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Indonesia Leading Reinsurer

# Life Insurance Catastrophe Reserve

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# Catastrophe.<sup>(n)</sup>

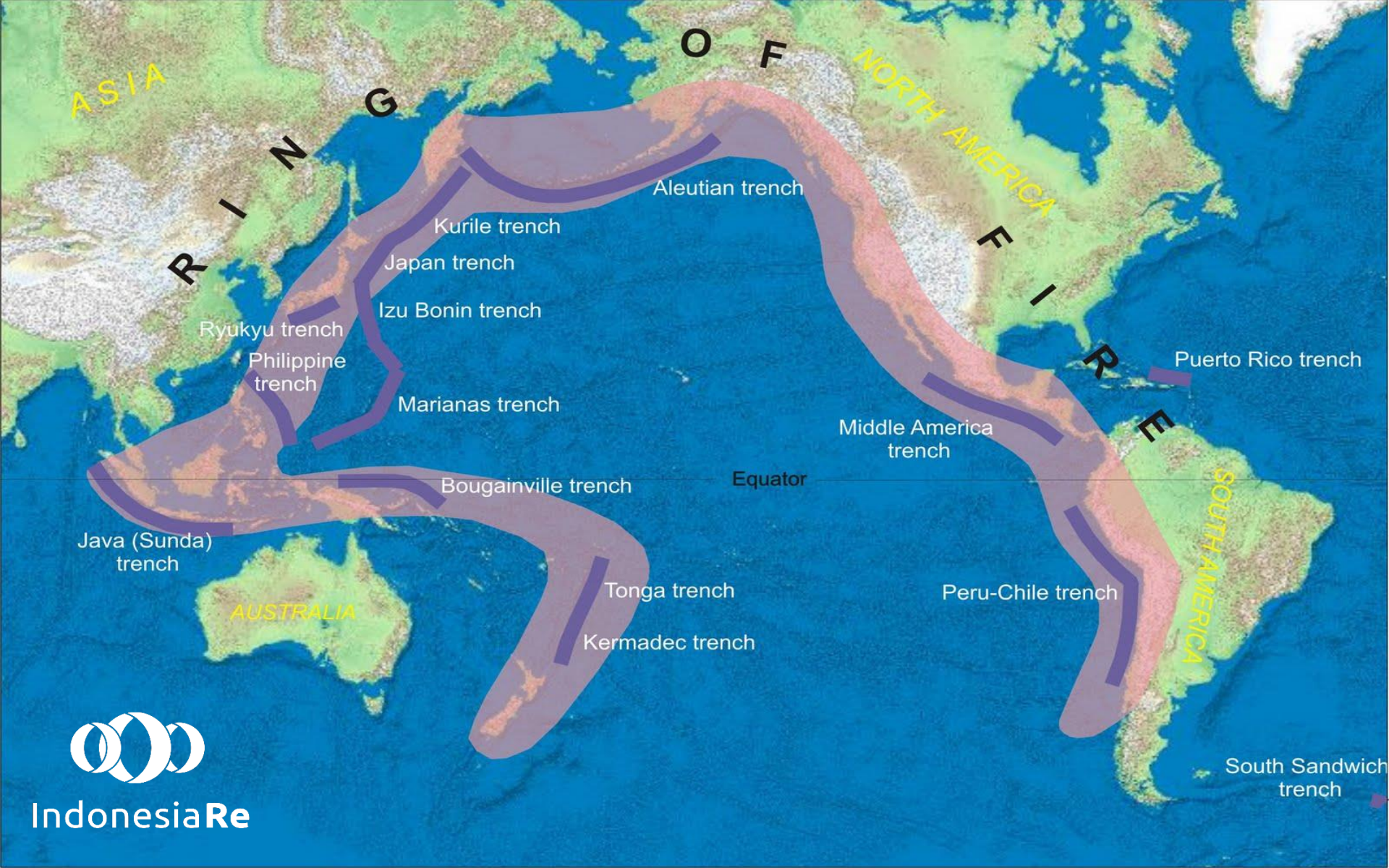
A single event causing great and often sudden damage or suffering.

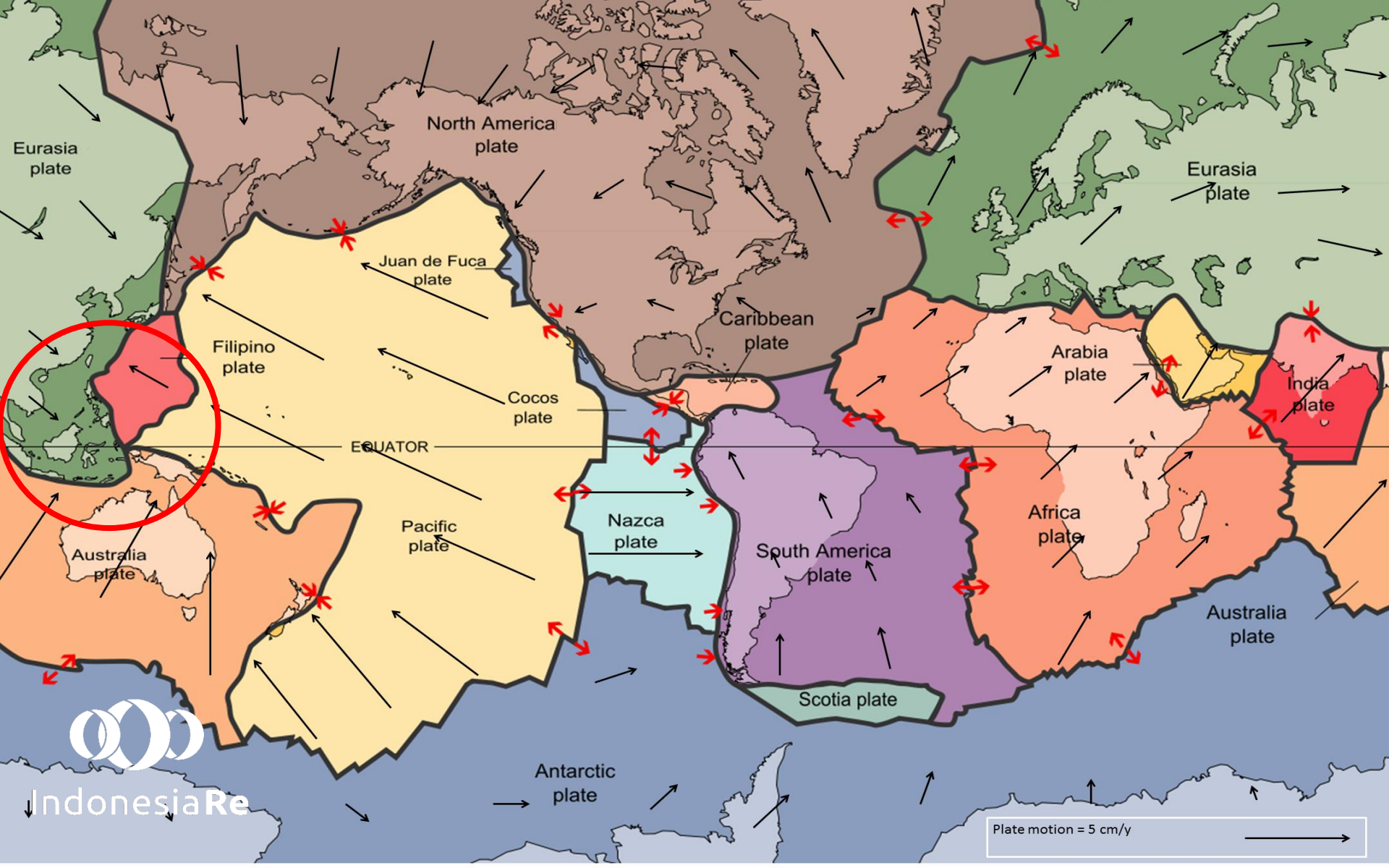
Area Limit ▪

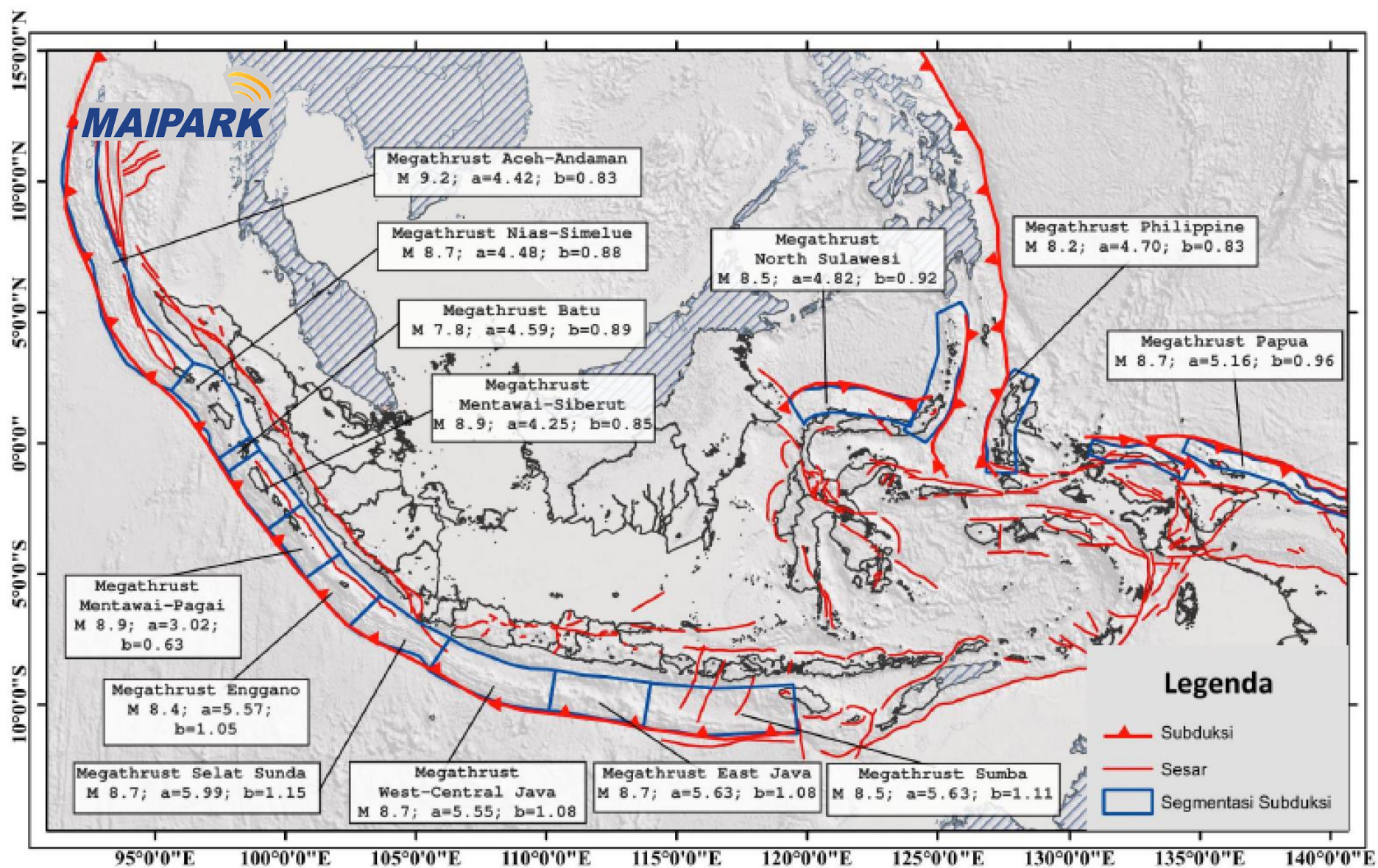
How far (distance) the effect of the single event

Time Limit ▪

How long (duration) the effect of the single event







# Natural Disaster



Landslide



Flood



Landslide caused by flood



Volcanic Eruption



Earthquake



Tsunami

# Natural Disaster

## Earthquake in Lombok



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The victims of the mag. 7 **earthquake** that struck Nusa Tenggara and Bali continue to increase. As of 15 August 2018, the earthquake has caused **460** fatalities. The breakdown:

- North Lombok 396 fatalities
- West Lombok 39 fatalities
- City of Mataram 9 fatalities
- East Lombok 12 fatalities
- Central Lombok 2 fatalities
- City of Denpasar 2 fatalities



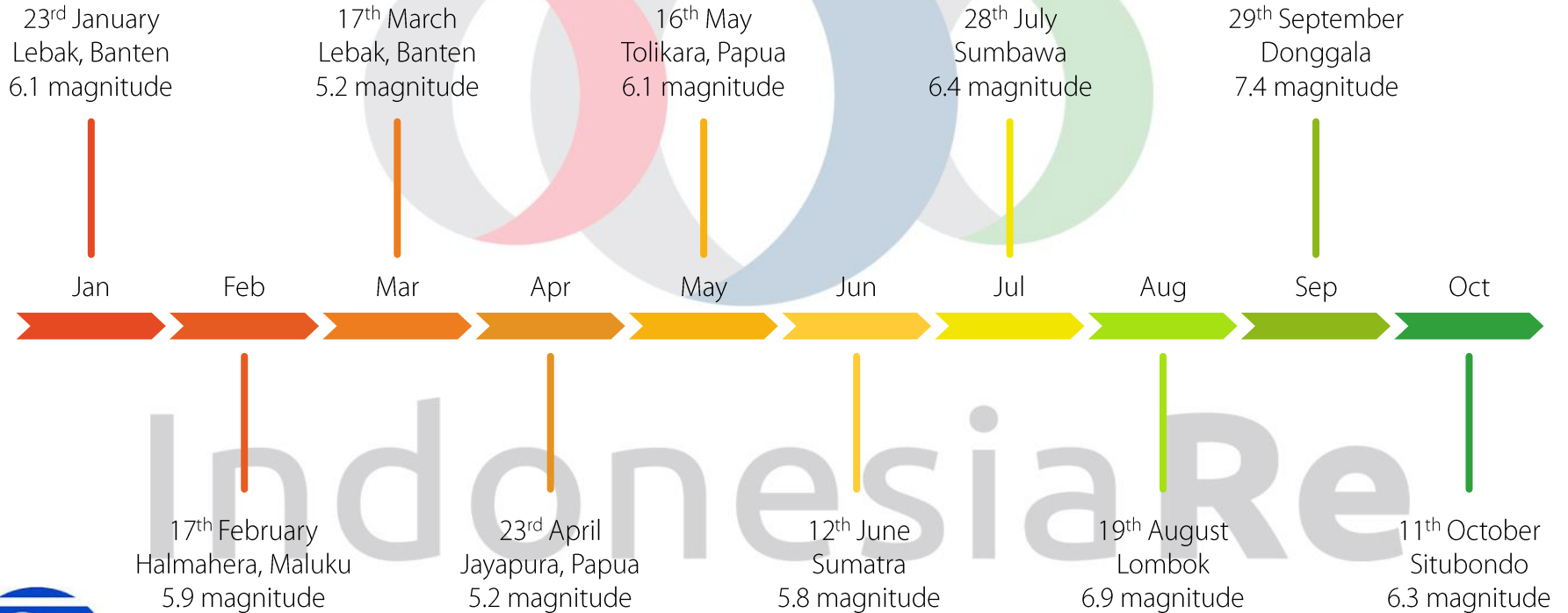
**BADAN NASIONAL  
PENANGGULANGAN BENCANA**



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# Natural Disaster

## Earthquake in Indonesia in 2018





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# Natural Disaster

## Tsunami in Aceh (2004)

Around **170,000** people were killed (130,000 confirmed dead, 37,000 missing) in Indonesia, most of them in Aceh province.

For a while it was thought around 230,000 people were killed there but in April 2005, the government reduced the number of missing from 95,000 to 37,000. The tsunami left more than 500,000 people homeless and caused an estimated \$4.5 billion in losses and damage.



# Natural Disaster

## Earthquake and Tsunami in Central Sulawesi



The National Disaster Mitigation Agency (BNPB) reported the death toll from earthquake and tsunami in Central Sulawesi reached **1,407** people as of October 3rd, at 1 pm

The 7.4-magnitude earthquake rocked Palu and Donggala on Friday, September 28, at 17:2 local time. The devastating quake triggered the tsunami in the region

# Natural Disaster

## Flood and Landslide in West Sumatra



Torrential rains triggered flash floods and landslides on the Indonesian island of Sumatra, killing at least **27** people, including a dozen children at a school, officials said Saturday.

# Man-Made Disaster Transportation Accident

Disobeying traffic rule

Poor vehicle  
condition



Increasing number  
of vehicles

Lack of driving skills

Inadequate transport  
infrastructure

# Transportation Accident

## Latest Bus Accident in Sukabumi



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**Twenty-one** people died and **nine** others were severely injured on Saturday afternoon, when the driver of the **bus** they were traveling in **lost control** of the vehicle in Sukabumi, West Java, causing the bus to plunge into 30-meter-deep ravine.

The **Jakarta**Post

# Transportation Accident

## Some Aviation Accident in Indonesia



Silk Air 185 (1997)  
Palembang – 104 fatalities



Garuda Indonesia 152 (1997)  
North Sumatera – 234 fatalities



Mandala Airlines (2005)  
Medan – 101 fatalities



Adam Air KI-574 (2007)  
102 fatalities



AirAsia 8501 (2014)  
Karimata Strait – 162 fatalities



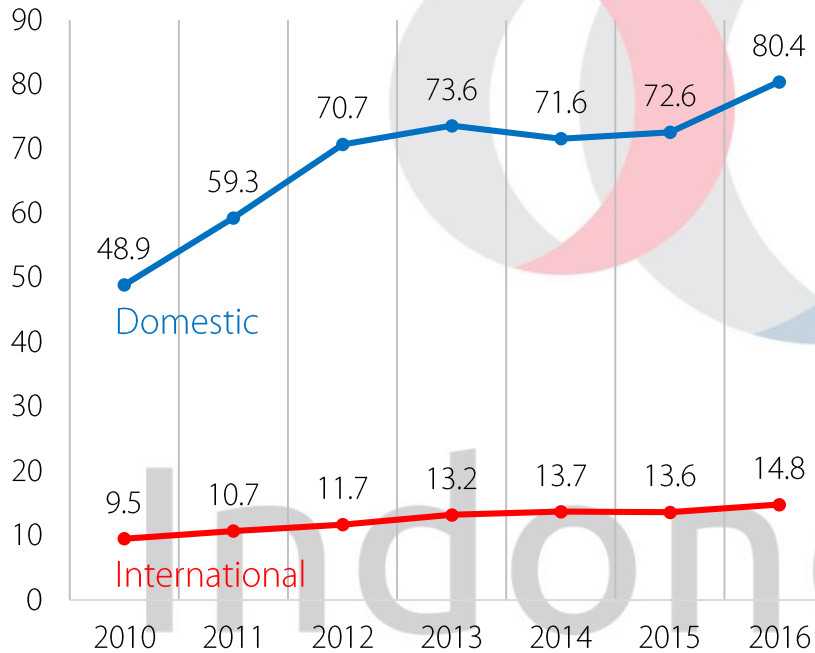
Hercules C-130 (2015)  
Medan – 141 Fatalities

# Aviation Statistics in Indonesia

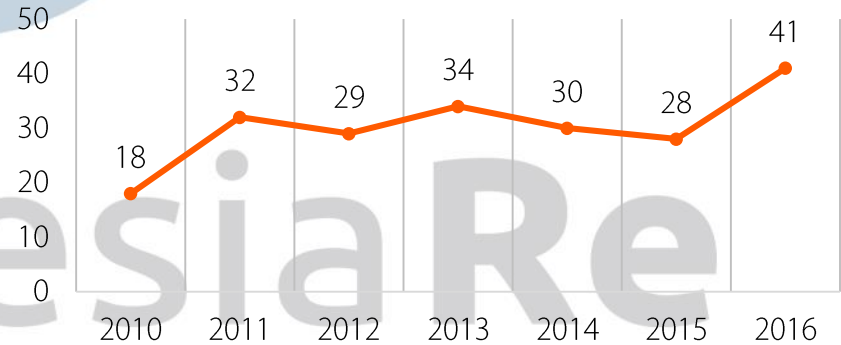


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### Aviation Passanger (in Million)



### Number of Aviation Accident

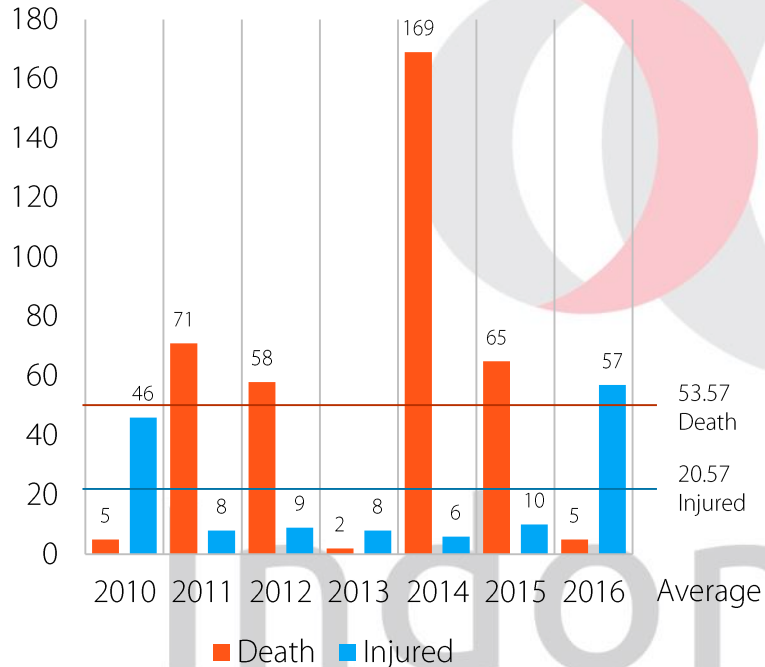


# Aviation Accident in Indonesia

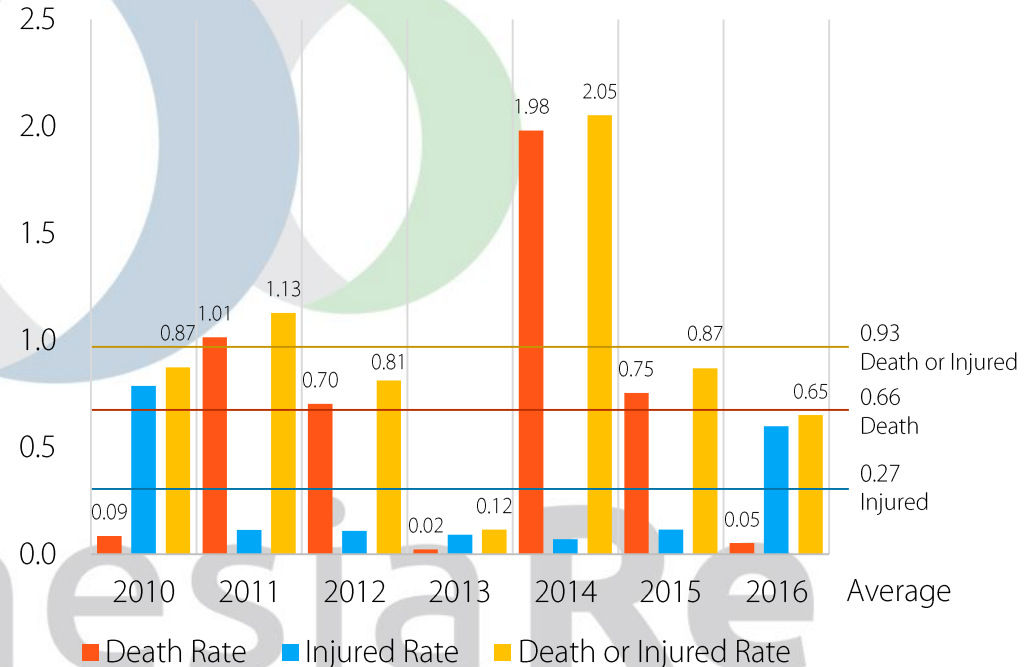


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Number of Victims

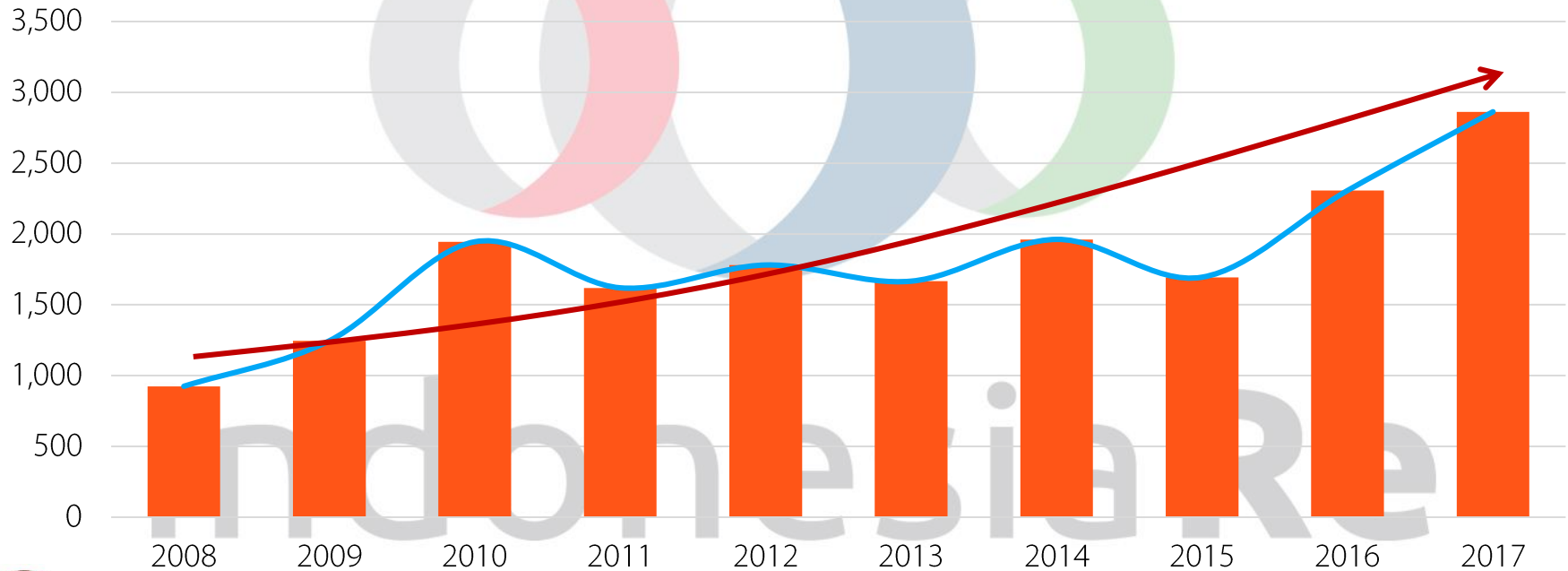


Death Rate & Injured Rate (per mille)



# Natural Disaster Frequency in Decade

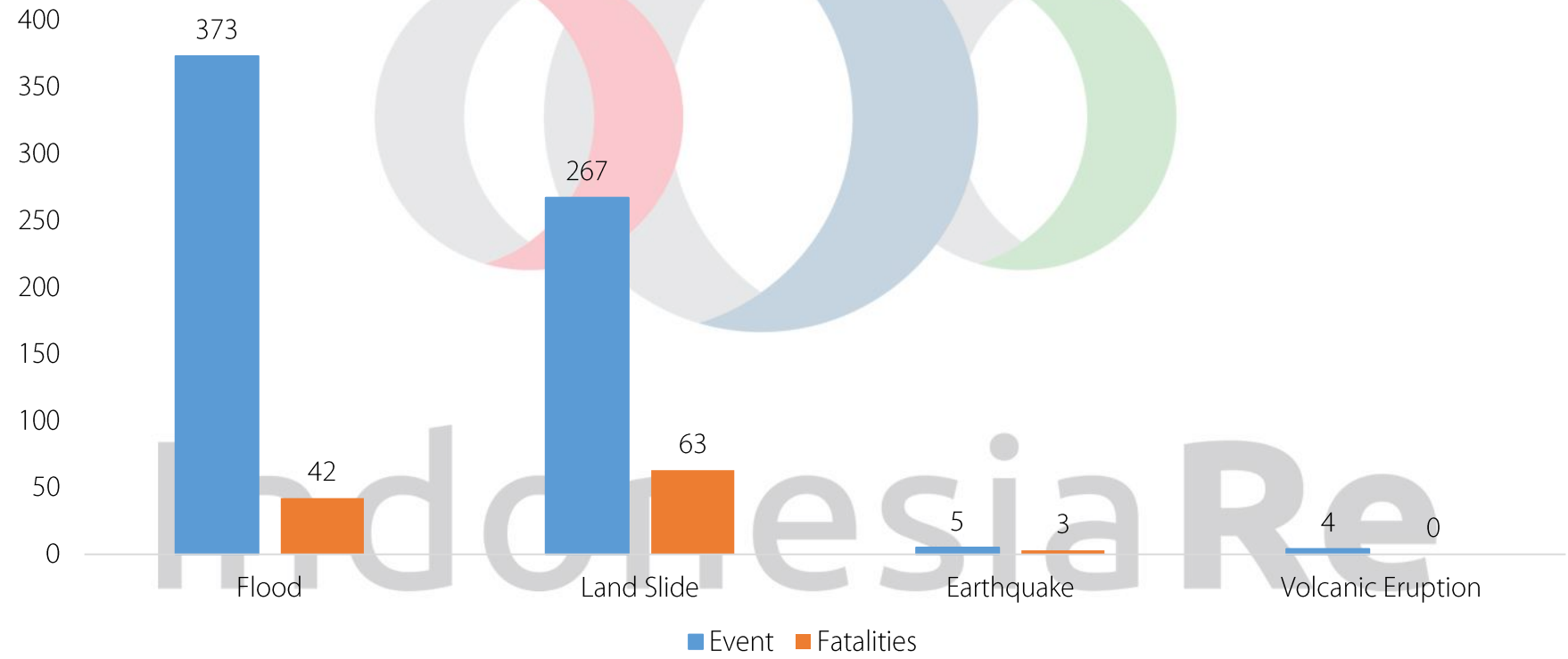
Number of Catastrophe Event in Indonesia





# Catastrophe Event in Indonesia

## Event until Q2 2018





Transportation Accident



SRCC



**EXCLUDED**  
Epidemic



Natural Disaster



Nuclear Hazard

Tsunami in Chile (2010)



520 Fatalities  
Insured Loss : USD 8,000 Mio



Tornado in US (2012)



350 Fatalities  
Insured Loss : USD 2,500 Mio



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Tsunami in Japan (2011)



16,000 Fatalities  
Insured Loss : USD 40 Bio



Flood in Australia (2011)



22 Fatalities  
Insured Loss : AUD 1,900 Mio



# Catastrophe Mapping Construction

## Illustration of Catastrophe Mapping



30%  
Population density  
of Indonesia

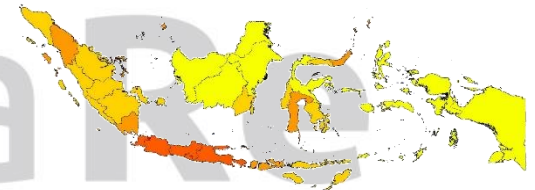


40%  
Number of Event  
for each Catastrophe



30%  
Number of Fatalities  
for each Catastrophe

Vulnerability Level of  
Each Area



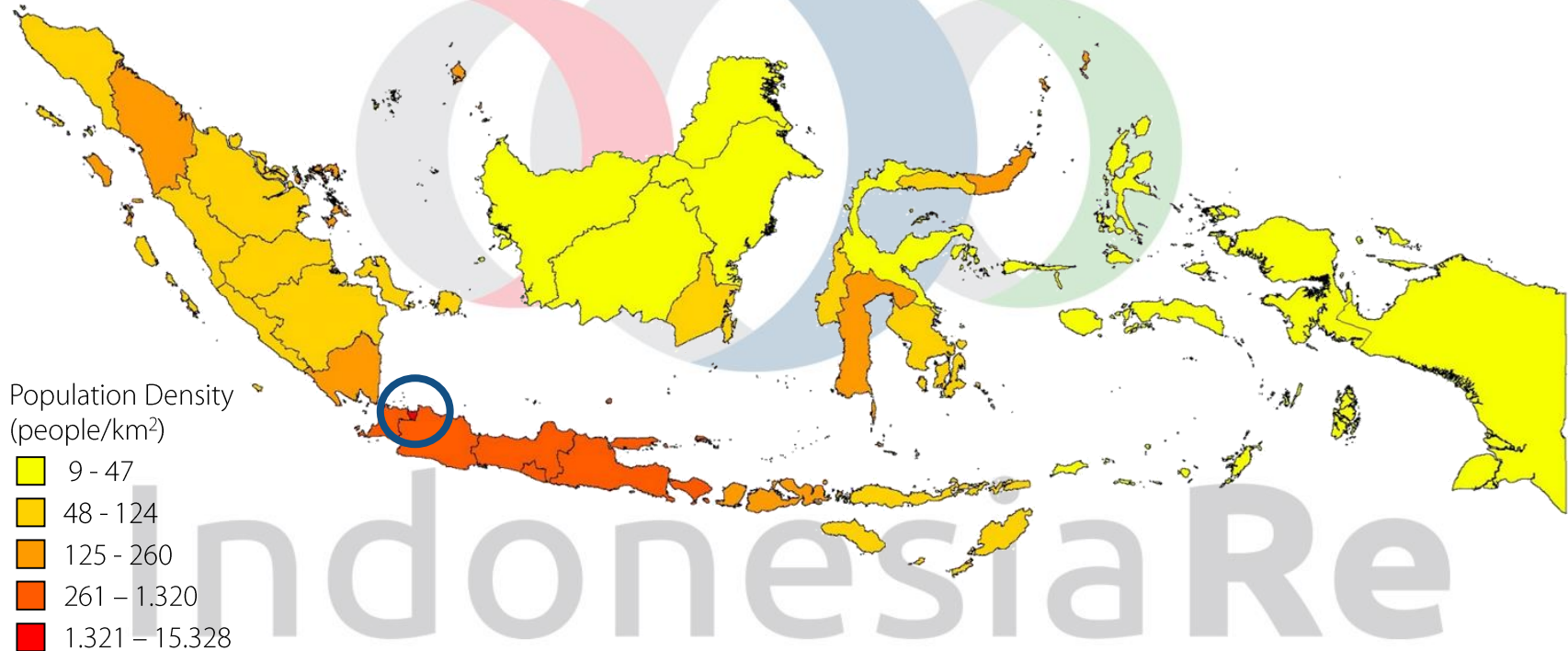
Vulnerability Maps



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# Population Density

## Density Level in Each Area

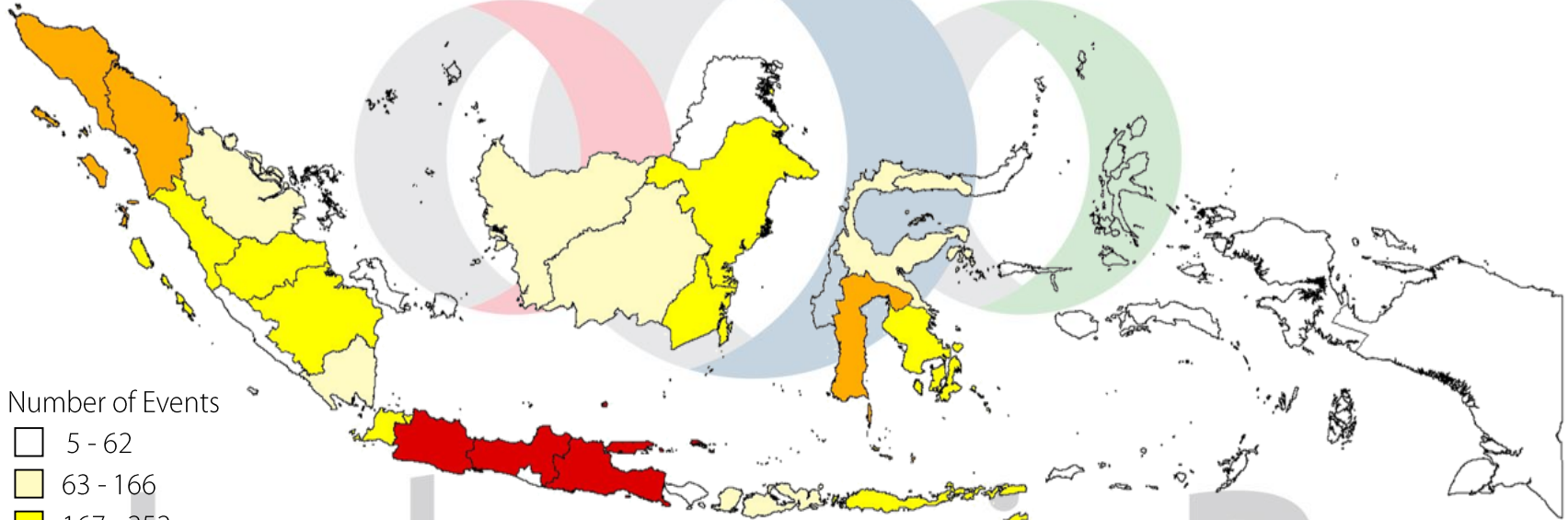


# Catastrophe Events

## Number of Events (Last 100 Years)



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Number of Events

- 5 - 62
- 63 - 166
- 167 - 252
- 253 - 362
- 363 - 1066

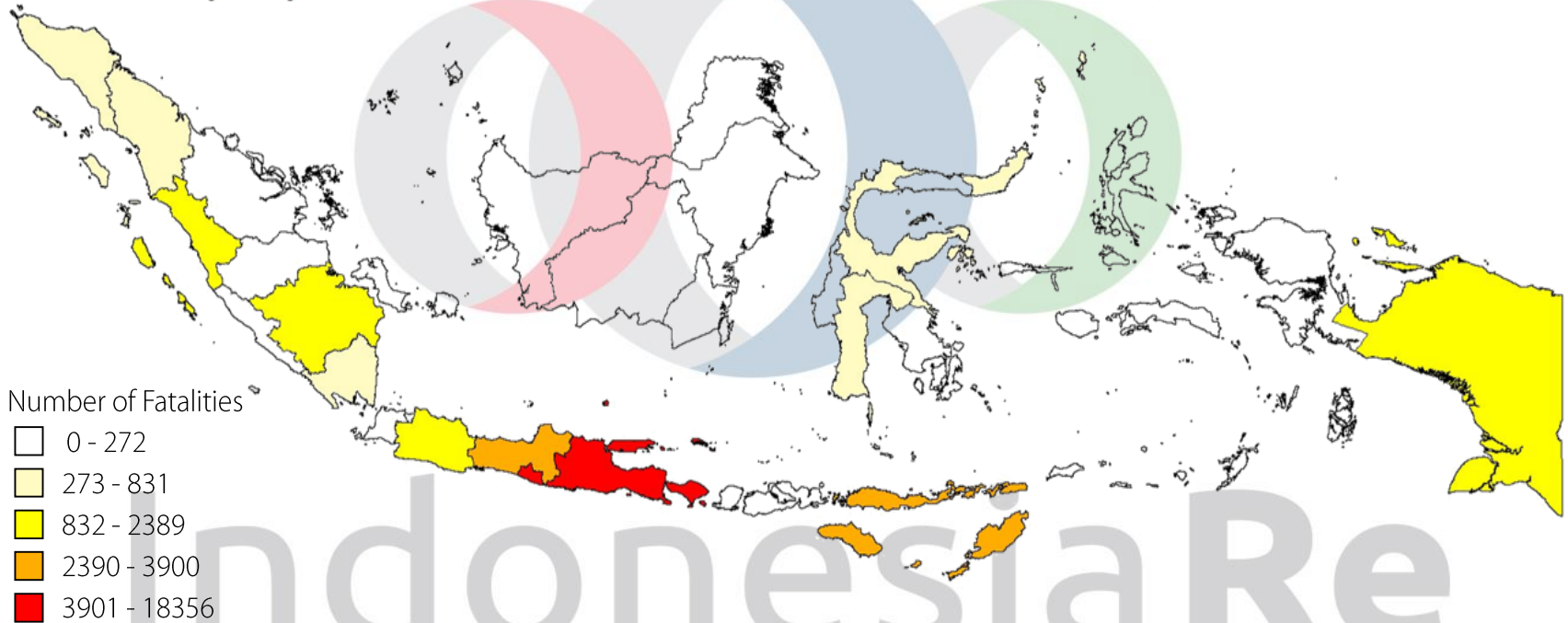
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BNPB

# Catastrophe Events

## Number of Fatalities (Last 100 Years)

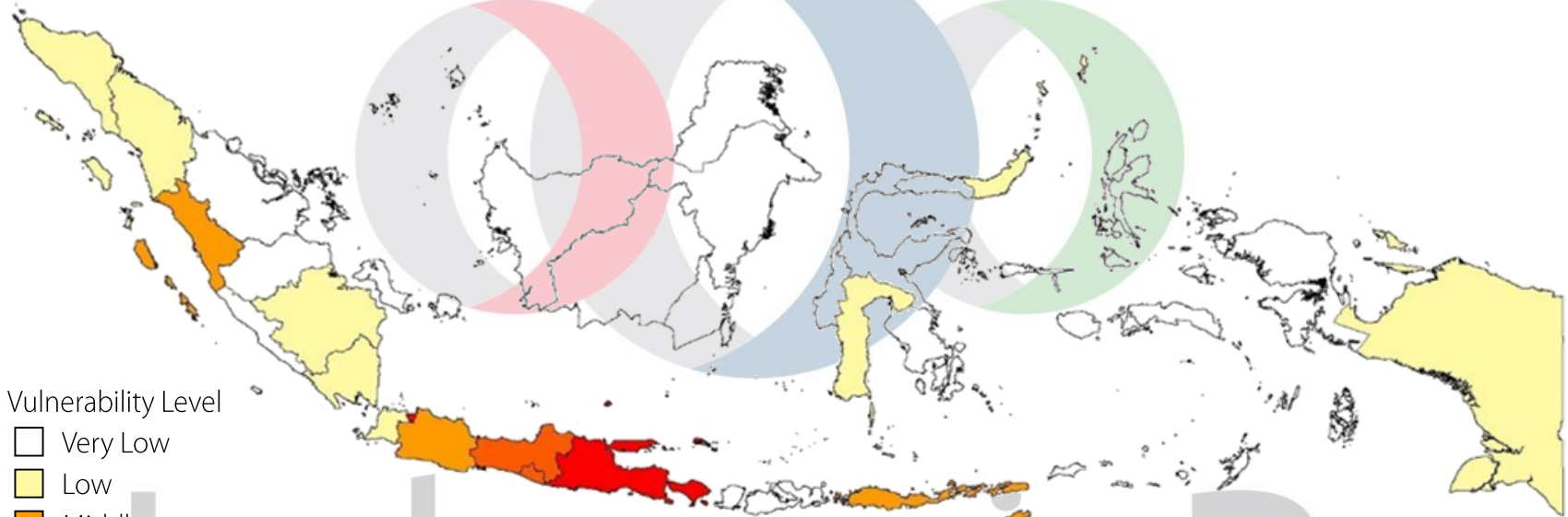


# Catastrophe Events

## Vulnerability Level (Last 100 Years)



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Vulnerability Level

- Very Low
- Low
- Middle
- High
- Very High

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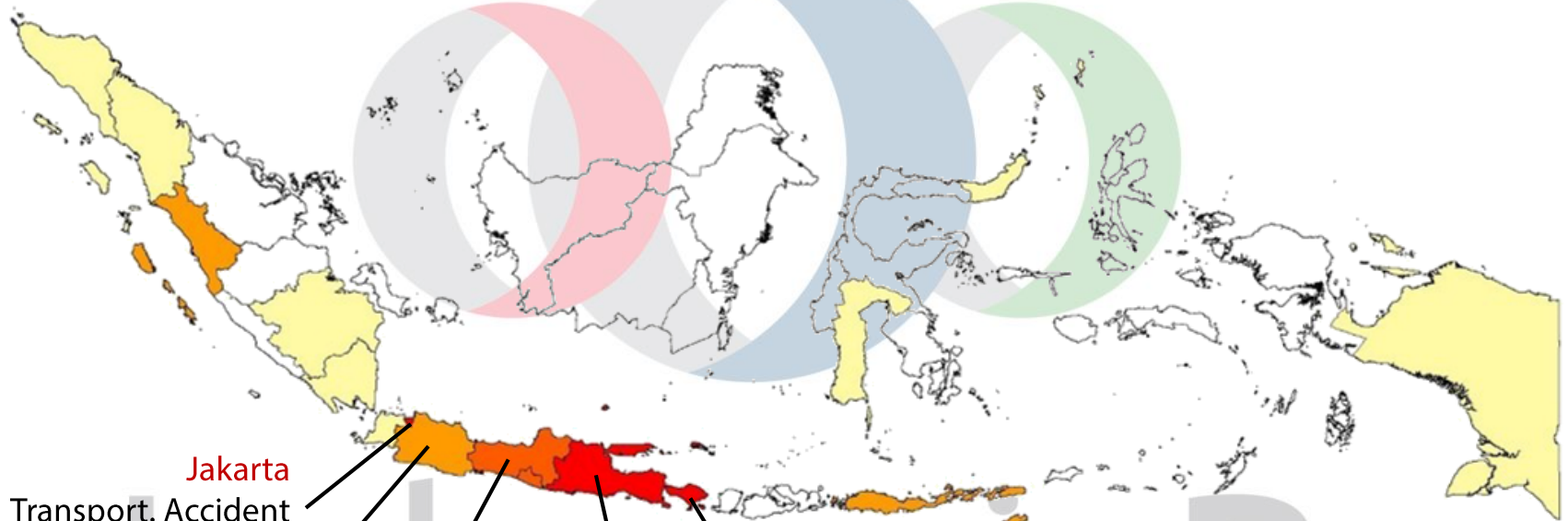
BNPB

# Vulnerability Level

## Highest Vulnerability Level of Each Event (Last 100 Years)



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**Jakarta**  
Transport. Accident  
& Earthquake

**West Java**  
Landslide

**Central Java**  
Landslide caused  
by flood

**East Java**  
Volcano  
Eruption

**Bali**  
Flood

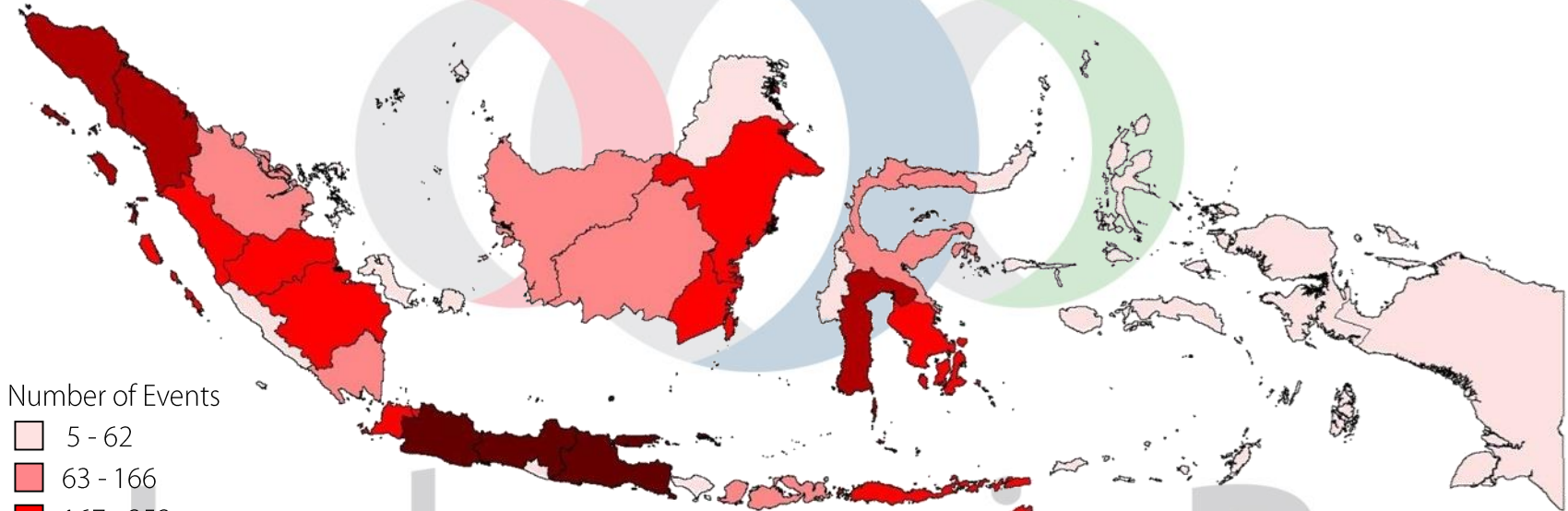


# Catastrophe Events (Flood)

## Number of Events (Last 100 Years)



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Number of Events

- 5 - 62
- 63 - 166
- 167 - 252
- 253 - 362
- 363 - 1066

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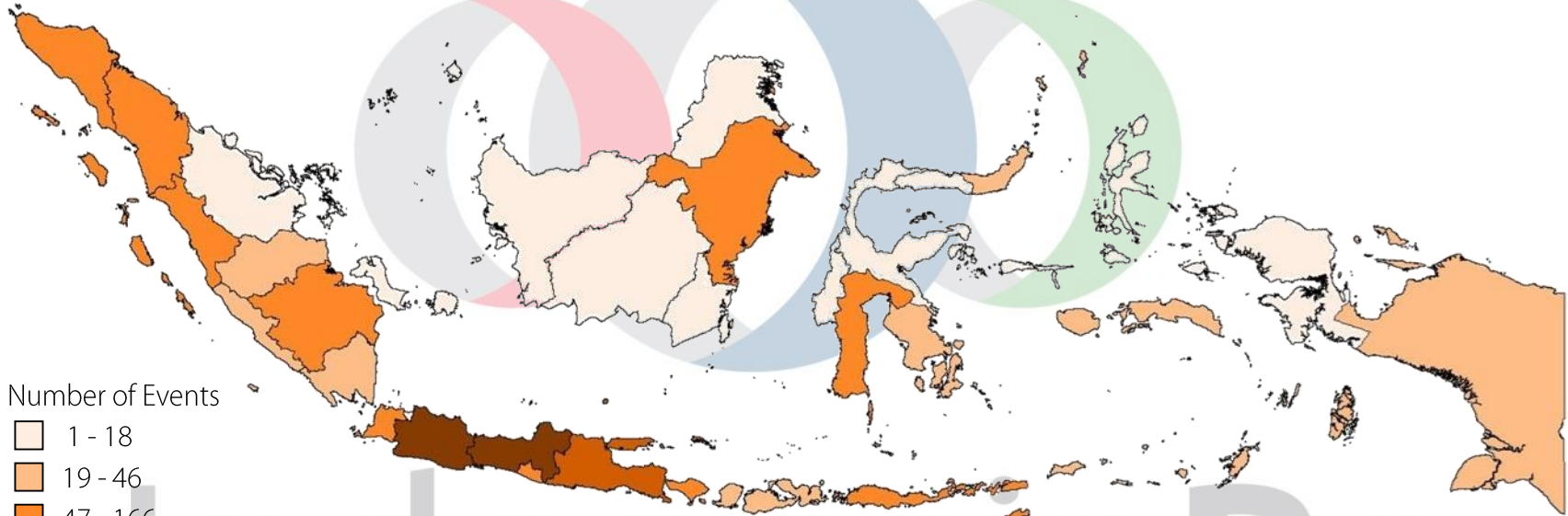
BNPB

# Catastrophe Events (Landslide)

Number of Events (Last 100 Years)



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Number of Events

- 1 - 18
- 19 - 46
- 47 - 166
- 167 - 432
- 433 - 1330

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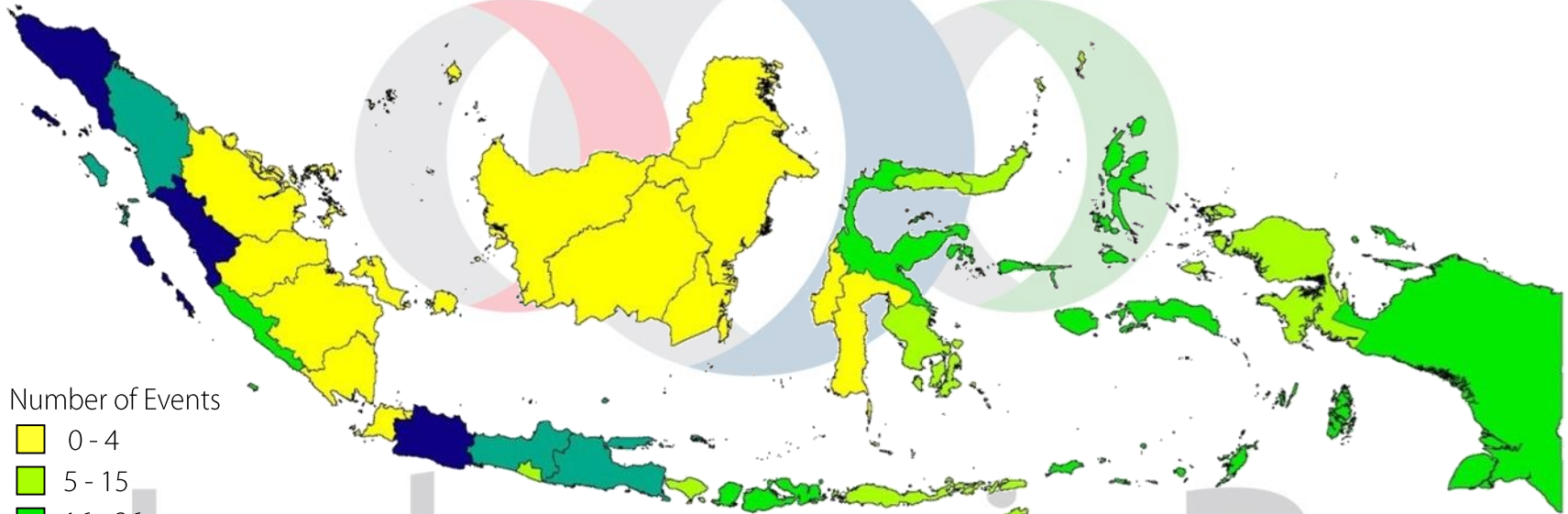
BNPB

# Catastrophe Events (Earthquake)

## Number of Events (Last 100 Years)



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Number of Events

- 0 - 4
- 5 - 15
- 16 - 26
- 27 - 35
- 36 - 62

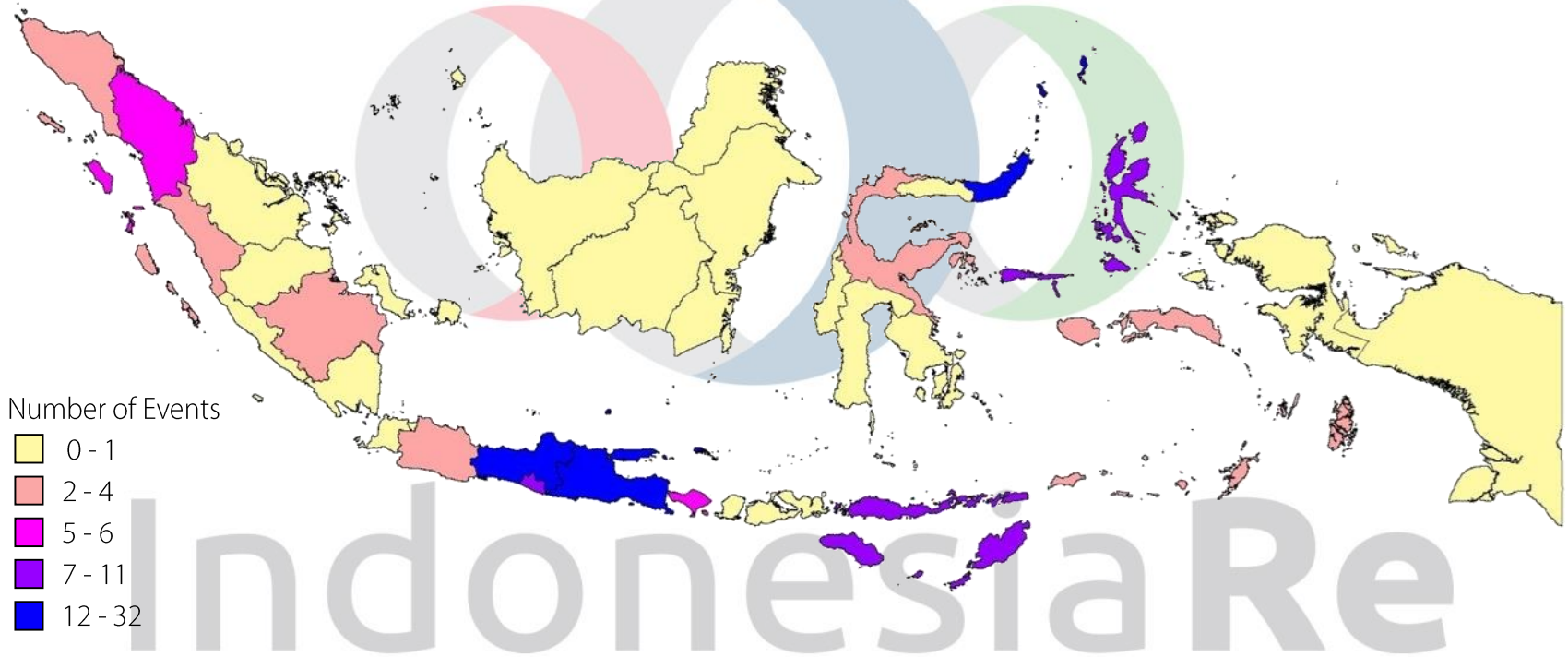
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BNPB

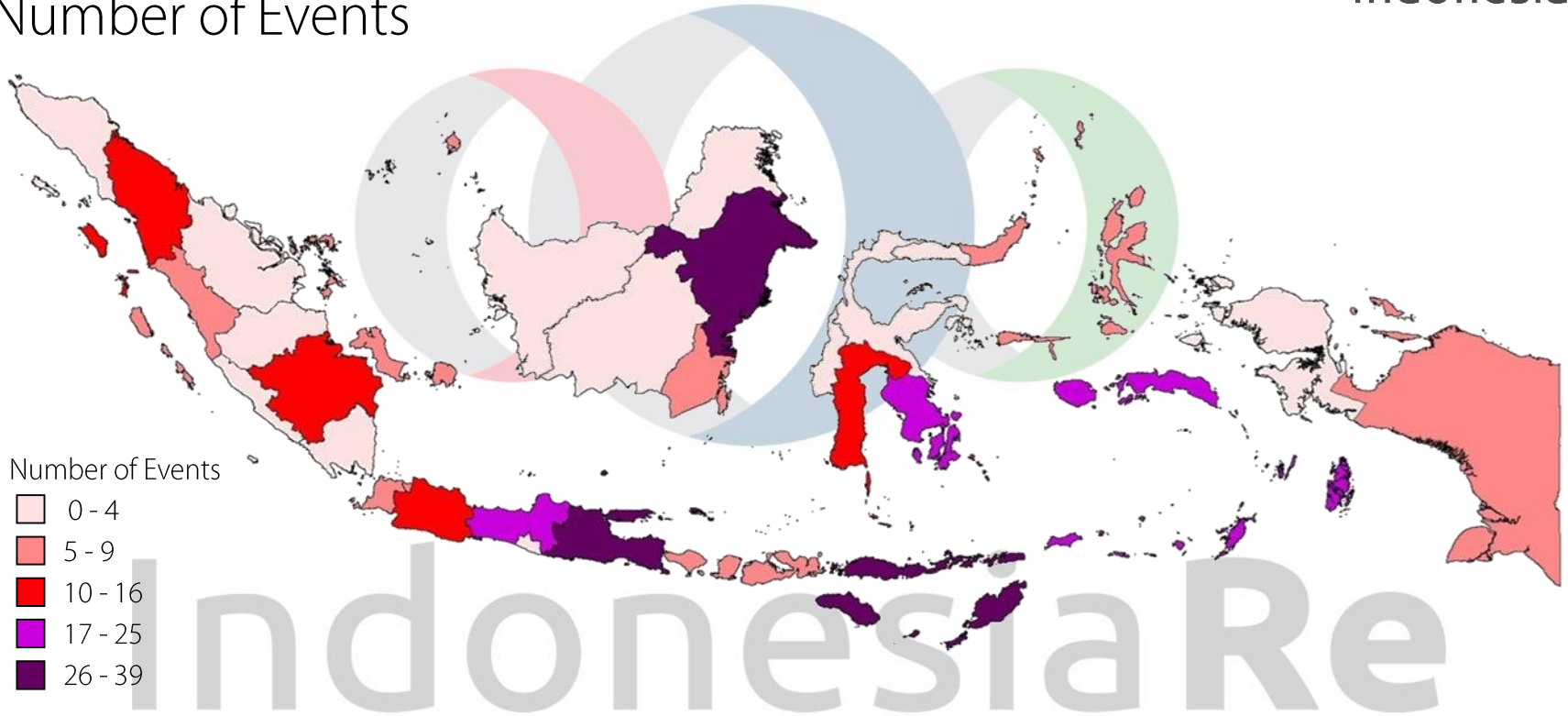
# Catastrophe Events (Volcanic Eruption)

## Number of Events (Last 100 Years)



# Catastrophe Events (Transp. Accident)

## Number of Events

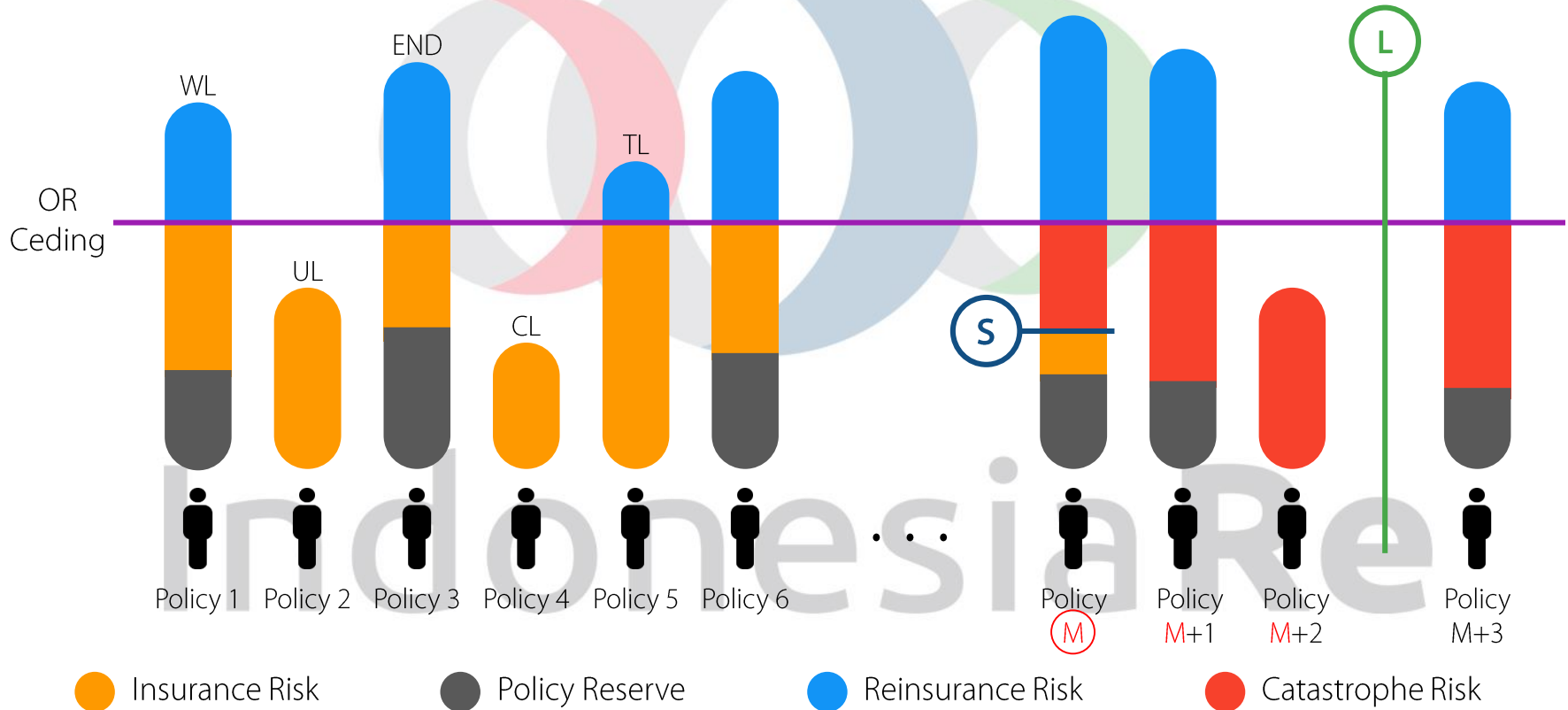


# Catastrophe Risk

## Portfolio in Life Insurance Company



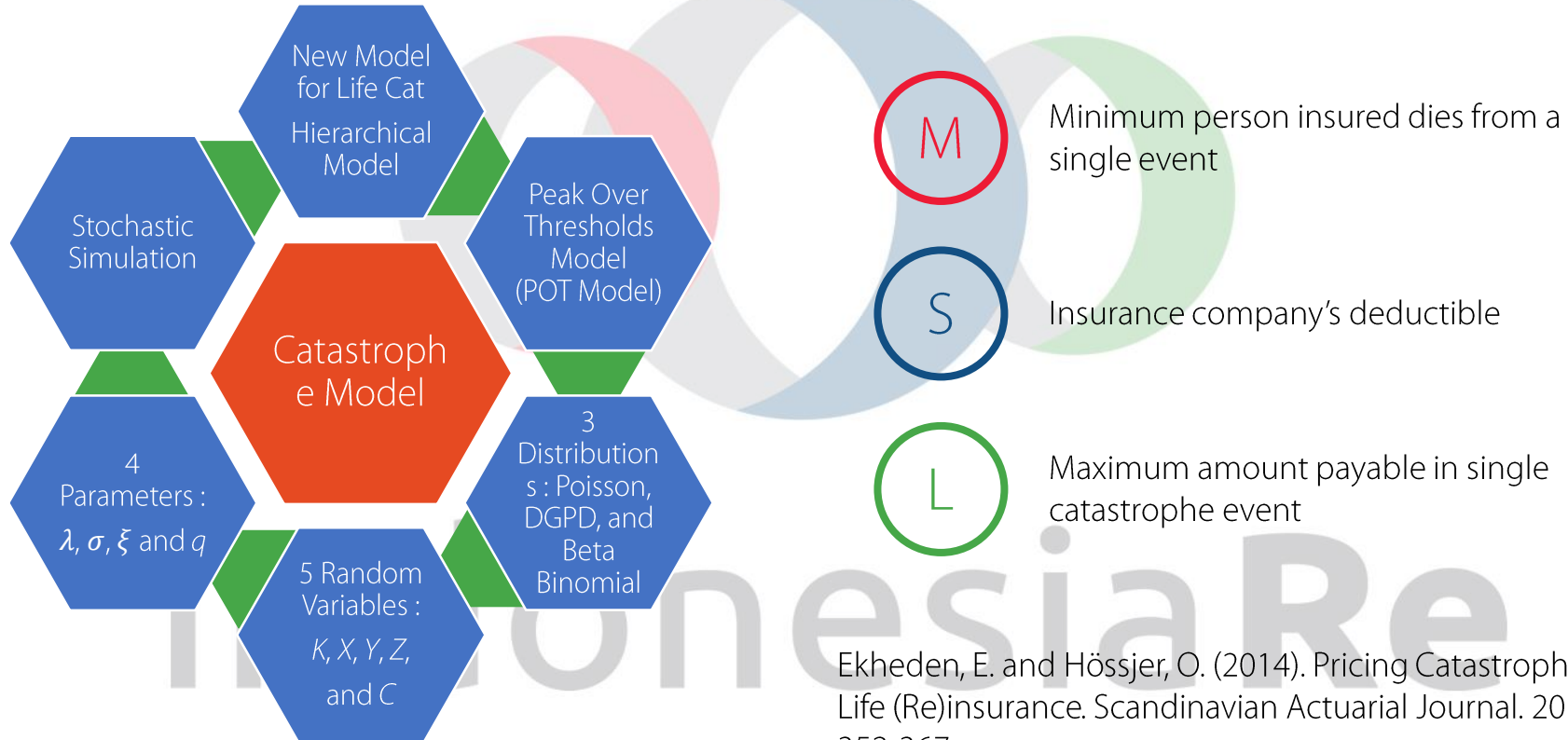
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# Catastrophe Model



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Ekheden, E. and Hössjer, O. (2014). Pricing Catastrophe Risk in Life (Re)insurance. *Scandinavian Actuarial Journal*. 2014:4, 352-367.



# Catastrophe Model

## Hierarchical Model

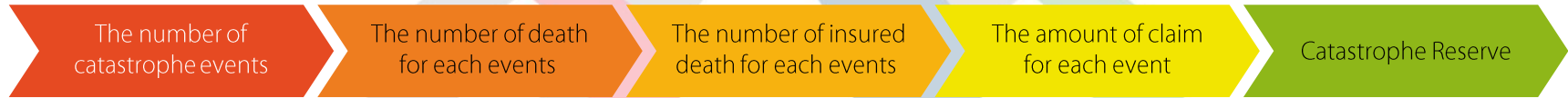
- 1** The number of catastrophe events   $K$ : Number of event catastrophe in 1 year
- 2** The number of death for each events   $X_k$ : Number of Death from the  $k$ th Catastrophe
- 3** The number of insured death for each events   $Y_k$ : Number of Insured Death from the  $k$ th Catastrophe
- 4** The amount of claim for each event   $Z_k$ : The Amount of Claim from the  $k$ th Catastrophe
- 5** Total Annual Claim   $C = \sum_{k=1}^K Z_k$

# Catastrophe Model

## Illustration of the Model



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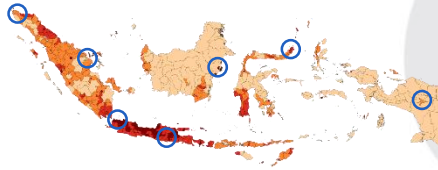




# Catastrophe Model

## The Models

The number of catastrophe events



$$K \sim \text{Poisson}(\lambda_M)$$

$\lambda_M$  is estimated by

$$\hat{\lambda}_M = \text{mean}(K_M)$$

The number of death for each events

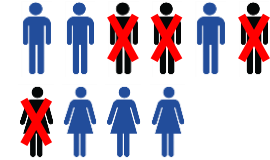


$$X_k \sim \text{DGPD}(M, \sigma_M, \xi_M)$$

DGPD: Discrete Generalized Pareto Distribution

$\sigma_M, \xi_M$  is estimated by Maximum Likelihood Method

The number of insured death for each events



$$Y \sim \text{BetaBinom}(X_k, q, d(X_k))$$

$q$  = Market Density

$$= \frac{\text{Number of sold policies}}{\text{Size of total population}}$$

$$d(X_k) = \log(X_k)\theta$$

$\theta$  is estimated by experience

$$Y_k = \begin{cases} Y; & Y \geq M \\ 0; & Y < M \end{cases}$$

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# Catastrophe Model

## The Models

The amount of claim for each event



Assume that sum insured for each person is identical

$$Z = Y_k \times \text{Insurance Risk}$$

$$Z_k = \begin{cases} 0 & ; Z < S \\ Z - S & ; S \leq Z < S + L \\ L & ; S + L \leq Z \end{cases}$$

Catastrophe Reserve



Total annual claim

$$C = \sum_{k=1}^K Z_k$$

Simulate C for certain number of simulation

$$\text{Reserve} = \text{TVaR}_p(C)$$

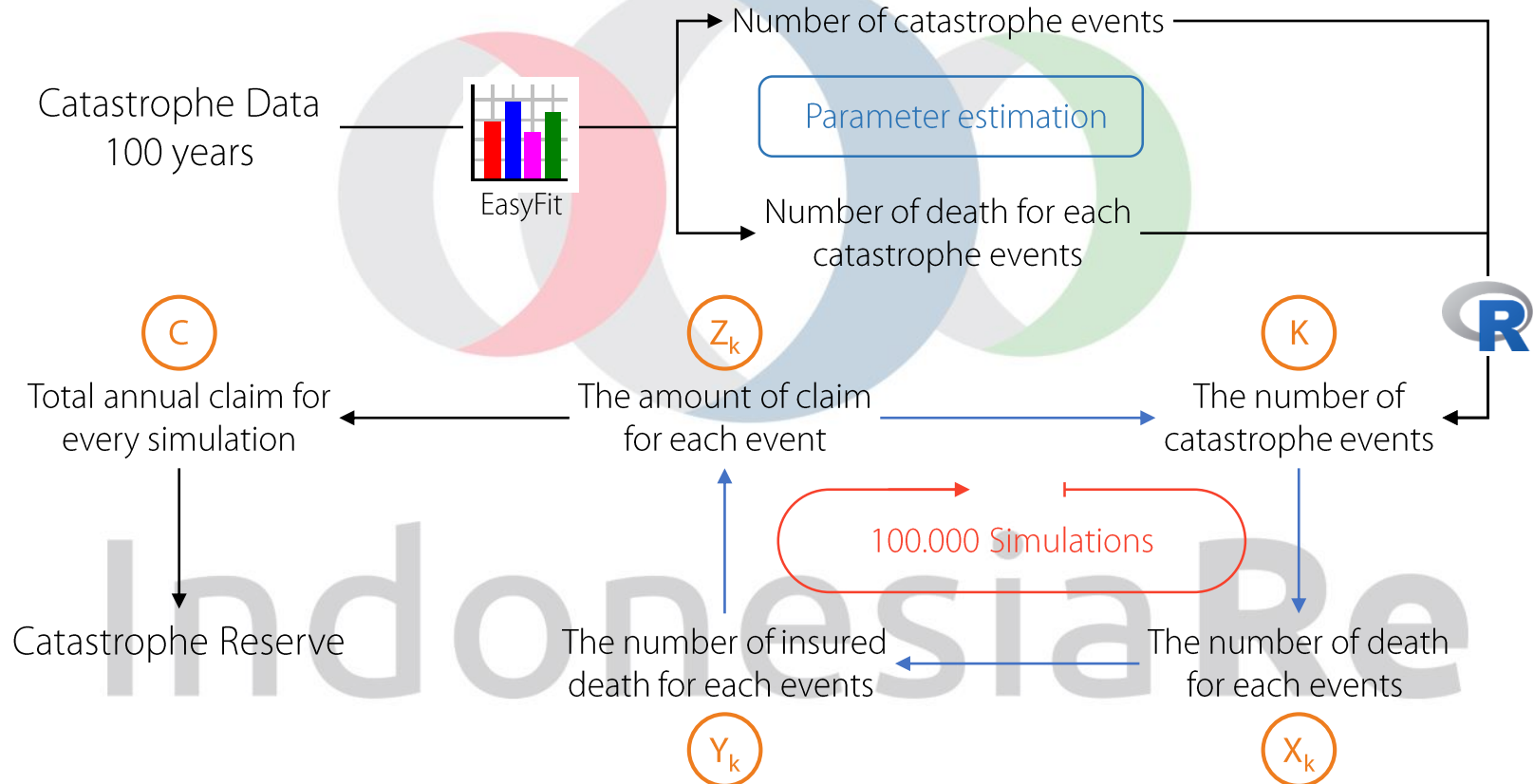
$$\text{VaR}_p(x) = \pi_p \rightarrow \Pr(x > \pi_p) = 1 - p$$

$$\text{TVaR}_p(x) = E(x | x > \pi_p)$$

# Catastrophe Model Simulation Procedure



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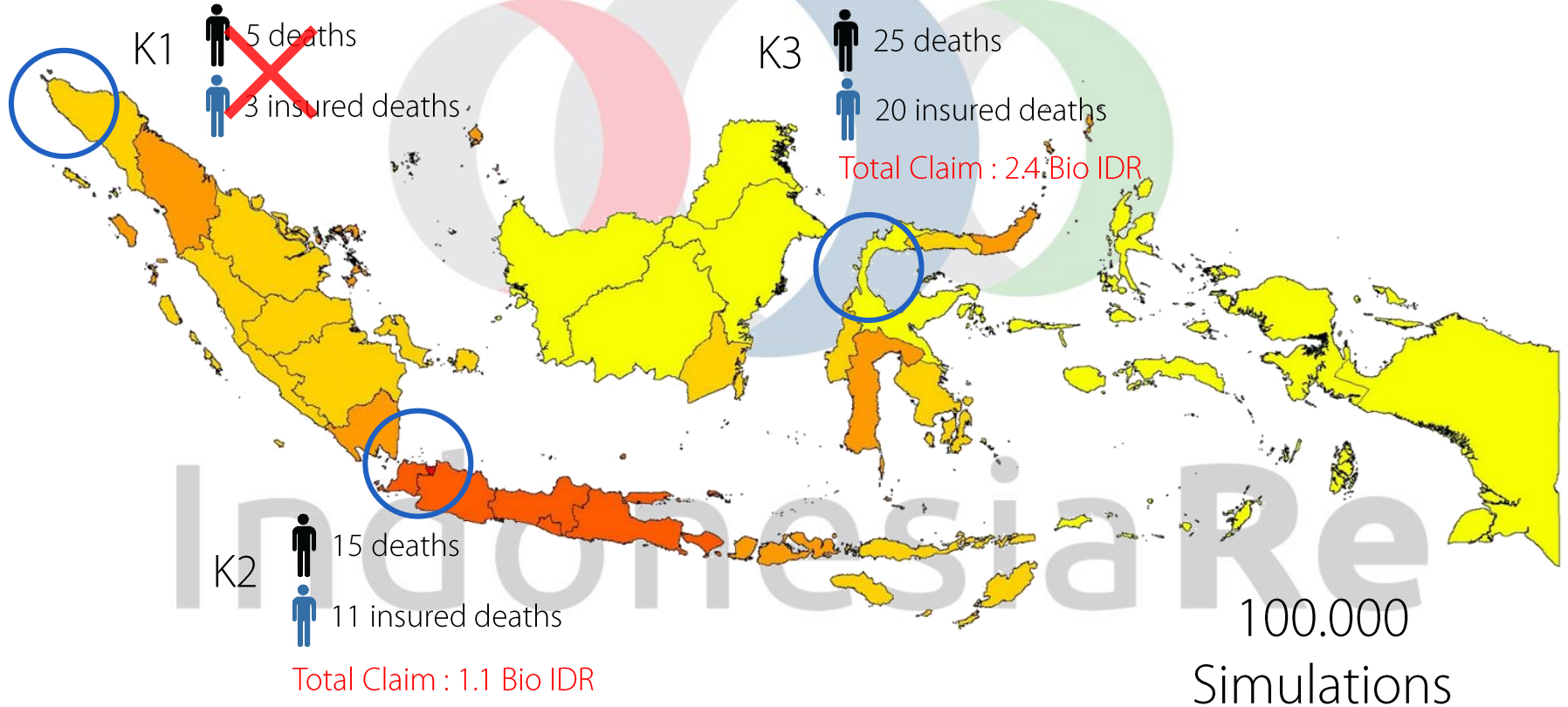


# Catastrophe Model

## Simulation of Event



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# Catastrophe Model

## Simulation of Event

Simulation 1

Variable	K1	K2	K3
Xk	5	15	25
Y	3	11	20
Yk	0	11	20
Z	0	1,100	2,400

Simulation 2

Variable	K1	K2	K3	...	K10
Xk	51	17	95		96
Y	43	8	75		17
Yk	43	0	75		17
Z	3,053	0	4,275		1,003

Simulation 99.999

Variable	K1	K2	K3	K4
Xk	35	14	90	93
Y	0	13	23	19
Yk	0	13	23	19
Z	0	897	1,380	1,273

Simulation 100.000

Variable	K1	K2	K3	...	K50
Xk	29	24	97		8
Y	16	1	26		2
Yk	16	0	26		0
Z	848	0	1,274		0

# Case Study



Company : ABC Life

ABC life intends to make a decision whether they should retain any catastrophe risk they have or transfer the catastrophe risk to the reinsurer.

- How much policies do they have? **8 million policies**
- How much exposure do they cover (in total)? **IDR 560 trillion**
- What is the definition of catastrophe risk they expect (number of fatalities in each event)? **Minimum 10 person in each event**
- Since they have a plan to transfer the cat risk to the reinsurer, how big is their deductible regarding the catastrophe event? **IDR 500.000.000,- per individu**
- From the reinsurer side, do they have limitation of maximum amount payable in single catastrophe event? **IDR 30.000.000.000,-**

# Life Catastrophe Reserve



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Company : ABC Life

10 death

Minimum person insured dies from a single event

5 bio

Insurance company's retention

30 bio

Maximum amount payable by the reinsurer

$$q = \text{Market Density} = \frac{\text{Number of sold policies}}{\text{Size of total population}} = 0.03$$

$$\text{Average Insurance Risk} = \frac{\text{Total exposure}}{\text{Total policies}} = 70 \text{ mio}$$

## Scenario A

Retaining any cat. risk they have

$$M = 10$$

Minimum person insured dies from a single event

$$S = L$$

Insurance company's retention

$$L = \infty$$

Maximum amount payable in single catastrophe event

## Scenario B

Transferring the cat. risk to the reinsurer

$$M = 10$$

Minimum person insured dies from a single event

$$S = 5 \text{ bio}$$

Insurance company's retention

$$L = 30 \text{ bio}$$

Maximum amount payable in single catastrophe event

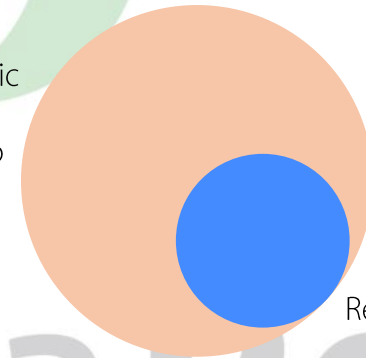
# Life Catastrophe Reserve

Scenario A  
Retaining any cat. risk they have



Scenario B  
Transferring the cat. risk to the reinsurer

Catastrophic  
Reserve  
IDR 16 bio

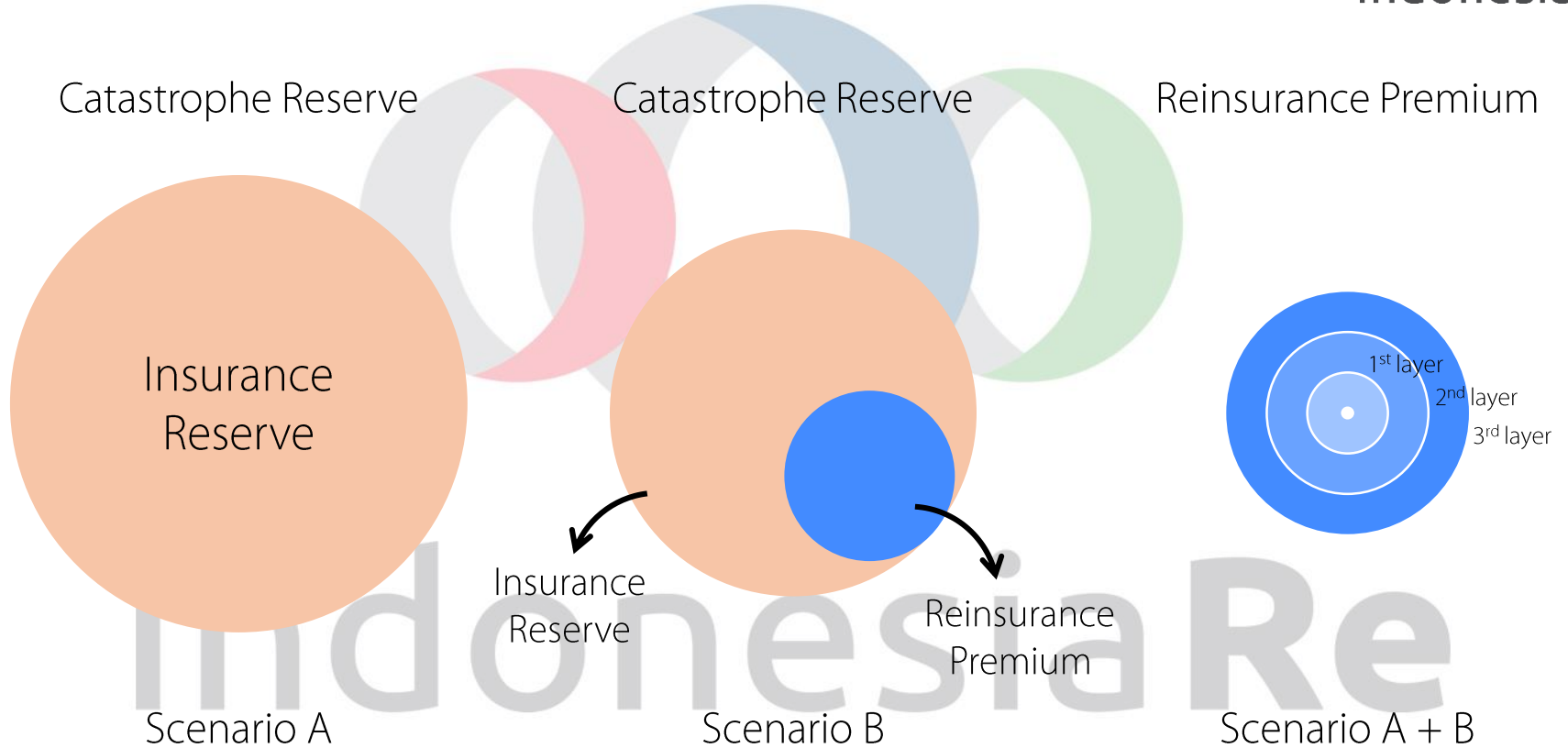


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# Life Catastrophe Reserve



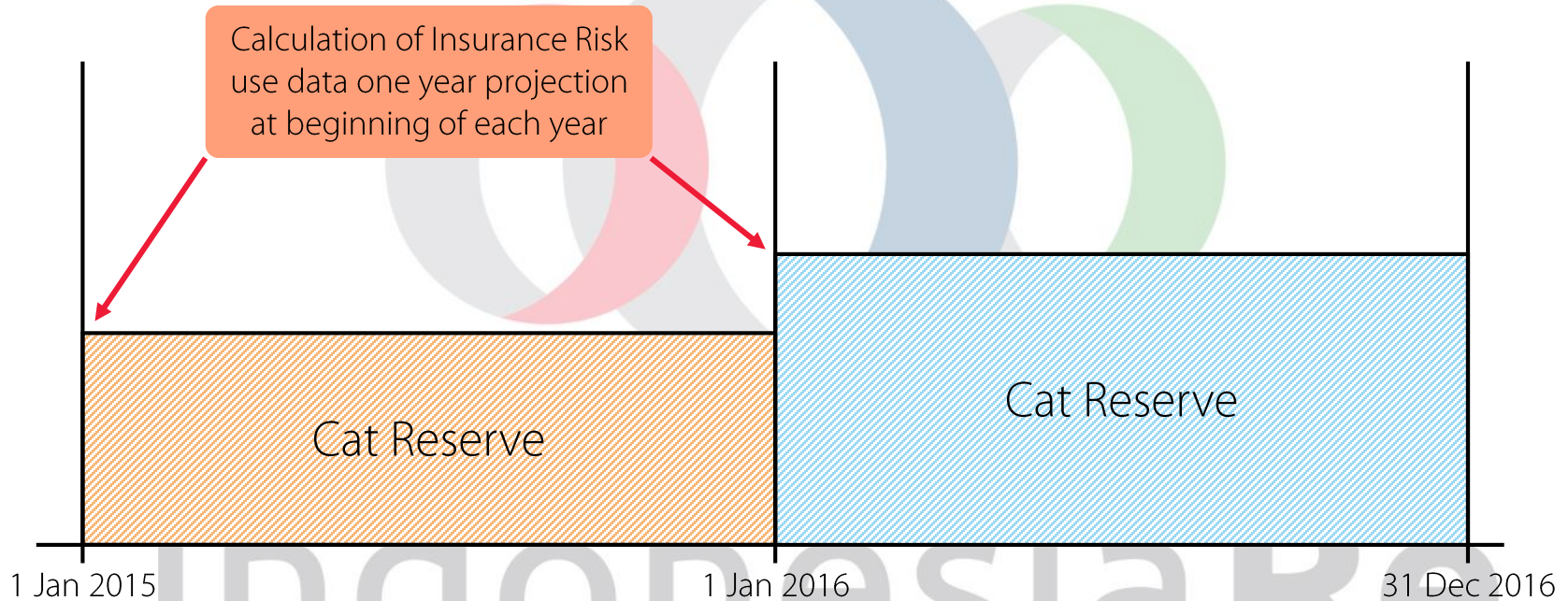
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# Life Catastrophe Reserve



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Komite Nasional Keselamatan Transportasi, Kementerian Perhubungan Republik Indonesia, <http://www.dephub.go.id/>.



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