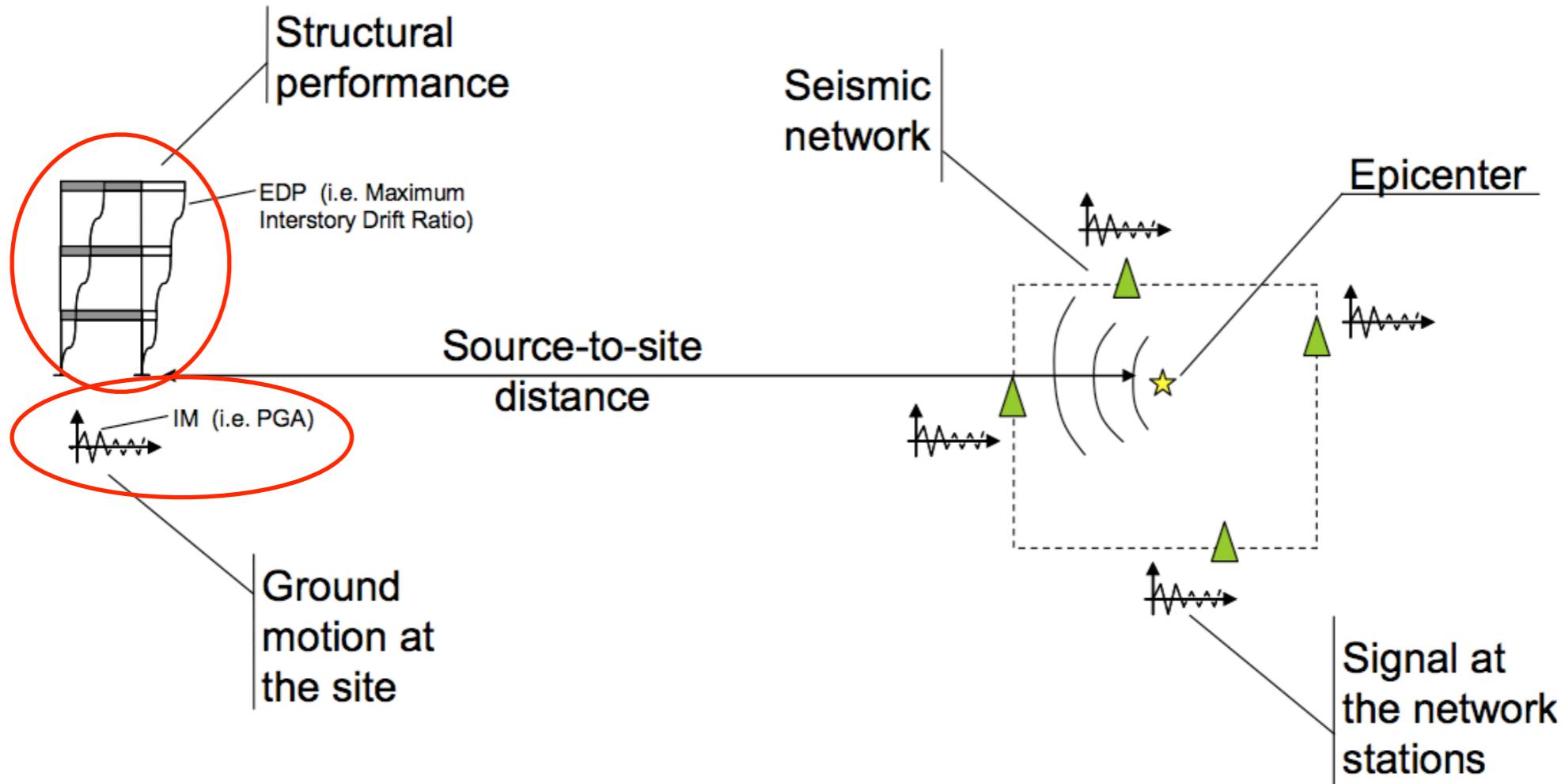
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Attenuation Law **EEW**
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Real-Time Hazard Evaluation/Mitigation



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Attenuation Law

EEW
(function of time)

Estimation of Engineering Demand Parameters (EDP):

$$\hat{f}_{EDP}(edp) = \int_{IM} f_{EDP|PGA}(edp|pga) \hat{f}_{PGA}(pga) dp\!ga$$

Discussion

- We have developed a probabilistic, real-time evolutionary location technique (RTLoc) based on the equal differential-time (EDT) formulation.
 - At each time step, this algorithm makes use of both the information from triggered arrivals and not-yet-triggered stations.
 - Constraint on the hypocenter location is obtained as soon as the first station has triggered and is updated at fixed time intervals or when a new station triggers.

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- The hypocenter location is estimated as a probability density function defined within a pre-defined search volume.
 - This probabilistic description of the location results is easy to incorporate into a system for real-time hazard evaluation and mitigation.
- Both synthetic and real data show that useful locations can be obtained within 1-2 seconds for a local earthquake and 6-10 seconds at a regional scale