



Towards unraveling total subsidence of a mega-delta – the potential of new PS InSAR data for the Mekong delta

Philip S. J. Minderhoud^{1,2}, Ivana Hlavacova³, Jan Kolomaznik³, and Olaf Neussner⁴

¹Department of Physical Geography, Utrecht University, Utrecht, the Netherlands

²Department of Subsurface and Groundwater Systems, Deltares Research Institute, Utrecht, the Netherlands

³Gisat s.r.o., Milady Horakove 57, 170 00 Prague 7, Czech Republic

⁴Deutsche Gesellschaft für Internationale Zusammenarbeit (GIZ),
Friedrich-Ebert-Allee 36, 53113 Bonn, Germany

Correspondence: Philip S. J. Minderhoud (p.s.j.minderhoud@uu.nl)

Published: 22 April 2020

Abstract. Total subsidence in deltaic areas is the cumulative effect of a range of driving mechanisms, both natural and anthropogenic. The populous and low-lying Vietnamese Mekong delta is facing accelerating subsidence rates and effective mitigation strategies are urgently needed to save-guard the future sustainability of the delta. This paper gathers results from existing measurements and estimates of subsidence in the Mekong delta and presents new, delta-wide datasets of PSI observations of vertical velocity from 2014–2019. We describe the practical application of this new data in ongoing projects in Vietnam and outline a planned approach to determine depth-dependent subsidence rates, using this new dataset in combination with field surveys and physics-based numerical models, to advance towards improved quantitation of the contributions of individual subsidence mechanisms.

1 Introduction

1.1 Causes of land subsidence in deltas

Land subsidence in deltas can be caused by a range of drivers and processes. The actual subsidence that occurs and contributed to surface elevation change over time, is the sum of all processes. Land subsidence in deltas occurs because of natural processes, like the compaction of soft, unconsolidated sediments over time and with increased overburden load (e.g. new sediments or seasonal flooding), oxidation of organics, but also as a result of tectonic movements. Human activities can enhance the natural subsidence or trigger new processes, for example, by extracting fluids (decreasing pore-pressure), lowering of the surface water table or by adding weight to the surface by buildings or infrastructure. All these mechanisms act on different temporal and spatial scales, creating a complex subsidence response of an entire delta. To develop detailed adaptation and mitigation strategies for sub-

siding deltas subsidence measurements need to be untangled into different processes and drivers to gain understanding on where, how much and why individual subsidence drivers cause subsidence locally.

The populous Vietnamese Mekong delta, like many other deltas worldwide, is facing increased rates of subsidence during the past decades. Dedicated research focused on quantifying rates, drivers and processes have greatly increased insights and the availability of subsidence data in recent years. The Mekong delta is experiencing relatively high rates of natural compaction of its young, Holocene sediments (Zoccarato et al., 2018). On top of this, human activities and economic development during the past decades have led to intensification of agricultural practices and urbanization of the delta. Intensification of land use change from a natural to more human dominated land-use correlated to increasing rates of observed land subsidence (Minderhoud et al., 2018) as anthropogenic drivers, enhancing and triggering subsidence processes increased. One of the large drivers of the

subsidence rates presently experienced, was the steady increase in groundwater extraction since the 90's from its thick, locally over 500 m, multi-aquifer system (Minderhoud et al., 2017). As new elevation data revealed that the deltas elevation relative to local sea level is even lower than previously assumed (on average the delta plain is elevated only ~ 80 cm above local sea level) (Minderhoud et al., 2019), the accelerating subsidence rates strongly increase the vulnerability to sea-level rise-induced flooding, salinization (Eslami et al., 2019), coastal erosion and, ultimately, threaten the livelihood of 18 million delta inhabitants with permanent inundation (Minderhoud et al., 2020).

Quantifications of land subsidence are scarce in the Mekong delta and generally do not cover long measurement periods. In recent years, several direct and indirect measurements and derived quantifications on surface level lowering, the result of land subsidence, became available both from remote sensing sources (sensors on satellites) and (in)direct ground-based measurements (Table 1).

In this paper, we present new Persistent Scatterer Interferometry (PSI) data for the Mekong delta created by Gisat, through an EU's Copernicus Emergency Management Service – Risk & Recovery Mapping activation by the German International Cooperation Agency (GIZ) and Geological Survey (BGR). We explain the methodology, present the resulting InSAR-based subsidence estimates and discuss an example of practical application of the data in DEM projections as done in ongoing development projects. Finally we discuss the proposed approach to move forward towards interpreting the new PSI estimates to arrive at depth-dependent subsidence rates, which is the next step towards unraveling specific subsidence processes and mechanisms.

2 New subsidence estimates for the Mekong delta based on PS InSAR

Recently, new datasets of PSI-based subsidence estimates for the Mekong delta became available. This InSAR-based subsidence monitoring was carried out under the framework of Copernicus Emergency Management Service (© 2018, 2019 European Union), EMSN057: “Ground subsidence Analyses, Mekong Delta, Vietnam”, and EMSN062: “Assessing changes in ground subsidence rates, Mekong Delta, Vietnam”. EMSN057 focused on mapping areas of three cities in the Delta in high detail, i.e. density of detected persistent scatterer (PS) points: Ca Mau, Long Xuyen and Rach Gia (approximately 20×20 km large rectangles centered in the cities), while EMSN062 aimed at mapping of the whole Delta (more than 40 000 km²) at lower detail.

2.1 Methodology

Land subsidence was mapped using time series of Sentinel-1 SLC images from descending track 18. Time series covered period from October 2014 to January 2019 or September

2018 in case of EMSN057 respectively. In total more than 180 images were acquired, stacked and analyzed by PS InSAR (Persistent Scatterer Interferometry) technique. Images were first co-registered to optimal master image using TanDEM-X DEM and precise orbital information to achieve sub-pixel accuracy. In the next step atmospheric delay was estimated as the low-pass component of the phase residuals from displacement estimations on set of points with the lowest amplitude dispersion. In case of EMSN057, every city was processed separately and reference points were selected individually for each processed area. Therefore, their stability and comparability of absolute figures of estimated subsidence rates between areas and with EMSN062 could not be guaranteed. In EMSN062, the reference point was selected in the hilly area at the border with Cambodia, whose rock outcrops are supposed to be stable in contrast to the most of the Delta. In this case, each data swath was originally processed separately but due to deteriorating PS's quality at the swath edges each swath was divided into two sub-areas. Therefore, six sub-areas were processed independently and results were merged at the end of processing assuring each sub-area was referenced to the common stable reference point. Due to size of the Delta, density of resulting PS points could not be as high as for 3 cities and their number was reduced by application of thresholding considering amplitude stability and coherence. Standard PS InSAR (Ferretti et al., 2001) algorithm implemented in the SARProZ© was applied on each point in order to estimate the displacement rate (average annual velocity), its standard deviation, displacement time series and other attributes. The rate was estimated using linear displacement model assuming that characters of displacement trends are mostly linear in time and that their magnitude is significantly smaller than 2.8 cm per acquisition frequency, i.e. half of SAR sensor's wavelength per 12 d until September 2016 and per 6 d afterwards. Displacements were measured in satellite's line of sight (LOS), which ranged from 30–45° from the vertical direction. Subsidence rate was recalculated from LOS to vertical plane direction under assumption that most of PS points in the Delta should be subject to subsidence while not possessing significant displacement component in horizontal direction. Each point was accompanied by attributes associated to quality of detected variables and showing the trend of detected ground displacement in time. As there had been many construction activities in the Delta during 2014–2019 period, each point was supplied with additional information about the start and the end date of the reflector estimated using evolution of detected radar intensity signal.

2.2 PSI-estimates of subsidence rates

The detected movement of the persistent scatterers was used to estimate vertical velocity of the objects (Fig. 1). Generally, there is higher PS point density in urbanized area, while considerably lower density in rural or natural landscapes. Initial

Table 1. Overview of the existing subsidence observations in the Mekong delta.

Subsidence observations	Description	Reported subsidence rates	Institutions	Reference
Satellite-based estimates	InSAR-based estimates for large parts of the Mekong delta (monitored period: 2006–2010)	10–40 mm yr ⁻¹	Stanford University, USA	Erban et al. (2013, 2014)
	PS InSAR-based estimates for parts and large part of the Mekong delta (monitored period: 2014–2019)	20–50 mm yr ⁻¹ (Build-up areas) 0–20 mm yr ⁻¹ (Agricultural areas)	Gisat, Czech Republic. In Framework of Copernicus Emergency Management Service – Risk & Recovery Mapping	ESMN-057 (2018) ESMN-062 (2019)
Direct in-situ measurements	Relative Surface Elevation Table (RSET) founded at –20 m at Ca Mau cape and the Bessac river mouth in mangrove forests	13.4–46.2 mm yr ⁻¹ from 2010–2014 for the first 20 m.	Brisbane University, Australia	Lovelock et al. (2015)
	Additional Surface Elevation tables with foundation at 40 m depths	No data	Ho Chi Minh University of Technology (HCMUT) and other Universities	Results are not yet published
	Subsidence monitoring stations (3) in Ca Mau founded at 100 m depth (installed in 2017)	24 and 31 mm yr ⁻¹ from 2017–2019 for the first 100 m. (Third station malfunctions)	Norwegian Geotechnical Institute (NGI) with Vietnam Institute of Geosciences and Mineral Resources (VIGMR)	Karlsruud et al. (2017), Karlsruud (2019), Karlsruud and Vangelsten (2017)
	Survey of National benchmarks (2005–2014/2015/2017)	Up to > 50 mm yr ⁻¹	Department of Survey and Mapping	Published in internal MONRE report
	Geological survey of unfounded surface benchmarks	Up to several cm yr ⁻¹	South Division of Mineral Resources and Geology (DSMG), Ho Chi Minh City	Do et al. (2015) (in Vietnamese)
Indirect in-situ measurements	River stage measurements (1993–2014) and derived subsidence	17.1 mm yr ⁻¹ (Average subsidence)	Tokio Institute of Technology, Japan	Fujihara et al. (2015) Takagi et al. (2016)

general findings are in line with patterns and outcomes identified by previous studies (Erban et al., 2014; Minderhoud et al., 2018) though quantitative assessment still needs to be conducted: subsidence hot spots are located mostly in built-up areas with average annual subsidence rates ranging from 20–50 mm yr⁻¹ and agriculture areas are being affected to lesser extent with rates amounting to 0–20 mm yr⁻¹.

The results of the two datasets each serve their own purpose in application. The EMSN062 results facilitate comparative assessment of subsidence patterns at regional level with high reliability. They reveal areas more prone to subsidence and may be assessed in conjunction with built-up, land use or groundwater extraction information for the whole Delta. However, point density is insufficient for analysis at local level, e.g. for individual city. As demonstrated for 3 cities this gap is bridged by results from localized and detailed analysis from EMSN057. As shown in Fig. 2, some small and many medium-size buildings were covered by one more multiple detected PS points. High variability of subsidence rates was detected at very local (building-to-building) level in all analyzed areas. Such micro-level variability are likely caused by subsoil compaction due to different load contributions of infrastructure and buildings depending on their size, built-up material, foundations and also the object's age.

2.3 Vertical velocity of individual buildings or infrastructure

The high spatial resolution provided by the Sentinel-1 derived InSAR data allows the identification of vertical motion rates of objects on the ground. Horizontal inaccuracies in the dataset make it difficult to attribute specific PSI points to individual houses in dense urban settlements. It is however possible to correlate specific PSI point to larger buildings or free standing objects, like high-voltage power pylons in a rice paddy. Data from the EMSN057 dataset is especially suitable to identify individual objects because of the higher PSI density and provides, for the first time in the Mekong delta, to compare velocity difference between different, adjacent objects which provides relevant information on depth-dependent subsidence (Fig. 3). The relation between objects acting as PSI points and actual subsidence of the surrounding delta surface does not correlate one-on-one as objects may sink faster or slower, depending on structural weight and foundation depth.

Preliminary, qualitative in-situ field observations show that roads, parking spaces and similar infrastructure have the same subsidence rates as nearby ground. Small buildings with few floors show mostly similar rates of sinking as roads while most bigger, taller buildings tend to have significantly

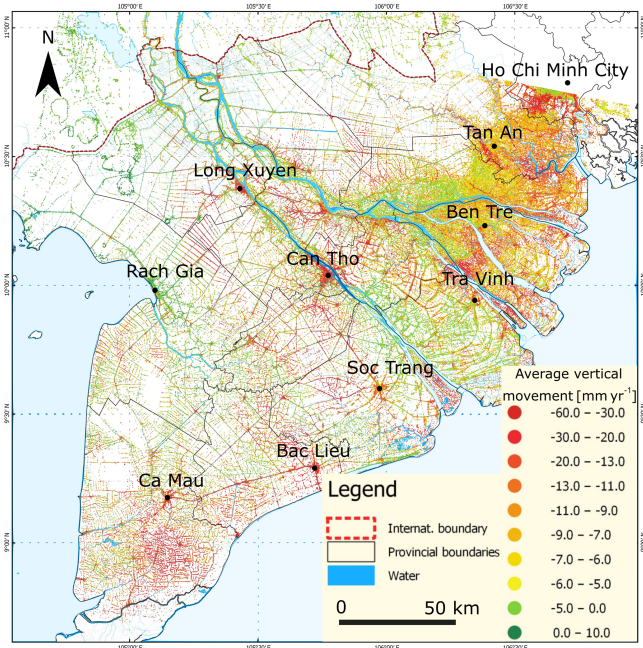


Figure 1. PSI-estimated average subsidence velocity in the Mekong Delta between 2014 and 2019. Based on Copernicus Emergency Management Service product (© 2019 European Union), [EMSN062] Mekong Delta, Vietnam: Average Subsidence Velocity map.

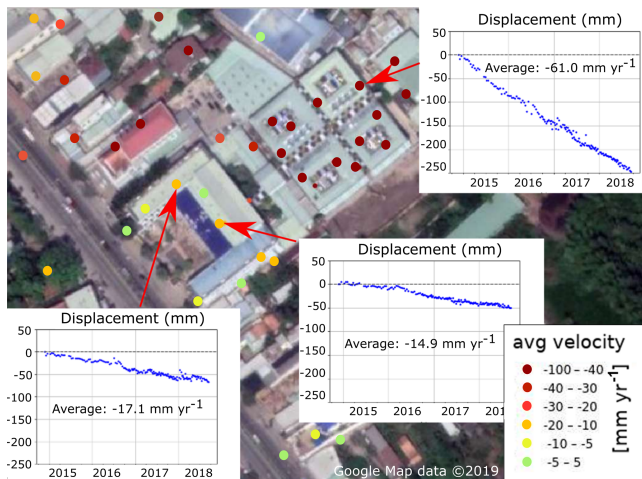


Figure 2. Estimated average subsidence velocity rate of movement in the area of Long Xuyen hospital. Subsidence rates are assigned to individual buildings. Outcomes of PS InSAR analysis were confirmed by field validation. Based on products of Copernicus Emergency Management Service (© 2018 European Union), [EMSN057] Long Xuyen, Vietnam: Average Subsidence Velocity map. © Google Maps.

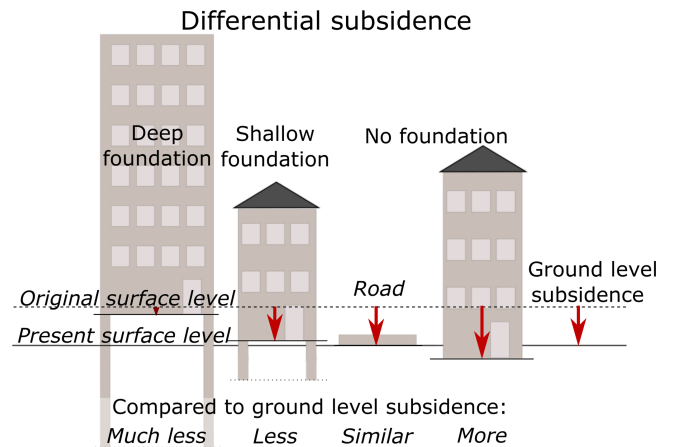


Figure 3. Differential subsidence of individual objects and their relation between foundation depth and weight. Combining this relation with the PSI-estimated subsidence rates can be used to investigate and quantify depth-dependent subsidence rates.

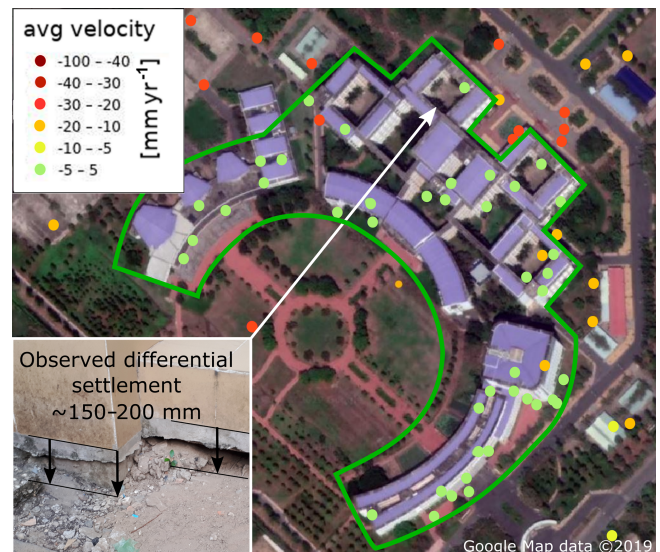


Figure 4. PSI-estimated average subsidence velocity of An Giang University buildings in Long Xuyen. Subsidence rates are assigned to individual buildings. The founded buildings (green outline) subside at a speed of $\sim 0.5 \text{ mm yr}^{-1}$ while the surrounding area subsides at a rate of $\sim 20 \text{ mm yr}^{-1}$, resulting in about 150–200 mm in ten years since construction (inset photo). Outcomes of PS InSAR analysis were confirmed by field validation. Based on products of Copernicus Emergency Management Service (© 2018 European Union), [EMSN057] Long Xuyen, Vietnam: Average Subsidence Velocity map.

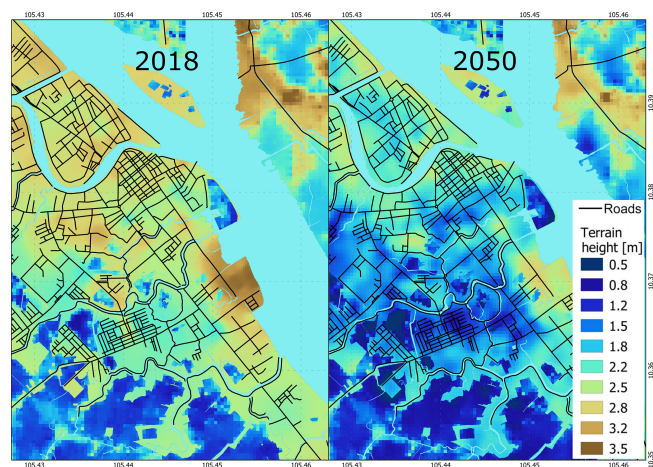


Figure 5. Elevation map of Long Xuyen city in An Giang province in 2018, based on leveling survey in 2010, corrected to 2018 using additional survey data and new PSI estimates. And elevation projected for 2050, following subtraction of interpolated PSI-estimated subsidence rates. The projected DEM is used to evaluate future urban flood resilience and drainage capacity of the city.

lower subsidence rates, likely related to a deeper foundation depth. The University of An Giang in the city of Long Xuyen, constructed ten years ago, is an example of a building complex with significantly lower subsidence rates compared to nearby roads and open spaces. The university buildings move downward with $\sim 0.5 \text{ mm yr}^{-1}$ while the roads subside with $\sim 20 \text{ mm yr}^{-1}$ (Fig. 4).

2.4 Practical application of new PSI data to create elevation projections for urban flood analysis

The PSI data is used within the framework of the ongoing GIZ project: “Mekong Urban Flood Resilience and Drainage Programme” to create projections of elevation in three cities of the Mekong delta (Rach Gia, Long Xuyen, Ca Mau) to investigate the effect of subsidence on future urban flooding and drainage. The PSI-based subsidence estimates were projected, assuming a gradual reduction in rates of $1 \% \text{ yr}^{-1}$ (assuming settlement decreases over time with increasing compaction) and subtracting from the Digital Elevation Model (DEM) of the cities. Although interpolation of PSI points estimate leads to uncertainties, as individual points do not necessarily represent subsidence rates of its surrounding area, this approach does provide a reasonably well first estimate of future elevation.

GIZ used projected DEMs for the layout of the drainage systems for Ca Mau, Long Xuyen and Rach Gia with the aim of facilitating smooth operations at least until the middle of the century. For the city of Ca Mau it appears unlikely that purely gravity driven drainage systems will be viable. Within the next two decades relative sea-level rise will necessitate

the protection of the city with a ring of dykes and the use of pumps.

3 Approach towards unravelling the contribution of individual subsidence drivers in the Mekong delta

The new PSI-based estimates of subsidence of individual objects in the Mekong delta enable a detailed and, literally, in-depth analysis aimed to quantify depth-dependent subsidence rates, which is the next step towards quantitative unraveling measured subsidence rate for different driving mechanisms. Planned activities consist of measuring height differences in-situ during field (validation of PSI data) and correlating the results with the building’s age, foundation depth, estimated load, surrounding land use, (ground) water dynamics and geological setting. Through this depth-dependant subsidence rates can be correlated to (hydro)geological and lithological record and potentially up-scaled to the entire delta. These results will also provide valuable new insights to improve numerical models and therefore our predictive capabilities of process-based subsidence.

Data availability. All documents and data from the Copernicus Emergency Management Service – Risk & Recovery Mapping activations are available for EMSN057 (<https://emergency.copernicus.eu/mapping/list-of-components/EMSN057>, EMSN-057, 2018) and EMSN062 (<https://emergency.copernicus.eu/mapping/list-of-components/EMSN062>, EMSN062, 2019).

Author contributions. ON activated the Copernicus EMSN actions. IH and JK performed the InSAR analyses. All authors discussed the results. PSJM and ON jointly conceived the paper. PSJM drafted the paper and all authors contributed and edited the manuscript.

Competing interests. The authors declare that they have no conflict of interest.

Special issue statement. This article is part of the special issue “TISOLS: the Tenth International Symposium On Land Subsidence – living with subsidence”. It is a result of the Tenth International Symposium on Land Subsidence, Delft, the Netherlands, 17–21 May 2021.

Acknowledgements. We would like to acknowledge Andreas Renck (German Institute for Geosciences and Natural Resources) and Fabian Löw for their role in the Copernicus Emergency Management Service – Risk & Recovery Mapping activation. And Ondrej Nalevka of Gisat for his contributions to the PSI analyses.

Financial support. Philip S. J. Minderhoud was supported by the Urbanizing Deltas of the World (UDW): “Rise and Fall” research project (grant: W07.69.105) funded by the Dutch scientific organization (NWO-WOTRO), Deltares Research Institute and TNO Geological Survey of the Netherlands. Olaf Neussner was supported by the “Mekong Urban Flood Resilience and Drainage Programme” funded by the Swiss State Secretariat for Economic Affairs (SECO) and the German Ministry for Economic Cooperation and Development (BMZ). Ivana Hlavacova and Jan Kolomaznik were supported through the Copernicus EMSN057 and EMSN062 activations.

References

- Do, V. L., Nguyen, D. V., Tran, V. T., Tran, V. N., Trinh, M. P., and Ma, C. C.: The primary results of monitoring of present aggradation and degradation in Song Cuu Long plain during 2013–2014 stage, Tap Chi Dia Chat – Loat A, 7–12, 83–94, 2015 (in Vietnamese, English summary).
- Erban, L. E., Gorelick, S. M., Zebker, H., and Fendorf, S.: Release of arsenic to deep groundwater in the Mekong Delta, Vietnam, linked to pumping-induced land subsidence, *P. Natl. Acad. Sci. USA*, 110, 13751–13756, <https://doi.org/10.1073/pnas.1300503110>, 2013.
- Erban, L. E., Gorelick, S. M., and Zebker, H. A.: Groundwater extraction, land subsidence, and sea-level rise in the Mekong Delta, Vietnam, *Environ. Res. Lett.*, 9, 091002, <https://doi.org/10.1088/1748-9326/9/8/084010>, 2014.
- Eslami, S., Hoekstra, P., Nguyen Trung, N., Ahmed Kantoush, S., Van Binh, D., Duc Dung, D., and van der Vegt, M.: Tidal amplification and salt intrusion in the Mekong Delta driven by anthropogenic sediment starvation, *Sci. Rep.*, 9, 18746, <https://doi.org/10.1038/s41598-019-55018-9>, 2019.
- ESMN-057: Copernicus Emergency Management Service – Risk & Recovery Mapping (ESMN) activation 057: Ground subsidence analyses, Mekong Delta, Vietnam, available at: <https://emergency.copernicus.eu/mapping/list-of-components/EMSN057> (last access: 25 March 2020), 2018.
- ESMN-062: Copernicus Emergency Management Service – Risk & Recovery Mapping (ESMN) activation 062: Assessing changes in ground subsidence rates, Mekong Delta, Vietnam, available at: <https://emergency.copernicus.eu/mapping/list-of-components/EMSN062> (last access: 25 March 2020), 2019.
- Ferretti, A., Prati, C., and Rocca, F.: Permanent Scatterers in SAR Interferometry, *IEEE T. Geosci. Remote*, 39, 8–20, <https://doi.org/10.1109/36.898661>, 2001.
- Fujihara, Y., Hoshikawa, K., Fujii, H., Kotera, A., Nagano, T., and Yokoyama, S.: Analysis and attribution of trends in water levels in the Vietnamese Mekong Delta, *Hydrol. Process.*, 30, 835–845, <https://doi.org/10.1002/hyp.10642>, 2015.
- Karlsruud, K.: Preliminary results of land subsidence monitoring in the Ca Mau province, Vietnam International Water Week (VACI), Conference Proceedings VACI 2019, 4, 2019.
- Karlsruud, K. and Vangelsten, B. V.: Subsidence and land loss in the Ca Mau province – Vietnam, Causes, consequences and mitigation options, *Geotechnical Engineering Journal of the SEAGS & AGSSEA Vol. 48*, ISSN 0046-5828, 2017.
- Karlsruud, K., Tunbridge, L., and Nguyen, Q.: Land subsidence in Ca Mau province, Vietnam. Results from phase 2 – pilot monitoring project, Norwegian Geotechnical Institute (NGI), Document no: 20120075-02-R, 2017.
- Lovelock, C. E., Cahoon, D. R., Friess, D. A., Guntenspergen, G. R., Krauss, K. W., Reef, R., Rogers, K., Saunders, M. L., Sidik, F., Swales, A., Saintilan, N., Thuyen, L. X., and Triet, T.: The vulnerability of Indo-Pacific mangrove forests to sea-level rise, *Nature* 526, 559–563, <https://doi.org/10.1038/nature15538>, 2015.
- Minderhoud, P. S. J., Erkens, G., Pham Van, H., Bui Tran, V., Erban, L. E., Kooi, H., and Stouthamer, E.: Impacts of 25 years of groundwater extraction on subsidence in the Mekong delta, Vietnam, *Environ. Res. Lett.*, 12, 6, <https://doi.org/10.1088/1748-9326/aa7146>, 2017.
- Minderhoud, P. S. J., Coumou, L., Erban, L. E., Middelkoop, H., Stouthamer, E., and Addink, E. A.: The relation between land use and subsidence in the Vietnamese Mekong delta, *Sci. Total Environ.*, 634, 715–726, <https://doi.org/10.1016/j.scitotenv.2018.03.372>, 2018.
- Minderhoud, P. S. J., Coumou, L., Erkens, G., Middelkoop, H., and Stouthamer, E.: Mekong delta much lower than previously assumed in sea-level rise impact assessments, *Nat. Commun.*, 10, 3847, <https://doi.org/10.1038/s41467-019-11602-1>, 2019.
- Minderhoud, P. S. J., Middelkoop, H., Erkens, G., and Stouthamer, E.: Groundwater extraction may drown mega-delta: projections of extraction-induced subsidence and elevation of the Mekong delta for the 21st century, *Environmental Research Communications*, <https://doi.org/10.1088/2515-7620/ab5e21>, 2020.
- Takagi, H., Thao, N. D., and Anh, L. T.: Sea-level rise and land subsidence: Impacts on flood projections for the Mekong Delta’s largest city, *Sustain.* 8, 1–15, <https://doi.org/10.3390/su8090959>, 2016.
- Zoccarato, C., Minderhoud, P. S. J., and Teatini, P.: The role of sedimentation and natural compaction in a prograding delta: insights from the mega Mekong delta, Vietnam, *Sci. Rep.*, 8, 11437, <https://doi.org/10.1038/s41598-018-29734-7>, 2018.