

Full moment tensor analysis of nuclear explosions and a collapse in North Korea

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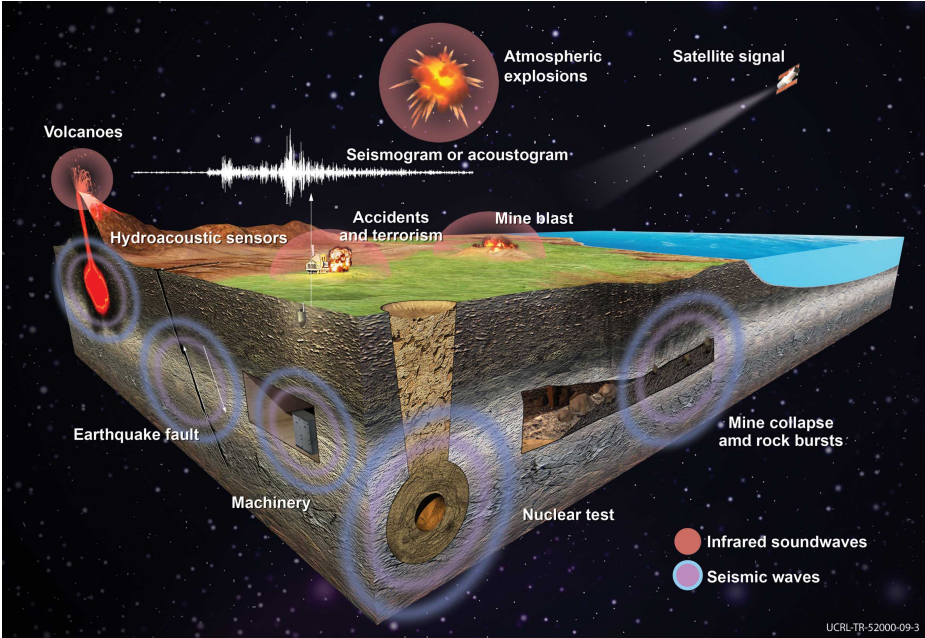
CTBTO Science and Technology Conference
June 27, 2019



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SCHWEIZERISCHER NATIONALFONDS
FONDO NAZIONALE SVIZZERO
SWISS NATIONAL SCIENCE FOUNDATION



Goal: differentiate, classify different seismic events



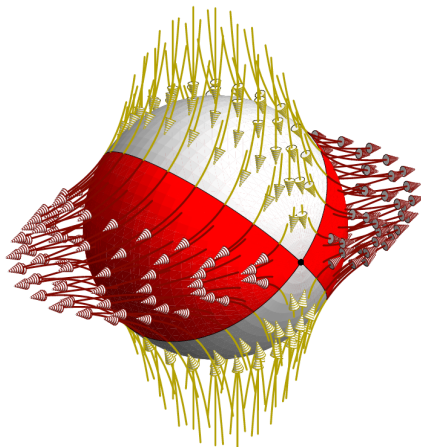
Seismic source representation – moment tensors

- A moment tensor \mathbf{M} is 3×3 symmetric matrix
- U : orientation matrix
- $\mathbf{\Lambda}$: moment tensor eigenvalues

$$\mathbf{M} = U [\mathbf{\Lambda}] U^{-1}$$

$$[\mathbf{\Lambda}] = \begin{pmatrix} \lambda_1 & 0 & 0 \\ 0 & \lambda_2 & 0 \\ 0 & 0 & \lambda_3 \end{pmatrix}$$

- **KEY: eigenvalues λ determine coloring of the beachball**



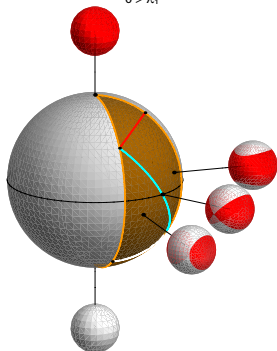
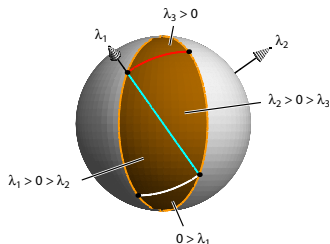
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










$$[\mathbf{\Lambda}] = \begin{pmatrix} \lambda_1 & 0 & 0 \\ 0 & \lambda_2 & 0 \\ 0 & 0 & \lambda_3 \end{pmatrix}$$

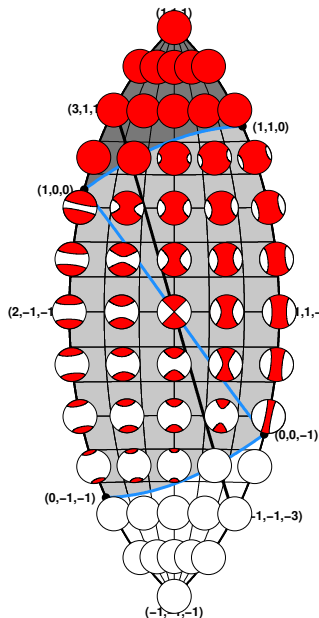
- **KEY: eigenvalues λ determine coloring of the beachball**



Tape & Tape (2012)

Eigenvalues organize on a **lune** source-type plot

Moment tensor	Beachball	Moment tensor	Beachball
$\frac{1}{\sqrt{3}} \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$		$-\frac{1}{\sqrt{3}} \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$	
$-\frac{1}{\sqrt{2}} \begin{pmatrix} 0 & 1 & 0 \\ 1 & 0 & 0 \\ 0 & 0 & 0 \end{pmatrix}$		$\frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 0 & 0 \\ 0 & -1 & 0 \\ 0 & 0 & 0 \end{pmatrix}$	
$\frac{1}{\sqrt{2}} \begin{pmatrix} 0 & 0 & -1 \\ 0 & 0 & 0 \\ -1 & 0 & 0 \end{pmatrix}$		$\frac{1}{\sqrt{2}} \begin{pmatrix} 0 & 0 & 0 \\ 0 & 0 & -1 \\ 0 & -1 & 0 \end{pmatrix}$	
$\frac{1}{\sqrt{2}} \begin{pmatrix} -1 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 1 \end{pmatrix}$		$\frac{1}{\sqrt{2}} \begin{pmatrix} 0 & 0 & 0 \\ 0 & -1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$	
$\frac{1}{\sqrt{6}} \begin{pmatrix} 1 & 0 & 0 \\ 0 & -2 & 0 \\ 0 & 0 & 1 \end{pmatrix}$		$\frac{1}{\sqrt{6}} \begin{pmatrix} -2 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$	
$\frac{1}{\sqrt{6}} \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & -2 \end{pmatrix}$		$-\frac{1}{\sqrt{6}} \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & -2 \end{pmatrix}$	



A geometric parameterization for moment tensors

(Tape & Tape, 2012)

$$\mathbf{M}(\gamma, \delta, \kappa, \theta, \sigma) = [\mathbf{\Lambda}(\gamma, \delta)] \hat{U}(\kappa, \theta, \sigma)$$

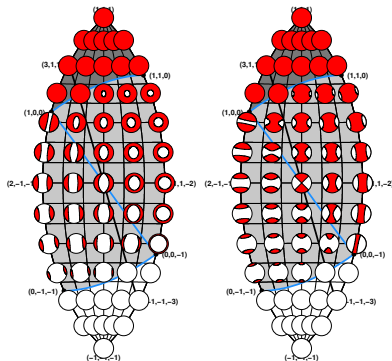
- (γ, δ) describe location on the lune
- (κ, σ, θ) describe the beachball orientation
- Magnitude $\propto \|\mathbf{\Lambda}\|$

Goal: Find moment tensor that best fits observations, estimate MT uncertainties

lune longitude	$-30 \leq \gamma \leq 30$
lune latitude	$-90 \leq \delta \leq 90$
strike	$0 \leq \kappa \leq 360$
dip	$0 \leq \theta \leq 90$
rake	$-180 \leq \sigma \leq 180$
magnitude	



Grid search
full moment tensor space



Algorithm to estimate full moment tensors + uncertainties

Journal of Geophysical Research: Solid Earth

RESEARCH ARTICLE

10.1029/2017JB015325

Estimation of Full Moment Tensors, Including Uncertainties, for Nuclear Explosions, Volcanic Events, and Earthquakes

Key Points:

- We estimate full moment tensors for 116 events: nuclear explosions,

Celso Alvizuri^{1,2} , Vipul Silwal¹ , Lion Krischer³ , and Carl Tape¹ 

Moment tensor estimation

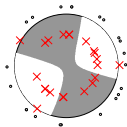
- Efficient grid search FMT space (5D, 30M+ solutions)
- For each MT compute synthetic waveforms (local 1D model)
- Evaluate misfit between observed and synthetic
- Each event requires careful analysis of waveforms & parameters

Uncertainty estimation

- Homogeneous distribution of solutions in moment tensor space
- Assess full ensemble of MTs evaluated in grid search
- Find best orientation at each point on the lune
- Confidence measure for MTs
- Probability for source types

Example moment tensor result

2016 Pawnee, Oklahoma (USA)

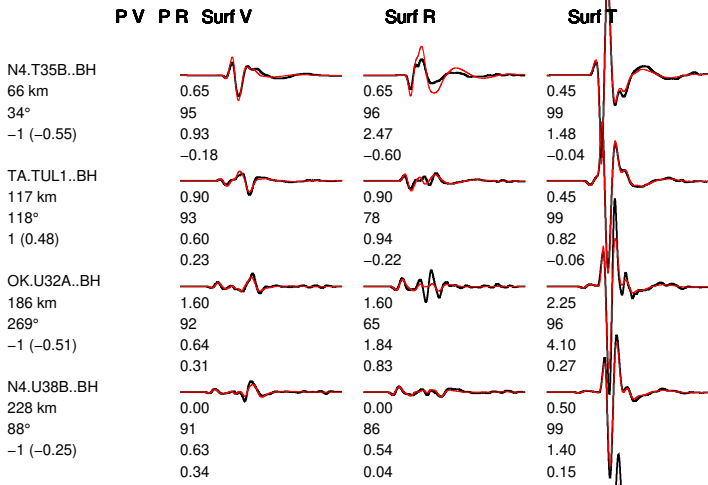


Event 20160903120244400 Model cus Depth 6

FM 106 89 5 Mw 5.60 γ 0 δ 3 rms 2.080e-01 VR 95.7 pol_wt 0.20

Filter periods (seconds): Body:0.50-3.33. Surf:10.00-50.00 duration: 2.00/1.

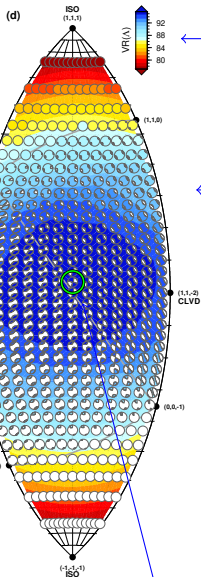
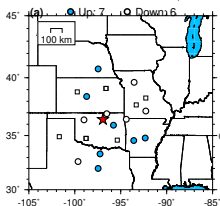
norm L1 # Pwin 1 Swin 150 # N 22 Np 0 Ns 64



Example moment tensor uncertainty analysis

Event 20160903120244400, M 5.60
 Lon -96.9290, Lat 36.4250
 Dep 5.6 km (inversion 6 km)

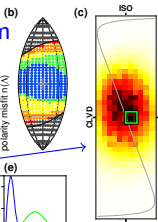
Station map



← Variance Reduction

← VR by source type

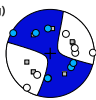
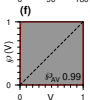
Permissible solutions from first motion polarities



PDF for source types



Confidence params.

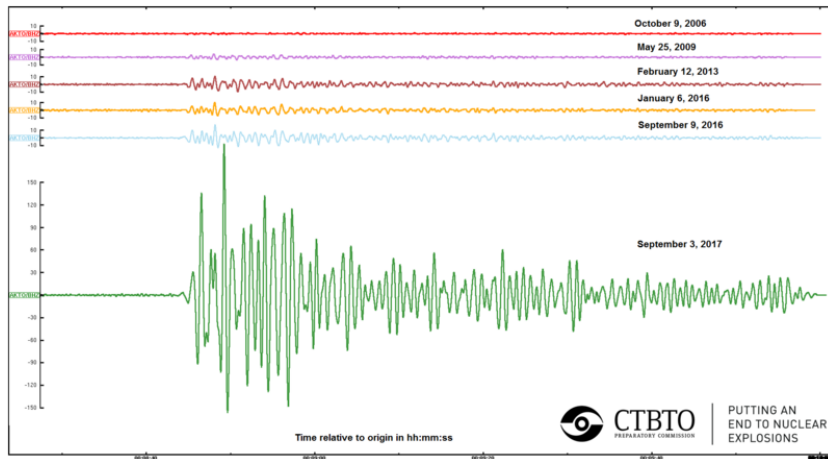


Best mechanism

Application: The North Korea events

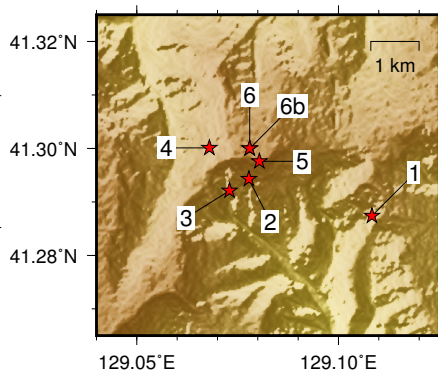
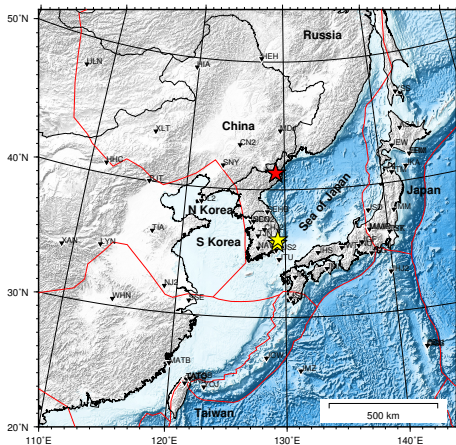
September 3, 2017 CTBTO press statement

“Our monitoring stations picked up an unusual seismic event in the Democratic Peoples Republic of Korea (DPRK) today at 03:30 (UTC)...”



Study: Full Moment Tensor Analysis of Nuclear Explosions in North Korea (Alvizuri & Tape, 2018, SRL special issue)

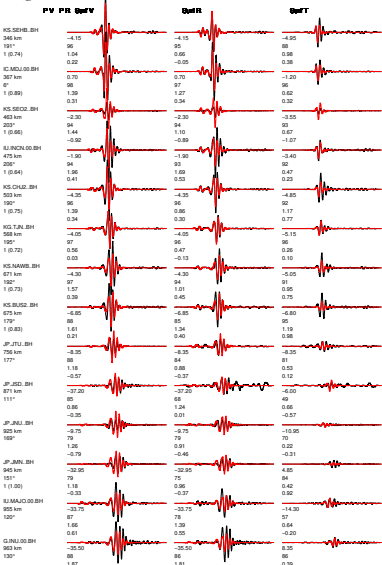
- 6 nuclear tests
- 1 unusual event
- 2 earthquakes in South Korea
- All available broadband stations within 2,000 km radius



NK6 2017-09-03T03:30:01.760 (UTC) – main event



Event 2017090303001760 Model MDJ2 Depth 1
 FM 328 16 65 Mw 5.18 y -5 s 66 rms 2.342e-01 VR 94.5 pol_wt 0.30
 Filter periods (seconds): Body:0.10-10.00, Surf:16.67-50.00 duration: 1.00/0.50 s
 # nom L1 # Pwin 1 Swin 500 # N 34 Np 0 Ns 102



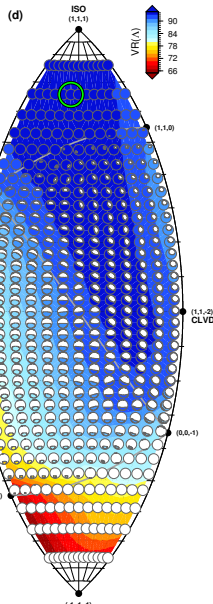
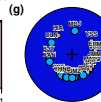
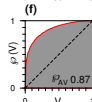
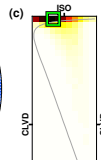
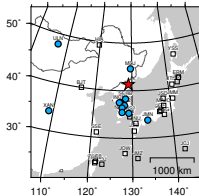
Event 2017090303001760, M 5.18

Lon 129.0297, Lat 41.3324

Dep 0.0 km (inversion 1 km)

● $(\gamma, \delta)_{VR}^{max} = (-5^\circ, 66^\circ)$ ■ $(\gamma, \delta)_P^{max} = (-7^\circ, 55^\circ)$

(a) ● Up: 11 ○ Down: 0



NK6 2017-09-03T03:38:31.810 (UTC) – unusual event



Event 20170903033831810 Model MDJ2 Depth 1
 FM 86 37 15 Mw 4.20 γ 23 δ -87 ms 3.896e-01 VR 84.8 pol_wt 999.00
 Filter periods (seconds): Body:0.10-10.00, Surf:25.00-50.00 duration: 1.00/0.50 s
 # norm L1 # Pwin 1 Swin 500 # N 25 Np 0 Ns 41

Event 20170903033831810, M 4.20

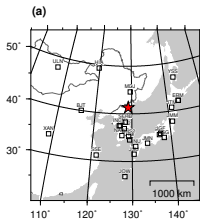
Lon 129.0310, Lat 41.3340

Dep 0.0 km (inversion 1 km)

● (γ , δ)_{VR}^{max} = (23°, -76°) ■ (γ , δ)_p^{max} = (-22°, -55°)

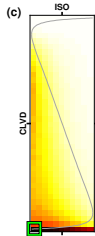


Surf



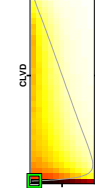
(a)

[No polarities]

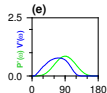


(b)

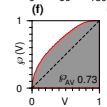
[No polarities]



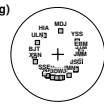
(c)



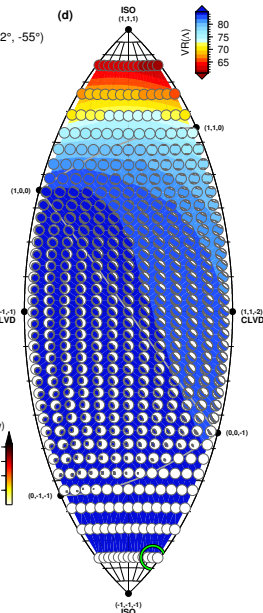
(d)



(e)



(f)



(g)

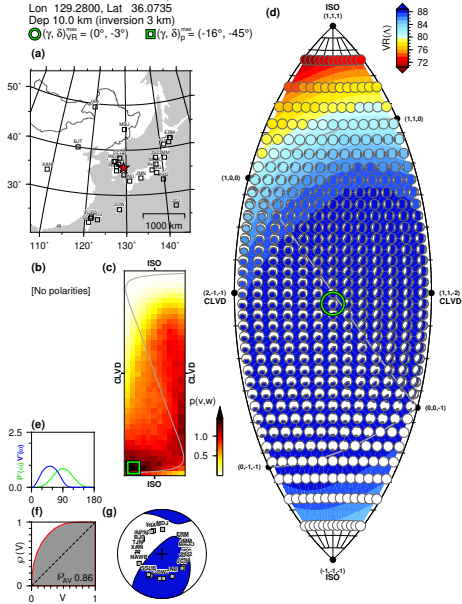
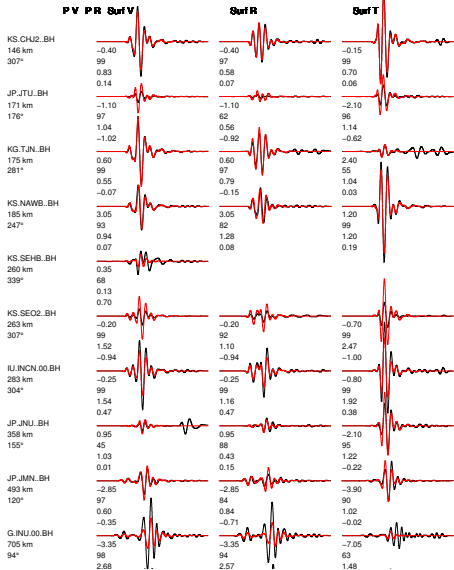
2017-11-15 Pohang



Event 20171115052932820 Model MJ2 Depth 3
 FM 333 42 25 Mw 5.20 γ 0 δ -3 rms 3.346e-01 VR 88.8 pol_wt 999.00
 Filter periods (seconds): Body:0.10-10.00. Surf:20.00-50.00 duration: 1.00/0.50 s
 # norm L1 # Pwin 1 Swin 400 # N 29 Np 0 Ns 82

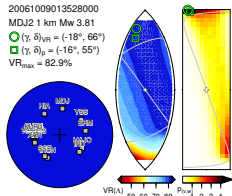
Event 20171115052932820, M 5.20
 Lon 129.2800, Lat 36.0735
 Dep 10.0 km (inversion 3 km)

● $(\gamma, \delta)_{VR} = (0^\circ, -3^\circ)$ ■ $(\gamma, \delta)_p = (-16^\circ, -45^\circ)$



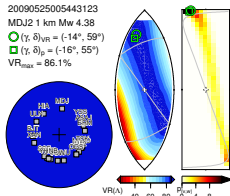
NK1 Mw 3.81

20061009013528000
MDJ2 1 km Mw 3.81
 $(\gamma, \delta)_{VR} = (-18^\circ, 66^\circ)$
 $(\gamma, \delta)_p = (-16^\circ, 55^\circ)$
 $VR_{max} = 82.9\%$



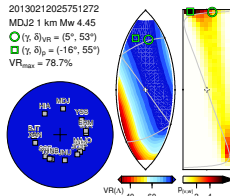
NK2 Mw 4.38

20090525005443123
MDJ2 1 km Mw 4.38
 $(\gamma, \delta)_{VR} = (-14^\circ, 59^\circ)$
 $(\gamma, \delta)_p = (-16^\circ, 55^\circ)$
 $VR_{max} = 86.1\%$



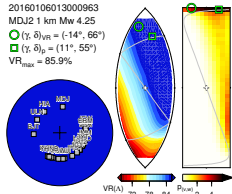
NK3 Mw 4.45

20130212025751272
MDJ2 1 km Mw 4.45
 $(\gamma, \delta)_{VR} = (5^\circ, 53^\circ)$
 $(\gamma, \delta)_p = (-16^\circ, 55^\circ)$
 $VR_{max} = 78.7\%$



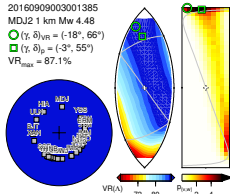
NK4 Mw 4.25

20160106013000963
MDJ2 1 km Mw 4.25
 $(\gamma, \delta)_{VR} = (-14^\circ, 66^\circ)$
 $(\gamma, \delta)_p = (11^\circ, 55^\circ)$
 $VR_{max} = 85.9\%$



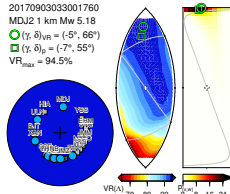
NK5 Mw 4.48

20160909003001385
MDJ2 1 km Mw 4.48
 $(\gamma, \delta)_{VR} = (-18^\circ, 66^\circ)$
 $(\gamma, \delta)_p = (-3^\circ, 55^\circ)$
 $VR_{max} = 87.1\%$



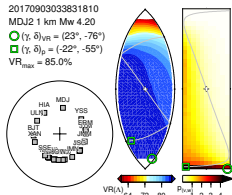
NK6 Mw 5.18

20170903033001760
MDJ2 1 km Mw 5.18
 $(\gamma, \delta)_{VR} = (-5^\circ, 66^\circ)$
 $(\gamma, \delta)_p = (-7^\circ, 55^\circ)$
 $VR_{max} = 94.5\%$



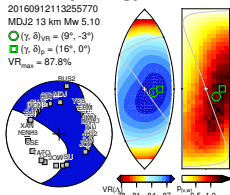
NK6b Mw 4.20

20170903033831810
MDJ2 1 km Mw 4.20
 $(\gamma, \delta)_{VR} = (23^\circ, -76^\circ)$
 $(\gamma, \delta)_p = (-22^\circ, -55^\circ)$
 $VR_{max} = 85.0\%$



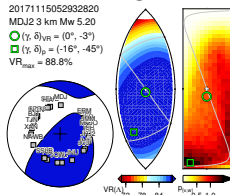
2016 Gyeongju Mw 5.1

20160912113255770
MDJ2 13 km Mw 5.10
 $(\gamma, \delta)_{VR} = (9^\circ, -3^\circ)$
 $(\gamma, \delta)_p = (16^\circ, 0^\circ)$
 $VR_{max} = 87.8\%$

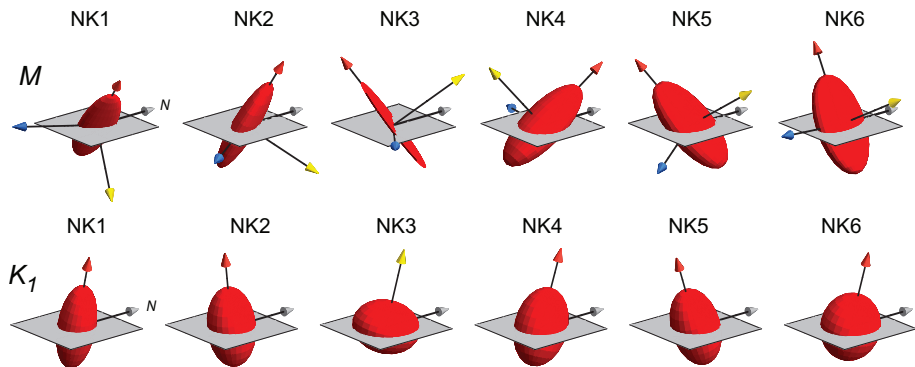


2017 Pohang Mw 5.2

20171115052932820
MDJ2 3 km Mw 5.20
 $(\gamma, \delta)_{VR} = (0^\circ, -3^\circ)$
 $(\gamma, \delta)_p = (-16^\circ, -45^\circ)$
 $VR_{max} = 88.8\%$



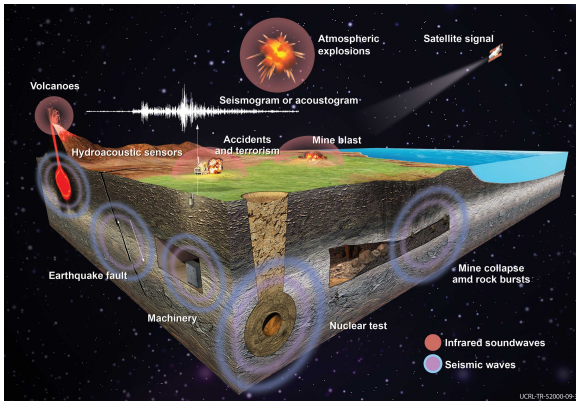
Seismic radiation patterns elongated rather than spherical



Ellipsoids (isocontours) enclosing the vector field associated with a moment tensor
Top: Full moment tensor. Bottom: Crack tensor ($M = \text{Crack} + \text{double couple}$)

- Crack tensors also used by others to model nuclear explosions
- Crack tensors for the NK events show near horizontal crack planes
- The double-couple (non-isotropic) radiation varies from event to event. Perhaps can be constrained by ground deformation studies, microseismicity, field mapping

Perspectives



■ Uncertainties

- tradeoffs
 - structure
 - noise
 - limitations
- essential for discussion of physical processes

■ Many moment tensor applications

- Explosions
- Collapses
- Volcanic events
- Landslides (ongoing work)
- ?

Conclusion

Methology

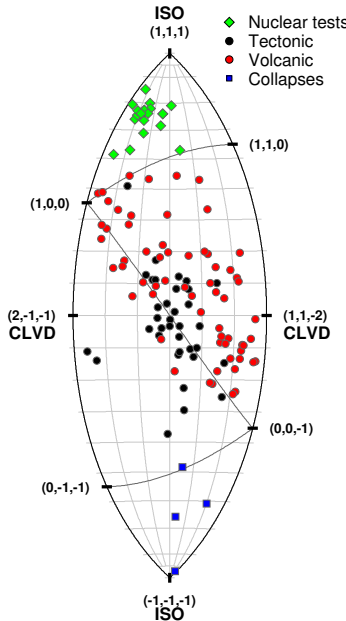
- Grid search of full moment tensor space to find mechanism that best fits observed waveforms
- Several parameters to characterize moment tensor uncertainties

Applications in North and South Korea

- Progression of the NK nuclear tests from Mw 3.81 (NK1) to Mw 5.18 (NK6)
- A collapse event 8 min after NK6

Ongoing & future work

- Landslides
- Moment tensor+uncertainties for 3D structure
- Physical modeling for seismic sources



Thank you for your
attention!

Alvizuri & Tape (2016, 2018);
Alvizuri et al. (2018)

References

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