



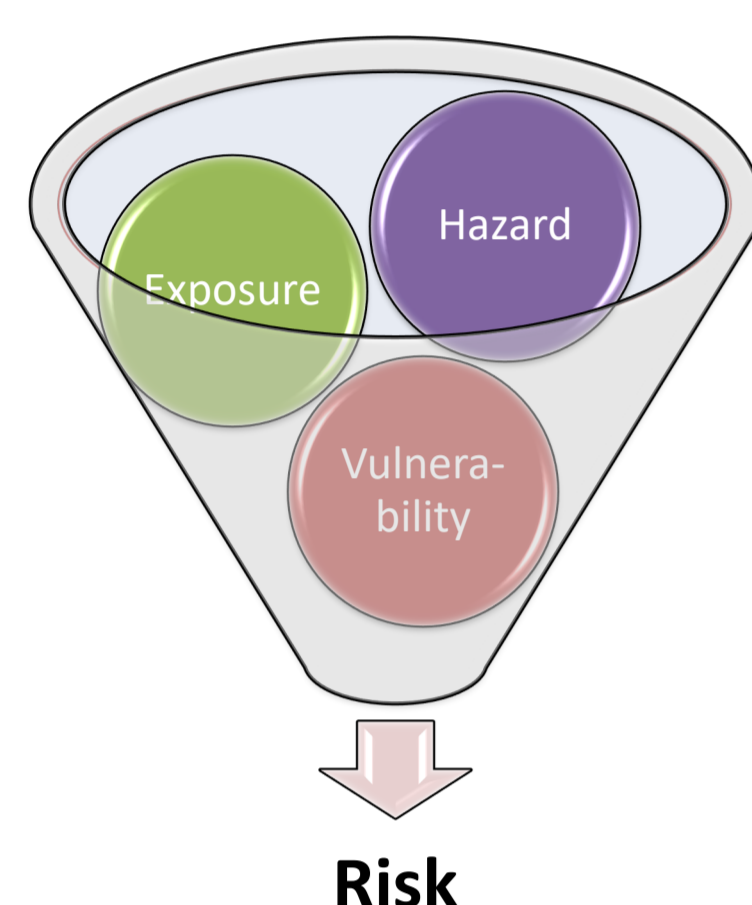
# Country-wide human-elephant conflict risk assessment under future climate-induced changes in Thailand

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**ABSTRACT:** Humans and the endangered Asian elephants are under increasing competition for resources which deteriorates the sustainability of both the species conservation efforts and human development. With the multi-dimensional nature of such conflicts and the impending effects from climate change, human-elephant conflict (HEC) management needs broader assessment beyond reactively addressing direct losses. Here, adopting risk framework along with future projections under Representative Concentration Pathways (RCPs) and Shared Socioeconomic Pathways (SSPs), we proposed HEC risk assessment framework and analyzed its spatial distribution under baseline (2000-2019) and near future (2025-2044) for Thailand. Across all future scenarios, we projected four forest complexes in northern Thailand with an average of 1.7%-7.4% increase in HEC risk due to higher hazard and vulnerability from more favorable habitat conditions and increasing drought probability. 69% of Thailand forest complex, especially in lower latitude, were projected with risk reduction due mainly to decreasing habitat suitability. Our proposed framework is flexible allowing additional sub-indicators and can be extended to other areas and targeted species.

## 1. BACKGROUND



- Some areas in Thailand, an average of **212 nights were annually spent by household in guarding crops** against elephant-raiding and the HEC-induced cost is significant compared to the average household income (Jarungrattanapong et al., 2017)
- Wildlife threats** are perceived as small frequent events and commonly neglected in disaster risk management policies (Gaillard, 2019), but they accumulate and erode society's ability to achieve sustainable development (UNISDR, 2015).
- Lack of landscape-scale assessment led to **incomplete awareness** of the situation and **short-sighted decision-making** (Gubbi et al., 2014; Goswami and Vasudev, 2017).

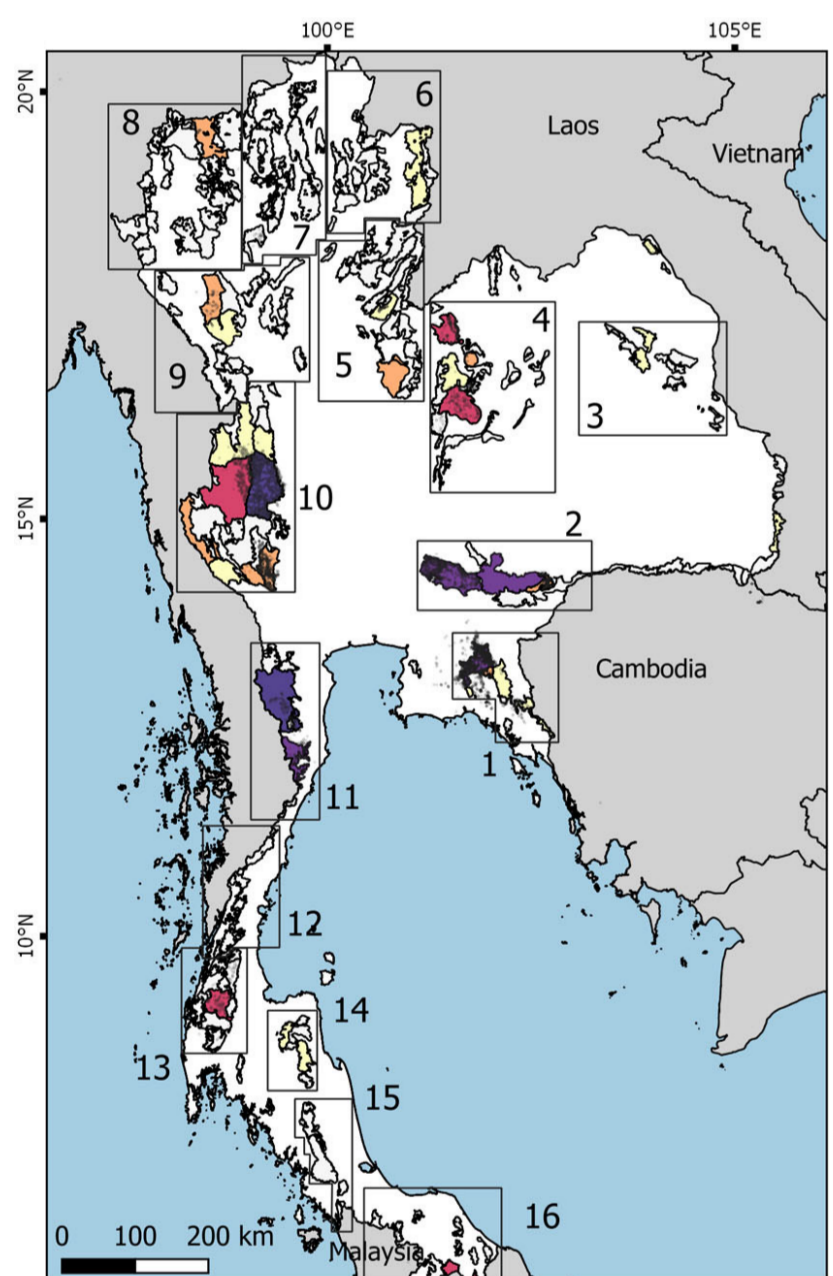
$$RISK = f(Hazard, Exposure, Vulnerability)$$

(UNISDR, 2015; IPCC, 2012; IPCC, 2014)

**HEC risk** is defined as **wild elephant occurrences (hazard)** in overlapping areas with **rural human population (exposure)** who possess various **vulnerable conditions (vulnerability)**.

**Objective:** Applied risk framework to quantify spatial distribution of HEC risk under baseline (2000-2019) and future (2025-2044) in Thailand

## 2. METHODOLOGY



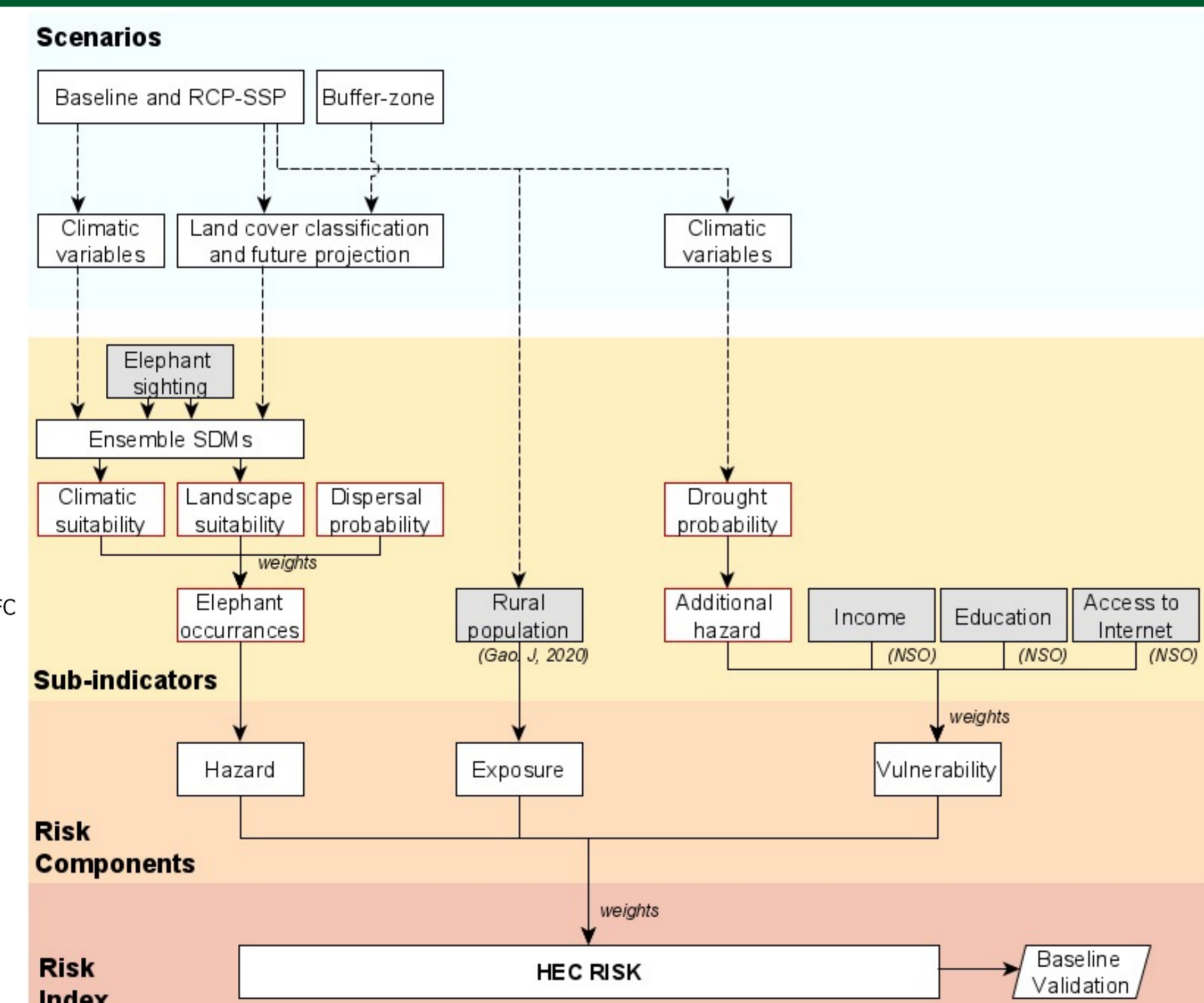
**Fig 1:** Distribution of terrestrial forest complex (FC) and the estimated wild elephant population.

**Table 1.** Four future scenarios in this study

| Buffer Zones | Climate Change                                   |                                    |
|--------------|--|------------------------------------|
|              | RCP4.5-SSP2<br>'Middle-of-the-road'              | RCP8.5-SSP5<br>'Business-as-usual' |
| Yes          | <b>A1</b><br>(no land conversion in buffer zone) | <b>A2</b>                          |
| No           | <b>B1</b>  | <b>B2</b>                          |

**Table 3.** Land cover and land features used

| Variables       | Dataset   | Spatial resolution | Temporal resolution |
|-----------------|---|--------------------|---------------------|
| <b>Baseline</b> |   |                    |                     |
| Land cover      |   |                    |                     |
| - Abandon       | Image classification from MOD09,  | 500 m              | 2014-2016           |
| - Crops         | SRTM,   | 90 m               | 2000                |
| - Plantations   | ALOS-PALSA (yearly composite)   | 25 m               | 2015                |
| - Built-up      |   |                    |                     |
| - Water         |   |                    |                     |
| Transport       | GRIP4 and Thai Railway  | Vector             | -                   |
| Water           | HydroSHED and JRC   | 30 m               | 2014-2016           |
| TRI             | SRTM  | 90 m               | 2000                |
| <b>Future</b>   |   |                    |                     |
| Land cover      | 1. Land demand projection based on IIASA trajectory and other assumptions, 2. Spatial allocation using CLUS model | 500 m              | 2045                |
| Others          | Assumed static  |                    |                     |



**Fig 2:** HEC risk framework, red-boxes are sub-indicators that were simulated in this study, gray boxes are directly obtained from existing data

**Table 2.** Climatic dataset used

| Variables             | Dataset   | Spatial resolution | Temporal resolution |
|-----------------------|---|--------------------|---------------------|
| Min temperature       | ERA5 reanalysis (Baseline)                                  | ~25 km             | Daily               |
| Max temperature       | NEX-GDDP (Future)   |                    |                     |
| Precipitation         |   |                    |                     |
| Bioclimatic variables | Drought indicators (KBDI <sub>standard anomaly</sub> > 1.5) |                    |                     |

**Table 4.** Future land demand projection assumptions

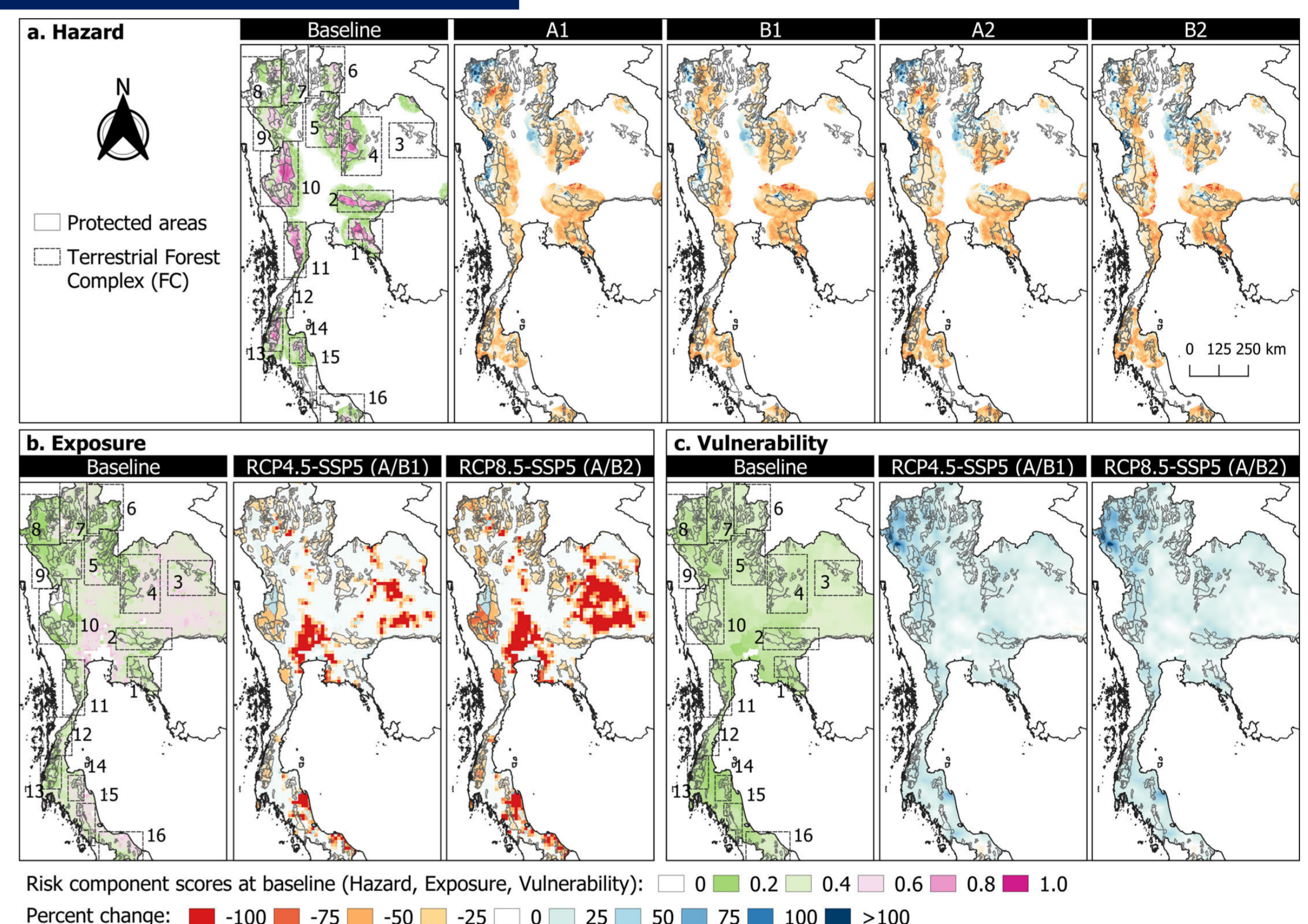
| LC Type     | Assumption  |
|-------------|---|
| Water       | Constant from 2015  |
| Built-up    | Gao, J. & O'Neill, B. C., 2020  |
| Forest      | Increase up to 40% (Master Plan, 2019)  |
| Agriculture | A function of production demand & yield production (tonnes) ( $R^2=0.9$ )<br>$Y_{SSP2,SSP5} = \beta_{p0} + \beta_{p1}x_1 + \beta_{p2}x_2 + \beta_{p3}x_3$<br>Yield (tonnes/ha) ( $R^2>0.7$ )<br>$Y_{SSP5} = \beta_{y0} + \beta_{y1}x_2$<br>$Y_{SSP2} = \frac{2}{3}Y_{SSP5}$<br>$x_1$ : agriculture to GDP (%), $x_2$ : GDP.PPP, $x_3$ : rural pop |
| Abandon     | Fulfill after other land demands are met  |

$$\text{Normalization: } I'_i = \frac{X_i - \min(X)}{\max(X) - \min(X)}$$

$$\text{Index aggregation: } CI_i = \left( \prod_{i=1}^n I'_i w_i \right)^{\frac{1}{\sum_{i=1}^n w_i}}$$

## 3. RESULTS & DISCUSSIONS

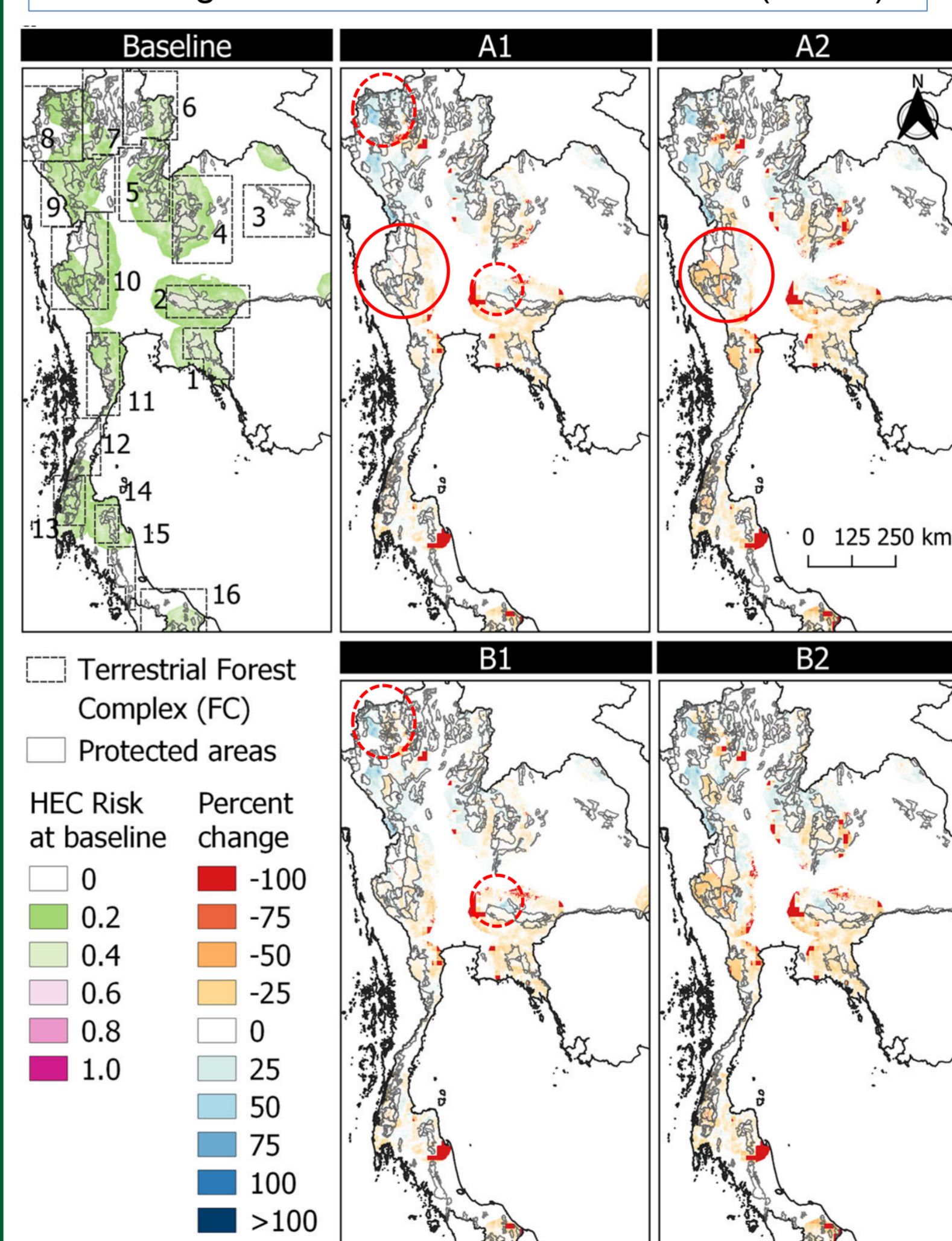
Validation of baseline risk: average AUC = 0.71 ± 0.01



**Fig 3.** Spatial distribution of baseline risk components including Hazard (a), Exposure (b), and Vulnerability (c) along with their average percent change under future scenarios.

An average 1.7% to 7.4% increase in risk (4 FCs)

An average -3.1% to -57.9% risk reduction in 11FC



**Fig 4.** The HEC risk for baseline and percent change under four future scenarios.



**Fig 5.** Boxplots of the future HEC Risk and underlying components including Hazard, Exposure, and Vulnerability. The red triangle represented the baseline value.

## 4. CONCLUSIONS & FUTURE WORK

- The proposed framework can identify degree and direction of changes in HEC risk.
- Future policies can base on projected maps to
  - limited human access in areas with existing low human population but high future HEC risk [north],
  - implement habitat restoration in area with currently high elephant population but lower future habitat suitability [eastern FC, western FC, and southern region].
- More broadly, the findings attested the importance of climate change consideration in conservation planning which showed to impact both wild elephants and humans.
- Spatial policy like buffer zones can create both negative and positive impacts on HEC risk. More specific policy should be evaluated.
- Future work can expand variable that represent human dimensions and obtain validation from other locations

**REFERENCE** IUCN Asian Elephant Specialist Group. Asian Elephant Range States Meeting: Final Report. Jakarta, Indonesia (2017). UNISDR. Making Development Sustainable: The Future of Disaster Risk Management. Global Assessment Report on Disaster Risk Reduction. Tech. Rep., United Nations Office for Disaster Risk Reduction (UNISDR), Geneva, Switzerland (2015). IPCC. National systems for managing the risks from climate extremes and disasters, vol. 9781107025 (2012). IPCC. Summary for Policymakers. In Field, C. B. et al. (eds.) Climate Change Impacts, Adaptation and Vulnerability - Contributions of the Working Group II to the Fifth Assessment Report, 1-32, (2014). Leimgruber, P. et al. Fragmentation of Asia's remaining wildlands: Implications for Asian elephant conservation. Animal Conserv. 6, 347-359. Jarungrattanapong, R., Olewiler, N. & Nabangchang, O. A payment for ecosystem services program to support elephant conservation and reduce human-elephant conflict in Thailand. chap. 10, 1-13 (World Agroforestry Centre (ICRAF), Nairobi, 2017).