Risk of compound flooding substantially increases in the future Mekong River delta

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Abstract

Floods are consistently identified as the most serious global natural hazard, causing devastating loss of life and

- 15 economic damages that run into multiple billions of dollars each year. At the coastline, many flood disasters are in fact compound flood events, with two or more flood drivers occurring concurrently or in quick succession. In coastal regions the combined effect of fluvial (river) and coastal (storm-tides – storm surges plus high astronomical tides) floods together has a greater impact than if each occurred separately. Deltas in south-east Asia are particularly exposed to coastal compound floods as they are low-lying, densely populated regions subject to
- 20 both intense rainfall and tropical cyclone (TC) derived storm tides. For our study we used a sophisticated 1D river model, combined with 2D storm tide levels, to analyse past/present and future compound flood hazard and exposure for the Mekong River delta, one of the most flood-vulnerable deltas in the world. We found that with compound flooding a greater area of the delta will be inundated, and some parts will flood to greater flood depth. Central areas around Ang Giang and the Dong Thap provinces are particularly impacted in our plausible scenario
- 25 where a TC makes landfall near the mouth of one Mekong River distributary. In the future delta, the impact of compound flooding is potentially more significant, as the same compound flood scenario inundates a greater area relative to the present case, to greater depth in many locations, and floods last longer. Compound flooding therefore has clear implications for flood managers of the future delta, who will need to ensure that existing and future flood defences are to the right standard and in the right locations to offer effective protection against this 30 future risk.
	- 1 Introduction

The United Nations Office for Disaster Risk Reduction estimates that, between 2010 and 2019, a total of 1.65 billion people have been affected by flood events worldwide, with 104,614 deaths (UNDRR, 2020). A relatively large proportion of these deaths and losses have occurred in low-lying coastal regions, particularly in deltas. Water 35 related disasters are a major issue in deltas because, located at the nexus of the marine environment and major rivers, the land is exposed to flooding from both. Globally around 339 million people live on deltas – that is approximately 4.5% of the population living on just 0.57% of the Earth's land surface area (Edmonds et al., 2020).

Some global deltas are 'drowning' due to combinations of land subsidence (from groundwater extraction or the decline of fluvial sediment loads), sea-level rise, and changes in storminess associated with climate change

- 40 (Brown and Nicholls, 2015). This exacerbates flood risk, and it tends to be poorer delta inhabitants that are most vulnerable to its consequences. Their livelihoods are more likely to depend directly on the delta, their homes and assets are less protected, they are less financially resilient, and they are more prone to flood-related health impacts (Hallegate et al., 2016).
- 45 Flooding in deltas can be greatly exacerbated when two or more flood sources occur concurrently, or in close succession, resulting in disproportionately extreme events referred to as 'compound flooding' (Kew et al., 2013; Wahl et al., 2015; Ward 2018; Couasnon et al., 2020; Camus et al., 2021). The Intergovernmental Panel on Climate Change (IPCC) defines compound events as: (1) two or more extreme events occurring simultaneously or successively; (2) combinations of extreme events with underlying conditions that amplify the impact of the 50 events; or (3) combinations of events that are not themselves extremes but lead to an extreme event when
- combined (Seneviratne et al., 2012). Zscheischler et al., (2018) describes compound flooding as 'the combination of multiple drivers and/or hazards that contributes to societal or environmental risk'.
- Tropical, and sub-tropical, cyclones and storms deliver prime conditions for compound flooding depositing large 55 volumes of rainfall, and driving storm surges at the coast from strong winds and lowered air pressure. A number of destructive historic floods around deltas are now considered to have been compound events. When Super Typhoon Hato made landfall around Macao and Hong Kong on 23 August 2017, the intense rainfall, winds, astronomical tides and storm surges all combined to flood urban coastlines of the Pearl River Delta Estuary, China by up to 1.29 m. This affected 2.46 million people, with thirty two people declared dead or missing (Wang et al 60 2019). Just two days later, Hurricane Harvey landed in in Houston, Texas, USA. Intense rainfall over four days led to record rain depths over a wide area with the hurricane forcing a storm-tide of between 2.40 m and 3.05 m (8-10 ft) above Mean Higher High Water level at the coast (Chambers et al., 2018; Blake and Zelinsky 2018). Seventy people died in this complex flood that defied the standard classification - half the fatalities occurred beyond the Federal Emergency Management Agency's (FEMA's) designated 1:500-year flood zone extents 65 (Sebastian et al., 2017; Jonkman et al., 2018; Wahl et al., 2018; Valle-Levinson et al., 2020).

Despite the growing evidence, until relatively recently, few studies focused on compound flood hazard in large river deltas (Collins et al., 2019; Green et al., 2024). In delta environments, flood studies tended to assume a single flood driver such as a constant mean sea level boundary, leading to an underestimation of flood depths. However,

- 70 Eilander et al., (2020), created a global river model bounded by dynamic sea level conditions with storm surges, and found that compound effects influenced flood levels at the majority of coastal locations, for high probability events. Eilander et al., (2023) subsequently coupled a high-resolution 2D hydrodynamic Super-Fast INundation of CoastS (SFINCS) model, with CaMa-Flood (Yamazaki et al., 2013; Hirabayashi et al., 2021) and the Global Tide and Surge Model (GTSM) (Muis et al., 2020) to examine compound effects from pluvial, fluvial, and tropical
- 75 cyclone (TC) induced storm surge drivers at Mozambique's coastline. Again confirming that interactions between flood drivers will amplify total water levels. Around the same time, Bates et al., (2021) modelled the interactions between fluvial, pluvial, and coastal flood hazards, for the coastline of the conterminous USA, finding that there

would be some significant local changes from the expected flood envelope because of compound flooding interactions.

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Statistical dependence analysis has also been used in a range of global/regional scale studies to assess the likelihood of different extreme drivers occurring at similar times (e.g., Zheng et al., 2013; Wahl et al., 2015; Bevacqua et al., 2019). Prior studies have shown that statistical dependence between flood drivers means extreme combinations are more likely. Ignoring such dependency can lead to underestimation of return periods at the river

- 85 mouth (Ward et al., 2018; Couasnon et al., 2020; Camus et al., 2021). The research warns that future coastal flooding due to mean sea level rise can be aggravated by compound interactions. They found that dependence can variably influence the joint probability of river discharge and storm surge extremes, having important implications for our understanding of flood statistics and probability along impacted coastlines.
- 90 Current research points to populations living along Asian and African deltas and coastlines being most exposed to future coastal flooding, due to atmospheric climate changes driving tropical and sub-tropical storm surge events in these regions (Seto 2011; Neumann et al., 2015). Consequently, the aim of this paper is to characterise the past/present and future compound flood risk, from TC-induced extreme river discharges and storm-tides, to one of the most flood-vulnerable and populated deltas in southeast Asia: the Mekong River delta in Vietnam. The
- 95 Mekong River delta is located in a region of intense TC activity: the Western North Pacific. Storm tides driven by TC events are a tangible hazard for many low lying coastal communities in this region, on top of relative sealevel rise (Vousdoukas et al., 2016; Calafat et al., 2022; Wood et al., 2023). Mean sea levels (MSLs) in the South China Sea surrounding the delta rose by 3.5 mm/year at Vung Tau, Vietnam between 1985-2010 (Hak et al., 2016). While TCs currently impact the Red River Delta in north Vietnam more frequently, TCs do strike south
- 100 Vietnam and the Mekong River delta also. In 1997, Tropical Storm Linda killed 3,111 people across the Mekong River delta, destroyed 300,000 homes, and flooded 4,500 km² of rice paddy crop (Dun, 2011; Anh et al., 2017). In December 2017, 650,000 people were evacuated from vulnerable areas of Southern Vietnam including the Mekong River delta, because of Typhoon Tembin. Climate change is likely to increase the flood risk to Vietnam in the coming decades. In 2019 the IPCC identified the future Mekong River delta as being at risk not only from 105 sea-level rise and soil erosion, but also from high tides and cyclones (Oppenheimer et al., 2019). The region is
- projected to experience increased storminess which would lead to more intense rainfall events as well as extreme sea levels from TC-induced storm surges (Dasgupta et al., 2007; Seneviratne et al., 2012; Hirabayashi et al., 2013; Tessler et al., 2015; Lin and Emanuel, 2016; IPCC 2021; Skliris et al.,2022; Wood et al., 2023).
- 110 Despite it being an economic powerhouse for the region, and it's strategic value to regional food security, no research has been carried out specifically to look at TC-linked compound flood risk within the Mekong River delta. The recent work of Rodrigues do Amaral et al., (2023) explored the compound flood hazards to the adjacent city of Ho Chi Minh, from Typhoon Usagi (2018) and found that river flooding and rainfall runoff caused flooding up to 0.8m because of the co-occurrence of high sea levels which prevented normal drainage. However, Ho Chi 115 Minh City is not within the large Mekong River delta catchment area. Triet at al., (2020) assessed the combined
- impacts of climate change: increased river discharges, and rising sea levels (including tides), on the future (2036- 2065) Mekong River delta assuming a representative concentration pathway (RCP) number 4.5. This was within

the context of continued hydropower development within the catchment. They found that flood waters would submerge some new areas, and prolong the flood in some parts of the delta by an additional 1-2 months. However,

- 120 neither of these studies examine multi-driver or compound flood risk from TC activity in the delta, specifically the combination of river flooding combined with TC-linked storm surges at the coastline. The research question for this study is therefore, "how is the Mekong River delta impacted by compound flooding linked to TC-activity in the region (river flooding + storm surges), and to what extent will these impacts change due to climate change by year 2050?".
- 125

To answer this question, this paper has three objectives: (1) to examine how compound flood hazard differs across the delta compared to flood hazard driven by river-only or storm-tide-only events, under past/present day conditions; (2) to explore how this compound flooding will change over time due to projected climate change; (3) to assess which regions of the delta are river, coastal, or compound-flood dominated, and how this might change 130 over time with climate change. We achieve these objectives by using an existing Danish Hydraulic Institute's

- (DHI) MIKE 11 hydrodynamic model of this area and apply new river discharge and storm-tide boundary conditions. We simulate a range of combined flooding scenarios, with differing return periods of river discharge at the upstream boundary, and storm-tide return periods at the downstream boundary, and compare those floodextents and durations against single-flood driver outcomes. We contrast river discharges and storm-tides that
- 135 reflect a past/present climate and a future climate. We then use a compound ratio approach on the model outputs to quantify which regions of the delta are river, coastal or compound flood dominated.

The structure of the paper is therefore as follows. The Mekong River delta study region is described in Sect. 2. The model set up is discussed in Sect. 3, with model scenarios and simulations described in Sect. 4. Results are 140 presented in Sect. 5, with key findings and discussion in Sect. 6. Conclusions are given in Sect. 7.

2 Study location

Figure 1 Location of the Mekong River

The Mekong River delta (Fig. 1) is home to \sim 20% of Vietnam's ~98.5 million 2021 population, with around a quarter of this population living within 2 m of current 145 MSL (Edmonds 2020; Nguyen 2021; GSO, 2024). The delta's importance for jobs and food security cannot be understated. It produces up to 50% of the nation's rice, 65% of aquaculture, and 70% of its fruit (Dun, 2011; Van et al., 2012; Triet et al., 2020).

The region owes its fertile land to regular flooding, following seasonal rainfall. The local climate supports two monsoon systems which together generate around 85% of annual river flows in the Mekong River, over the wet season (May to November) (Nguyen 2021). Wet season floods can have two flood peaks. A principal 'good' flood always arrives between July and early September as a response to monsoonal rainfall (Dung 2011; Nguyen 2021). A second peak can sometimes be observed between September and October, and is linked to rain from tropical depressions, storms and cyclones from the South China Sea making landfall over the \sim 795,000 km² Mekong River watershed (Hung et al., 2011). These can be so damaging they have been coined

165 'bad' floods, because they arrive unexpectedly, and can have higher peaks, or sustain flooding for longer at higher water levels, overwhelming local flood defences (Nguyen, 2021).

Farmers and local government started to intensively manage flood water levels in the late 1990s by heavily engineering the delta via miles of protective canals, pumps, gates, dykes, and sea walls (Hung et al., 2011; Welch 170 et al., 2017; Nguyen 2021). Low dykes with crest levels at around 2.5 m (1.5 m to 4.0 m) above MSL are used to manage the annual flood peak and thereby extend the rice paddy season. These are also known as 'August dykes' to match the seasonal high water level (Wesselink et al., 2015; Thanh et al., 2020; Triet et al., 2020; Nguyen 2021). High dykes, with crest level approximately 4.0-6.0 m above MSL were introduced more recently in response to a series of extreme (bad) river floods (Thanh et al., 2020; Nguyen 2021). These function to cut off the 175 floodplain from the natural flood inundation regime of the river, facilitating a third rice crop in select areas (Triet et al., 2020). Unfortunately, the engineered systems restrict natural deposition around the delta mouth, reducing delta stability and disrupting processes that protect the delta coastline from sea surges and high tides, compromising the long-term climate resilience of the delta (Käkönen et al., 2008; Welch et al., 2017; Day et al., 2016; Tessler et al., 2015).

180 3 Model set up

We used a DHI MIKE 11 hydrodynamic model of the lower Mekong River and its delta. The model setup and domain are described in Sect. 3.1, a summary of the model channels, structures, boundary conditions and run parameters is given in Sect. 3.2 and the model calibration and validation is discussed in Sect. 3.3.

3.1 MIKE 11 model and domain

- 185 In this study we use a MIKE 11 hydrodynamic model of the Mekong River delta first developed in 2007 by the Vietnamese Southern Institute of Water Resources Research (SIWRR; Dung et al., 2011; Hung et al., 2012; Manh et al., 2014). The MIKE 11 model generates discharges within its network using an implicit, finite difference solution of the 1-dimensional shallow water (Saint Venant) equations. A fully 1-D approach is recommended for the lower Mekong River delta due to its size, its dense and heavily engineered network of rivers, canals, and pipes, 190 and because of unique hydraulic processes occurring due to the river's connection with the Tônlé Sap Lake in Cambodia (Dung et al., 2011).
- The model domain, channel network, cross sections and boundary locations are illustrated in Fig. 2a. The associated Mekong River delta Digital Elevation Model in Fig. 2b highlights the low lying nature of the lower 195 delta, with median elevations around ~0.5m above MSL. It spans an area of ~55,000 km², ranging between 8°N and 14°N latitude and 102°E and 107°E longitude which encompasses its two distinctly different hydraulic regimes: the northern Cambodian Flood Plain (CFP) and the southern Vietnamese Mekong Delta (VMD). The upstream extents of the model are between Kratie and the Tônlé Sap Lake in Cambodia, and the downstream extents coincide with the coastal boundaries of the South China Sea and Gulf of Thailand in the VMD (Fig. 2a).
- 200 The model was created in the WGS 1984 UTM Zone 48N coordinate system and has a local 'Hon Dau' vertical datum equivalent to local MSL (Hoa et al., 2014; Minderhoud et al., 2019). Elevations in the MIKE 11 model faithfully reproduce levels of between ~25 m above MSL around Kratie, ~12 m around the Tônlé Sap Lake, down to 0.3-0.7 m above MSL at the Vietnam coastline (Tri 2012).

205 Figure 2 - (a) The MIKE 11 1-D Model network (black) with cross sections (blue) and coastal boundary locations (red). The 9 downstream boundaries are 1. Vũng Tàu, 2.Vàm kênh, 3. Bình Đại, 4. An Thuận, 5. Bến Trai, 6. Tran De, 7. Gành Hào, 8. Sông Đốc, 9.Rạch Giá / Xẻo Rô; and (b) A digital elevation model (DEM) illustrates the flat landscape of the Mekong River delta (GLO-30: https://doi.org/10.5270/ESA-c5d3d65 and FABDEM DEM)

While 1-D models can be appropriate for representing conveyance of water volumes in a well-defined channel, 210 they don't always adequately represent more complex inundation in the floodplain, such as wetting and drying processes, or backflow (Bates et al, 2005; Ikeuchi et al., 2015, 2017). To address this, the MIKE 11 model incorporates long and closely packed cross sections (i.e., 2-dimensional profiles created from ground survey data) in the wide natural floodplains of the Mekong River in the upper delta within Cambodia and around the Tônlé Sap Lake (Fig. 2a). Contrast this with the short cross sections (with attached storage cells) in the lower delta to 215 represent the canalised channels fenced by dykes and adjoined by traditional terraced paddies within Vietnam.

Importantly, SIWRR recently updated the MIKE 11 model in three ways to improve performance. First, model dyke elevation data throughout the delta were updated from surveys undertaken between 2015 and 2018. Second, much of the model's channel bathymetry data were updated, from survey work undertaken by SIWRR and the 220 University of Hull (described in Vasilopoulos et al., 2021). In that work, the most recent river discharge and stage

data, measured at five internal gauge stations, were used to update channel roughness parameters throughout the model (Vasilopoulos et al., 2021; Le et al., 2022). Third, data from floodplain elevation surveys around Dong Thap province, carried out by SIWRR in 2019, have been incorporated.

225 3.2 Model hydrology, structures, and parameters

The model is forced at the upstream boundary, by a single river discharge timeseries at Kratie, Cambodia (Fig. 2a). There are three main routes of floodwater entry into the Vietnamese Mekong Delta: (i) via the two main river channels the Mekong and Bassac in Cambodia (locally named as the Tien and Hau rivers, respectively, within Vietnam); (ii) via transboundary overland discharge via the Plain of Reeds located east of the Mekong River; and 230 (iii) overland discharge to the west of the Bassac River (Fig. 1; Nguyen 2021). And the flows at Kratie feed all three of these routes of floodwater entry into the delta. Further details of the Kratie discharge timeseries, forcing

- the model, are given within Sect. 4.1. Minor inflows at the Border Plain and the eastern boundary vary between $0.8 \text{ m}^3\text{s}^{-1}$ (fixed) and $953 \text{ m}^3\text{s}^{-1}$ (varying with peak in September), but have a negligible impact on model results, hence we kept them constant for this study.
- 235

At the downstream limits of the model, there are 58 coastal boundaries at points located around the Vietnam coastline (Fig. 2a). These are driven by storm-tides (e.g., astronomical tide plus storm surge) time-series in our model. These storm-tide boundary condition time series are described in more detail within Sect. 4.2.

240 An important hydraulic feature in the model is the Tônlé Sap Lake (the Great Lake) which acts as a reservoir storage area at the top of the model (Fig. 2a). As Mekong River discharges gradually rise during the monsoonal wet season, the Tônlé Sap Lake, and Cambodian floodplains, provides vital flood water storage and attenuation of the 'good' annual flood peak, for the lower delta. The Tônlé Sap Lake receives rainfall- (i.e., surface-) runoff inputs at a number of locations around its perimeter in the model, but has a single major inflow from the Mekong 245 River near Phnom Penh to the south which only begins to spill over into the lake when river levels exceed \sim 17 m above MSL (Hoi 2005, equivalent to ~2.3m water depth: Le et al., 2022) at the start of the wet season. There is no evaporation from the lake in the model. At the end of the flood season, spillover from the Mekong River ceases, and the Tônlé Sap Lake starts to draw down again releasing floodwaters back into the Mekong River delta system (Nguyen 2021).

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Table 1 – Overview of the Mekong River delta hydrodynamic model, modified from Dung et al., (2011)

Count
1,232
$~20,860$ km
2,170
58
542

A key advantage of 1-D models is that discharge over hydraulic structures and supercritical/subcritical discharges is stably represented (DHI 2017), which is particularly important considering there are a large number of such 255 structures within the Mekong River delta. The SIWRR MIKE 11 model that we used here includes measurements from a total of 542 flood-cell compartments enclosed by dykes and control structures (Table 1). In the model, dyke heights range between 0.8 and 6.5 m above MSL datum. There are also a total of 23 weirs and 2,260 sluice and gate structures for irrigation and flood level management. Sluice gates within the Vietnamese Mekong River

delta are used to manage saline intrusion and flood levels within the protected areas, diverting flows to 260 neighbouring and downstream compartments (Triet et al., 2020).

The model categorises rivers, channels, and floodplain into 5 separate classes according to their size and function. Channel roughness (resistance) defaults are defined according to these classes as detailed within Dung et al., (2011), using Manning's coefficient value, and summarised in Table 2. However, these default roughness values 265 have also recently been fine-tuned (as described above, Vasilopoulos et al., 2021). Floodplain roughness is given a global Manning's value of 0.1.

Table 2 - Assignment of roughness values to five classes of channels and floodplains (copied from Dung et al., 2011)

270 3.3 Model calibration and validation

For highly distributed numerical models to accurately replicate observed flood extents and levels, the model needs to be calibrated and validated against a wide range of discharge conditions, which can be a challenge if measured data is of poor quality or insufficiently spatially dispersed around the domain (Horritt and Bates, 2002). Fortunately, there is an abundance of data on the Mekong River delta that can be used. Dung et al., (2011) and 275 Manh et al., (2014) used a mixture of time-series of ENVISAT earth observation satellite data products, and hydrometric data from a network of gauge stations to auto-calibrate, and validate, the model for high discharge events encompassing the floods of 2008, 2009 and 2011. These calibration exercises confirmed that the model is optimised for higher discharges and the annual flood – but would be further improved if dyke heights in the model could be better represented. Consequently, surveys of dykes, channel dimensions and floodplain were undertaken 280 between 2015 and 2019 and this data incorporated in the model (Sect. 3.1).

In 2019, SIWRR carried out a further validation exercise to test the MIKE 11 model's suitability to characterise flood conditions in the Mekong River delta. SIWRR compared the river discharge and water level data at 5 (main) and 8 (medium) channel gauge stations internal to the model domain and independent of boundary data. The main

- 285 river gauge stations were located at Can Tho, Chau Doc, My Thuan (now renamed Tran De), Vam Nao, and Tan Chau (as described in Vasilopoulos et al., 2021 and Le et al., 2022). Nash Sutcliffe efficiency coefficients were calculated, by finding the error between modelled and measured data at these locations for the year 2018. This gave a mean overall rating of 0.89 for river discharge (0.87 in dry season months January to May, and 0.91 in flood season months June to December), and a mean rating of 0.94 for river water levels (0.95 in dry season
- 290 months, and 0.95 in flood season months). Any value above 0.8 is considered to show good model accuracy, so

results again clearly demonstrated that the model can effectively simulate the higher discharges and water levels (e.g., Ritter and Muñoz-Carpena, 2013; Moriasi et al., 2007). Because of SIWRR's thorough and consistent work to calibrate and validate this MIKE 11 model for high flows, we did not implement any additional model validation.

295 4 Modelling approach

In this paper we assess potential compound flood hazard, from extreme river discharges and TC-induced stormtides, across the Mekong River delta, using a number of representative scenarios. For both river and storm-tide, we created seven scenarios: a baseline flood event, a 10% (1 in 10 year), a 2% (1 in 50 year), a 1% (1 in 100 year), a 0.4% (1 in 250 year), a 0.2% (1 in 500 year), and a 0.1% (1 in 1000 year) Annual Exceedance Probability (AEP) 300 flood event. We do not assess the precise likelihood of these events, as measured datasets are currently too short to derive accurate dependence statistics between drivers. All possible combinations of coastal and river compound flooding are then simulated. We run simulations for a wet season in the past/present (year 2020 - representative of the period 1980-2017), and a wet season in the future (year 2050 - representative of the period 2015-2050), including climate change.

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We begin with a description of the creation of upstream river conditions in Sect. 4.1, and downstream coastal boundary condition creation in Sect. 4.2. The different compound flood combinations and the scenarios contrasting past/present, and future, compound floods are described in Sect. 4.3. Finally, in Sect. 4.4 we describe how the model simulation results were post-processed for analysis.

310 4.1 River boundary condition

We used a four-step process to create design return period scenario discharges for Kratie, Cambodia as the upstream boundary condition to the MIKE 11 model. Step one, we create a baseflow hydrograph for Kratie flows, encompassing the full wet season with a peak in late August/early September, with 10 minute time steps. This was achieved by taking the median of all (January 1924 to December 2013) daily flow data at Kratie, obtained

- 315 from the Mekong River Commission (MRC, www.mrcmekong.org). A long timeseries baseflow hydrograph is important to model accuracy, as antecedent conditions in the wider delta strongly influences how extreme flood waters are distributed and what flood storage is physically available. This baseflow is illustrated in Fig. 3a as a greyed-out area and represents our 'baseline' conditions scenario.
- 320 In step two, we estimate design return period flood discharges at Kratie, for TC-rainfall forced flood events. We did this by using annual (block) maxima from the 1924-2013 daily flow record, and assigning a rank (*m*) to the maxima from each year, from largest to smallest. Since extreme discharges at Kratie all occur under the same wet-season climate conditions, and annual maxima peaks are hydrologically independent of each other, then statistical conditions are met to apply the Gringorten formula and estimate river discharge probability of 325 exceedance and return period values. The Gringorten formula was chosen due to its suitability for estimating extreme values and its demonstrable record for unbiased return period estimation (Guo, 1990). The probability of exceedance (P) using this formula is:

$$
P = \frac{(m-a)}{(n+2a)}\tag{1}
$$

where a is a scale parameter equal to 0.44, and n is the number of annual maxima observations. The discharge 330 return period at Kratie is given as 1/P. Our desired return period values are then interpolated, based on these data. The Annual Exceedance Probability (AEP) is the percentage chance that a given discharge will be equalled or exceeded in any given year, based on these years of data. We therefore estimated 'design' return period discharge values for the 0.1% , 0.2%, 0.4%, 1%, 2% and 10% AEP levels.

- 335 In step three, we create a flood event pulse shape using an approach described in Yue et al., (2002). This method identifies typical flood event variables - event mean and event variance - from river gauge measurements, and creates a two-parameter beta probability density function (pdf) to produce a synthetic flood pulse shape of appropriate height (peak discharge) and width (duration). We isolated extreme flood event mean and variance values in the 1924-2013 Kratie discharge record to thus create a synthetic flood pulse shape characteristic of
- 340 historic flood pulses at Kratie. We scaled the height to represent the appropriate discharge rate required for each of our design return period flood event scenarios (step two, Table 3). Lastly, we compared the flood duration and total flood volume contained in this synthetic flood pulse, with historic events, to confirm that it also carries a credible volume of flood water into the past/present delta.

345 Table 3 Peak discharge (m^3s^{-1}) for the 10% (1 in 10 year), 2% (1 in 50 year), 1% (1 in 100 year), 0.4% (1 in 250 year), 0.2% (1 in 500 year) and 0.1% (1 in 1,000 year) AEP floods at Kratie, Cambodia. For present (by 2020) and future (by 2050) climates.

	Annual Exceedance Probability (%)								
	10			0.4	0.2	0.1			
Present	62,682	69,501	71,780	74,312	75,920	77,303			
Future	71,067	78,869	81,420	84,215	85,963	87,448			

350 Finally, in step four, we attempt to align the time to peak, between the river and storm surge flood surges, so they coincide and compound within the model. Through an iterative process of model simulations, we determined that the optimal time to have the peak occur upstream at Kratie, was 3.3 days before any storm tide strikes at our chosen section of Vietnam coastline. This would generate a river discharge flood peak which combines, with the storm-tide, around the centre of the delta; near to Can Tho on the Hau (Bassac) River/Vinh Long on the Tien

355 (Mekong) River.

Figure 3 – (A) Red line: A past/present 1% AEP return period design flood hydrograph used as an upstream boundary 360 condition in the model. This is combines a baseflow hydrograph (greyed-out area) with a single extreme flood event at the required date. Annual hydrographs for years 1926, 1952, 1973 and 2000 are also shown for comparison (dashed coloured lines). (B) - The 1% AEP flood hydrograph at Kratie for year 2020 (blue) vs a 2050 future (red).

We created a future total flood hydrograph at Kratie, by following the same steps as for the past/present delta 365 above. Future river discharges in the Mekong by 2050 are expected to be greater than today's flows, due to increased storminess and TC activity in the region from projected climate change. To represent these changes we utilised results from a HYPE (Hydrological Predictions for the Environment) hydrological model created for the past/present and future climate for the Mekong region (Du et al., 2020 and 2022). The future (up to the year 2050)

HYPE model used HadGEM3-GC3.1 climate model input data with local CMIP-RCP8.5 rainfall projections

- 370 (Skliris et al., 2022). The HYPE future model predicts more intense rain days, and a larger number of dry days for the future Mekong region. However, due to the coarse resolution of the climate input data, discharge values at Kratie appear to be underestimated in both past/present and future HYPE model outputs, contrary to other projections for South Vietnam which predicts at least a 5% increase in river flows here (Västilä et al., 2010; Skliris et al., 2022; Try et al., 2022). HYPE future has mean discharge output at Kratie that is actually 3% less than
- 375 past/present-day gauged values. Du et al., (2022) confirms that some river discharges linked to uncertain precipitation can be underestimated in the HYPE model. Since the future HYPE model does regionally follow projected trends overall, we have assumed that the results for Kratie represent a local discrepancy in the data.
- Consequently, to create future discharges for our MIKE 11 model, we chose to disregard the specific Kratie model 380 outputs, and instead incorporate the overall trend for the region by using the differences between the past/present HYPE model outputs and the future HYPE model outputs instead. The procedure we used is as follows. Firstly, we ordered the timeseries of HYPE model output discharges, at Kratie, and calculated percentiles to these flows, for both the past/present and future results. We then calculated the percentage difference (δ) , at every percentile, between the past/present and future HYPE river discharges. Plotting this out we observed that δ was largest for 385 extreme high/low discharges, and smallest around the mean. Secondly, we increased the δ 50th percentile so it was equal to the +5% expected within the wider literature for future river flows here, and applied the same adjustment to all other δ values, creating δ +. Thirdly, we similarly ordered our Kratie gauged record (1924-2013) and created a ranking of observed river discharges by percentile, and then applied δ + to estimate future river discharges. This method therefore combines both the general trend information by percentile from HYPE, with expected increases 390 in mean flows around Kratie from the wider literature, and applies it to the past/present discharge record at Kratie. Using this approach, future river discharges have mean flows that have been increased by 5% during the wet season. Wet season high (95th percentile) river flows have been increased by ~11% and the low (5th percentile) flow extremes decreased by ~1%. This is entirely consistent with a future Mekong climate which is projected to

395 2022).

The subsequent steps to create future design flood hydrographs for the MIKE 11 model are then identical to the past/present-day method described above. The 1% AEP hydrographs for year 2020 vs year 2050, are compared in Fig. 3b. The estimated peak discharges for the past/present and future periods, under our return period scenarios, 400 are listed in Table 3.

have more intense rain days, and a larger number of dry days (Västilä et al., 2010; Try et al., 2022; Skliris et al.,

4.2 Coastal boundary conditions

The MIKE 11 river model has 58 coastal boundary points, shown in Fig. 2. However, only 9 points have a significant influence on water levels in the delta; the other 49 points represent channels with negligible impact on the delta. We create a suite of design return period storm-tides (i.e., astronomical tides plus storm surges) at each 405 of the 9 principal coastal boundary points, representing a storm-tide associated with a TC crossing the Mekong River delta, using outputs from a prior study by Wood et al., (2023), for the same past/present and future years.

We chose to model the storm surge striking one of the largest distributaries of the Mekong Delta coastline at the Co Chiên River mouth, near Thạnh Phong, Thạnh Phú District, Ben Tre, Vietnam (Point 4 on Fig. 2A). Wood et

- 410 al., (2023) derived storm surge probabilities around the whole coastline of Vietnam, by driving a MIKE 21 (DHI) coastal ocean model with 10,000 years of synthetic TC activity from Bloemendaal et al., (2020, 2022), representative of a past/present (1980–2017) and high-emission-scenario future (2015–2050) period. We obtained storm surge information for the 10 largest past/present storms, at each of the 9 coastal boundary points, then calculated the average percentage scale factor as the storm surge reduces in size moving north or south of Point
- 415 4. We found that on average Points, 1, 2, 3 and 5, experience a surge that is 61%, 96%, 100% and 23% of the peak storm surge at Point 4. Point 6 experience a surge that is -45% of the peak surge at Point 4; this is because the wind direction is typically offshore from the track of the cyclone, generating a negative surge. At points 7, 8 and 9 the storm surge is on average negligible, and so we set this as 0% of the storm-tide height at Point 4. The resulting storm-tide boundary conditions are shown in Fig. 4.

420

We follow four steps to calculate storm-tide levels for the coastal boundaries of the model. First, we predict the astronomical tide for the duration of the model simulation using the T-Tide software package (Pawlowicz et al, 2002) in MATLAB, for June to November, at each of our 9 points (Fig. 2A). These are shown by the red line in Fig. 4, for each point. Second, we derive a design storm surge profile shape which has a length of \sim 2 days (\pm 1) 425 day around the peak), from the time-series of synthetic storm surges generated from the 10 largest events at Point 4, from Wood et al., (2023). We set the time and date of the storm surge peak to 07:30 20th August, to coincide with high water of a spring tide, and around the time of maximum river discharge (Sect. 4.1). The storm surge is shown by the magenta line in Fig. 4. Third, we scale the storm surge profile so that when combined with the astronomical tide, the peak storm tide corresponds with either the 0.1%, 0.2%, 0.4%, 1%, 2% or 10% design AEP

- 430 level at this location. At the neighbouring 8 locations, we scale the storm surge profile by the percentage factor described above, to represent the decrease in strength of the storm surge further away from Point 4. Finally we combine design storm surge and astronomical tides. The blue line in Fig. 4 shows the combined storm-tide corresponding to the 1% AEP. Note, for the remainder of the simulation period (not shown in Fig. 4), the storm surge is set to zero. In this way, we create coastal boundary data files containing the full timeseries for all 9 coastal
- 435 point locations, for each of the six AEPs and for the past/present and future period. These coastal boundary sea level files have a timestep of 10 minutes.

440

Figure 4 - The 1% AEP storm tide for each coastal boundary condition in the past/present climate is shown in blue. Red indicates the astronomical tide, and magenta shows the storm surge.

For the future period, we followed the same procedure but scaled the storm-tide to match the future AEP probabilities, also derived in Wood et al., (2023). The past/present and future storm-tide AEP are listed in Table 445 4, for Point 4. By the year 2050, the IPCC's $6th$ Assessment Report projects a relative MSL mean rise at the grid point adjacent to the Mekong River delta of 0.25 m, under the SSP5-8.5 reference scenario, relative to a 1995- 2014 baseline (Fox-Kemper et al., 2021; NASA sea-level tool: https://sealevel.nasa.gov/ipcc-ar6-sea-levelprojection-tool). The projected future storm tide heights we use in the model therefore have an additional 0.25 m added to capture this, as shown in brackets in Table 4.

450

Table 4 - Past/present (by 2020) and future (by 2050) storm tide heights (m) for the 10% (1 in 10 year), 2% (1 in 50 year), 1% (1 in 100 year), 0.4% (1 in 250 year), 0.2% (1 in 500 year) and 0.1% (1 in 1,000 year) AEP for Point 4. Values in square brackets are storm tide plus a projected future sea-level rise of 0.25 m.

455 4.3 Model scenarios

We run 98 simulations of the model: 49 representing a past/present period, and 49 representing a future period. The past/present period is representative of TC activity derived from observations for the years 1980–2017 (Bloemendaal et al., 2021, 2022). The future period is representative of TC activity for the years 2015–2050 derived from high-resolution climate models driven with a high-emissions (SSP5-8.5) climate change scenario 460 (Bloemendaal et al., 2022), and with a sea-level rise increase up to 2050 under the same SSP5-8.5 scenario from the IPCC 6th Assessment Report (Fox-Kemper et al., 2021).

We aim to determine the extent, influence, and duration of the full range of possible compound flood event combinations. Table 5 conveys the 49 combinations of river and coastal boundary conditions modelled in each 465 time period. The river discharge baseline condition, at Kratie, are median daily flows. At the 9 coastal boundary points the coastal baseline conditions correspond to just astronomical tides (no storm surge). We timed our model boundary conditions to produce a state where Mekong River discharge and storm-tide combine to flood the central delta, coinciding around Can Tho on the Hau (Bassac) River and Vinh Long on the Tien (Mekong) River soon after the TC makes landfall.

470

Each of the 98 simulations in the MIKE 11 model were run from the 1st of June to 28th November. We used an adaptive timestep (minimum 1 minute, maximum 30 minutes), and selected the unsteady state option for river discharges as downstream sea levels, and upstream river discharges, volumes and velocities will all vary over time. We set an 'initial water level' value of between 0.5 m and 7.65 m in the major channels (1.5 m globally 475 otherwise) at timestep zero. Also, a condition of no groundwater infiltration and no evaporation was set within the model, and a flood-calibrated default Courant number was used (see Sect. 3.3). We set the simulation outputs to be a 3-hourly record of water level and discharge at all river channel output locations.

Table 5 Model combinations to synthesize a compound flood with river discharge flooding and storm tide flooding at the 480 same time. The dark shaded boxes indicate results we reproduce as maps in this paper.

4.4 Presentation of model results

We present model results in four ways, showing variation relative to a flood baseline, with: (1) spatial flood difference maps; (2) profile plots along the Tien- Co Chiên River length, between Kratie and the Co Chiên river 485 mouth; (3) flood depth hazard maps showing days of flooding at dangerous depths; and (4) spatial maps showing relative dominance of flood drivers.

Spatial maps of flood extent for all scenarios in Table 5 were created by (i) using Environmental Systems Research Institute's (ESRI) ArcMap software to interpolate model maximum water elevations, at each river channel, 490 outward using an inverse distance weighted tool. The interpolation and extension were confined to appropriate sub-basin limits (outlines obtained from https://data.opendevelopmentmekong.net). This flood layer was then (ii) applied to a high-resolution Digital Elevation Model (DEM) of the Mekong Delta. We used the FABDEM, based on the European Space Agency's Copernicus GLO-30 dataset (https://doi.org/10.5270/ESA-c5d3d65 ; Hawker et al., 2022). The FABDEM vertical datum was reprojected to match the model's local Hon Dau model datum 495 (Minderhoud et al., 2019). Consequently, (iii) any flooding found below ground level were removed, as were floods over river channels and permanent bodies of water (e.g., Tônlé Sap Lake, areas of aquaculture). Finally, (iv) any islands of flood water not hydrologically connected to the coastline, or the river and canal network, were also removed using GIS tools. We repeated this process for every design flood scenario (Table 5), for both past/present and future scenarios. Hence, this process creates a series of spatially interpolated flood maps of the 500 1D model maximum water elevations, for the Mekong River delta. The final step was (v) to calculate flood difference maps by subtracting the past/present baseline flood map from the compound flood maps. Difference maps are created not only to highlight differences from the period baseline, but are also an attempt to remove

505 Second, we examine the differences in flooding relative to a past/present baseline (i.e., median river discharges at Kratie, combined with only astronomical tide at all coastal boundaries), in profile view for all scenarios. We achieved this by extracting maximum flood elevations from the MIKE 11 river model at points along the Mekong-Tien-Cochien River channel and plotted the additional depth of flooding, relative to our past/present baseline.

systematic errors in the process of creating these flood maps.

510 Third, we explore if there is a change in duration of dangerous flood levels, in compound scenarios over time (objective 2). We define a dangerous flood depth as a flood that is 0.5 m higher than our past/present baseline. This depth was selected because standing flood depths between ~ 0.5 m and ~ 1 m have been established to be unsafe for children, the elderly, and vehicles travelling through flooding (Smith, 2015). We did this by mapping the duration (number of days) and locations where flood depths exceed 0.5 m above our past/present baseline, 515 creating 'flood depth hazard maps'.

Four, we present results showing which regions of the delta are river, coastal, or compound flood dominated (objective 3) in Sect. 5.3. Our approach was to apply the 'compound ratio' method of Huang et al., (2021). For a given grid cell in our flood maps, the compound ratio (C_r) is the ratio between the maximum water level 520 disturbance (D) away from the baseline, and the sum of the two combined maximum disturbances (D_i) , as follows:

$$
C_r = \frac{\max(D)}{\sum_{j=1}^{2} \max(D_j)}
$$
 (2)

Disturbance (D) is the height of maximum water level above the baseline state, as captured by our flood difference maps. *j* represents the number of different flood drivers at this location. C_r values close to 0 indicate substantial non-linear compound effects, while C_r values closer to 1 indicate negligible compound effects. The C_r maps in 525 our results section are created in a two-step process. First, we took the flood difference map of a river floodingonly scenario (e.g., 1% AEP, with no storm tide component) for the numerator in Equation 2. The denominator is a difference map from a compound flood scenario with the same magnitude river flood (e.g., 1% AEP river flood with a 10% storm-tide flood). Every cell in the flood map will thus have a C_r value between 0 and 1, with values closer to 1 indicating river flooding dominance, and values closer to 0 indicating compound effects. This produces

530 the river portion of the C_r map. The process is then repeated for the storm tide parts of the C_r map: a storm-tide only difference map is used in the numerator to characterise storm-tide dominant flood areas in the domain. The denominator is a difference map from a compound flood scenario with the same magnitude storm-tide flood. Thereafter, the second step is to combine these two C_r maps, with the compound zones overlapping.

5 Results

535 The following sub-sections present our results as they relate to each of the three objectives outlined in Sect. 1.

5.1 Differences between compound flood hazard and single-source flooding

We present areas of excess flood inundation for select past/present AEP scenarios (10%, 1% and 0.2%), relative to the past/present baseline, in Fig. 5Pa to 5Pp. In this matrix of figures, y-axis shows river flood magnitude scenarios, and x-axis shows storm-tide magnitude scenarios. To make allowance for margins of error, we present 540 only flood differences greater than 0.1 m. Figure 5Pa - 5Pd, illustrate the increased area of coastal flooding around Point 4, linked to increasing magnitude of storm-tides. The excess flood depths ranges between ~0.25 m (10%) AEP) and 3.0 m (0.2% AEP). The length of coastline impacted is around ~100 km. Inland this reaches approximately 160 km up the Mekong-Tien-Co Chiên river, up to around Cao Lanh in the 10% AEP storm-tide only flood (Fig. 5Pb) and up to Tan Chau at the Cambodia-Vietnam border in the 0.2% AEP flood (Fig. 5Pd). 545 Whereas, for river-only flood scenarios (Fig. 5Pa, 5Pe, 5Pi, 5Pm), it is flood depths, rather than flood inundation area that changes with increasing flood magnitude. Floodwaters are largely confined to Cambodian and Tônlé Sap Lake areas, and northern parts of the Vietnam delta near the border. Between the Great Lake and the country border, north of Chau Doc in Vietnam, extra depth of flooding due to compound effects ranges between 0.3 m (10% AEP river flood) and 1 m (0.2% AEP river flood).

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Figure 5 – Areas of excess flood inundation, greater than 0.1 m height, for various return period combinations. Depth difference ranges between 0.1 m and 6.0 m as shown in the legend (centre). On the left is 5Pa-5Pp: excess flooding in a past/present climate (up to year 2020), relative to the past/present baseline. On the right is 5Fa-5Fp: excess flooding in a future climate (up to year 2050), relative to the past/present baseline.

Compound river and storm-tide flooding appears to restrict how river discharges exit the network, resulting in up to an additional 0.5 m depth of flood water in the central compound zone, between the Bassac/Hau River near to Can Tho (Ang Giang province), and the Plain of Reeds around the Dong Thap province. This may be due to the delta structures and canal network being optimally designed to divert excess river flows to these neighbouring locations, but it is worth noting these areas do not normally experience spill-over in single-driver flood scenarios (Fig. 5Pe, 5Pi, 5Pm and Fig. 5Pb, 5Pc), unless the storm tide is very large (Fig. 5Pd). Further, the extent of storm 560 tide progress inland varies when there is also a river flood. This is explored more in the long-section (profile view) plot results described below. There is a ~70 km long stretch of river, between around Cao Lanh and Tan Chau, where compound flood hazard appears to present a particular danger, generating up to an additional \sim 1.5 m depth of flood water at the most extreme (≤1% AEP), in areas adjacent to the river (Fig. 5Ph, 5Pl, 5Pp). However, in general, the past/present flood difference maps appear to show that river and storm tide floods are largely distinct and separate within the delta, presumably a distinction that is modulated by the delta's engineered landscape. Where mixing does occur, excess flood depths increase and spill-over affects neighbouring areas.

Excess flood depths for the Mekong-Tien-Co Chiên River, relative to the past/present baseline, are shown in profile in Fig. 6a to 6d. In this profile plot the upstream extent is at Kratie (left) and downstream is the open sea 570 (right). The top two panels show fixed coastal boundary conditions (a: no storm surge, b: 0.2% AEP storm-tide). The bottom two panels show fixed river flood conditions at Kratie (c: baseline river, d: 0.2% AEP river flood). Solid coloured lines indicate the past/present results. At the coastline, excess past/present flood depths reach ~0.25 m to \sim 1.8 m (10% to 0.2% AEP scenarios respectively), and this excess is maintained \sim 80 km inland along this stretch of river before it starts to decline. The past/present storm-tide dissipates around ~130 km (10% AEP) and \sim 175 km (0.2% AEP) inland. At the upstream end of this Mekong reach, excess river flooding appears extensive both in height (where the Mekong River channel narrows in Cambodia), and in extent (as it diverts into the Tônlé Sap Lake and descends into the delta, as seen in Fig. 5Pm). We see in Fig. 6a and 6d that large flood discharges can increase the normal annual river water level as far down the channel as 130 km from the coast. Consequently, there is a zone in the middle where river flooding and storm tide both influence flood levels, between ~130 km to 580 ~180 km inland (between Sa Dec and Thanh Binh). When both river and storm-tide occur together, we see that the maximum heights of the storm-tide are somewhat pushed downstream towards the coastline. However, Fig. 6a and 6d together show that behind this, river flooding elevates flood levels in this same mixing region by ~ 0.2 m.

The area of excess flooding (in km^2), above baseline conditions is listed in Table 6, for each of the 49 past/present scenarios. A colour scale indicates the scenarios with the greatest difference in area away from the past/present baseline: green indicates small change, and red indicates a greater change in area. As expected, the areas of flood excess area increase with increasing flood magnitudes. The greatest flood area gains occur when the comparatively dry delta begins to fill with diverted river discharges. The system is of course designed to disperse these river 590 flows efficiently, but gains in extent are added irregularly, symptomatic of a managed system. Sluice gates and weirs are designed to divert flows once a water level is reached. Zones flood as the storage becomes available, depending on topography.

Figure 6 – Left: Profile view of relative flood depth within the Mekong-Tien-Co Chiên River for past/present (solid line) and future (dashed line) climates. Coastline is at the right side (0 km from coast) and Kratie is on the left (~600 km inland along this river line). Riv = river, ST = storm tide, Baseline (SL) = tide-only simulation. The future results include 0.25 m additional SLR at the coastline. Flood depths are relative to the past/present median river and tide-only simulation. The panels show (a) Median, 10%, 1% and 0.2% AEP return period river discharges vs tideonly (no surge); (b) Median, 10%, 1% and 0.2% AEP return period river discharges vs 0.2% AEP storm tide; (c) Fixed Median discharges in the river vs Median, 10%, 1% and 0.2% AEP return period storm tides; (d) Fixed 0.2% AEP return period river discharges vs Median, 10%, 1% and 0.2% AEP return period storm tides. Figure Right: The Mekong-Tien-Co Chiên River line in red: 600 chainage 0 km at the coastline, up to 400 km inland.

Table 6 - km² area of excess flooding above past/present baseline - for (a) past/present scenarios up to year 2020; and (b) future scenarios up to year 2050.

Table 7 – Percentage increase in km^2 excess flood area between 2020 and 2050.

		Storm-tide Flood (%AEP)							
		Baseline	10	γ ∠		0.4	0.2	0.1	
tie œ \geq ี $\tilde{}$ ÷۲ ≂ $F1$ 00 \mathfrak{E} ධ ż	Baseline		523%	430%	360%	311%	269%	246%	
	10	58%	24%	31%	24%	22%	19%	18%	
		43%	15%	21%	17%	15%	13%	13%	
		40%	13%	19%	16%	14%	13%	12%	
	0.4	35%	9%	17%	14%	13%	12%	11%	
	0.2	35%	10%	16%	14%	12%	11%	10%	
	0.1	32%	8%	15%	13%	12%	10%	10%	

Duration of flood inundation in the delta, beyond a past/present baseline, are shown in Fig. 7Pa to 7Pp for select AEP scenarios (10%, 1% and 0.2%). Again, the y-axis shows river flood magnitude scenarios, and the x-axis

610 shows storm-tide magnitude scenarios. Blue and pink colours indicate days extra, up to 3 weeks. At the other extreme, flood duration of up to 2 months is given by brown and yellow colours. The past/present results show that it is river flooding in the Cambodian (upper) Mekong River delta that tends to flood for longer as magnitude of river flooding increases. The river flood hydrograph had duration of approximately 2 weeks (Fig. 3) in our simulation. In the canalised Vietnamese (lower) delta, flooding is distributed. Any direct or indirect (compound) flood impacts inland are contained to the channel or diverted, within short timescales (1-5 days). Flooding relating to storm-tide events at the coast only lasts \sim 2 days, as expect given the coastal boundary conditions (see Fig. 4).

5.2 Contrasting past/present and future compound flood risk

Building on our assessment of past/present compound flood characteristics in the delta, our second objective is to explore how compound flooding will change over time (up to 2050) due to a projected high-emission (SSP5-8.5) 620 climate change scenario. Areas of excess flood inundation, relative to the past/present baseline, are shown in Fig. 5Fa to 5Fp, again for select AEP scenarios (10%, 1% and 0.2%). By 2050 we see a similar pattern to the past/present state in that river and storm-tide flooding are mostly separate processes within the delta. However, the impact of sea-level rise (0.25 m in this scenario) clearly impacts the subsequent excess depth of floodwaters during the storm-tide event. More of the lower delta (centred on Point 4) now has a substantial depth of extra flood water (1.5-2.0 m). The area covered by a 1% AEP storm-tide flood (river is baseline) in the past/present simulation is 7,377 km², and in the future simulation it is ~33,950 km² (a 4.6 times bigger area). Where in the past/present excess flood depths of \sim 1.5 m in the middle delta would only be projected during the most extreme 0.2% AEP storm surge (Fig. 5Pd, 5Ph, 5Pl, 5Pp); by 2050 this extra depth of flooding can be seen even during 1% AEP scenarios, and especially where river flooding occurs at the same time (Fig. 5Fg, 5Fk, 5Fo).

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Similarly, future increased river discharges still flood the wider floodplains around the Tônlé Sap Lake and upper delta regions around the Cambodia-Vietnam border. In these wide and shallow floodplain areas, in all scenarios, the flood depth difference increases by ~ 0.25 m in the future (from around 0.1-0.5 m to around 0.3-0.8 m). In some locations future excess flood depths may reach 0.6-1.0 m for the first time, and such depths may occur more often, as they are to be found in the more likely river flood event scenarios (the 10% AEP flood; Fig. 5Fe, 5Ff, 5Fg, 5Fh). Surprisingly, future storm-tides of 10% AEP (Fig. 5Fb, 5Ff, 5Fj, 5Fn) with SLR are not seen to flood the coastline to any substantial additional depth, relative to the past/present baseline. This may be a response by the (present-state) model to permanent higher future mean sea levels, triggering flood defence/redistribution action, but further investigation is warranted.

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Figure 7 - Number of days that flood depths are over 0.5 m higher than the past/present baseline (Pa), measured between 10 August and 29 September; for years 2020 (Pa-Pp, left) and 2050 (Fa-Fp, right).

The profile of excess future flooding, relative to the past/present baseline, is shown in Fig. 6 (dashed lines). At the coastline we see a sustained higher storm-tide excess flood height in larger magnitude storm-tides, that persists \sim 40 km further inland than we see today (Fig. 6d, 6e). At the upstream river boundary increases in future flows elevate flood levels by ~0.8m between Kratie station and the Cambodia/Vietnam border at -450 km inland. When there is compound flood (Fig. 6b, 6d), there is a ~70 km long stretch of river, between around Sa Dec and Tan Chau, where compound flood hazard appears to present a particular danger, at the most extreme generating up to an additional ~1.5 m depth of flood water in areas close to the Mekong-Tien-Co Chiên River channel (Fig. 5Ph, 650 5Pl, 5Pp).

The area of excess flooding (in km²), for each of the proposed 49 future scenarios, relative to the past/present baseline, is listed in Table 6. Table 7 shows the percentage increase in flood areas between the past/present and future scenarios. There is a marked increase in the excess flood area extent between the past/present and future scenarios. For example, around year 2050 the flood extent linked to a 10% AEP river flood, combined with a 1% AEP storm-tide, is around 24% bigger than the same event today. In these future scenarios, excess flood water is diverted towards parts of the lower delta previously unflooded. The south-west of the delta, around Hau Giang, Kien Giang and Bac Lieu provinces experiences up to an extra 0.5 m depth of flooding in the future. The area calculations in Table 6 show that annual flood probabilities also are likely to occur with more frequency. For 660 example, the additional flood area resulting from a combined low probability 0.4% AEP (1 in 250 year) storm tide with a 1% AEP (1 in 100 year) river flood in a past/present climate, is projected to result from something like a more likely 10% AEP (1 in 10 year) river flood with a 2% AEP (1 in 50 year) storm tide in the future.

Additional days of flood inundation in the future, relative to the past/present baseline, are shown in Fig. 7Fa to 7Fp. Results show that the major waterways of the lower delta around the coastline could, in the future, have up to 10 extra days of inundation due to the combination of SLR and storm-tide. But increasing storm-tide magnitude does not widen the coastal region affected. Flood waters are largely contained to the area east of the Bassac/Hau river, but there are a greater number of reaches which would transition from 0-5 days to 6-10 days as a result of such flooding (compare Fig. 7Po with Fig. 7Fo, for example). By contrast, the future Mekong delta is greatly 670 affected by the increased river discharges in the upper delta zone around the Cambodia-Vietnam border. This area would have 0-15 days of additional flooding in only the median river flood scenario (Fig. 7Fa), due to increases in river flow, as a result of climate change. This area today is the zone most likely to retain current floodwaters during a major flood in the Mekong delta. In the future 10% AEP scenario (all storm-tides), duration of flooding increases to 6 days to months extra, depending on the proximity to the main channel. Under the more extreme 0.2% AEP river flood, a large proportion of this area would be flooded for months longer than today.

5.3 Compound flood areas

Our third and final objective is to assess which regions of the delta are river, coastal, or compound flood dominated, and how this might change in the future with climate change. Maps of the Compound Ratio (C_r) are shown in Fig. 8Pf to 8Pp (past/present), and Fig. 8Ff to 8Fp (future), for select (10%, 1% and 0.2% AEP 680 combinations) return period scenarios. The red zones are river-dominant (i.e. have a C_r value of 0.8-1.0 when compared to a river-only flood scenario), blue zones are storm-tide-dominant (i.e. a C_r value of 0.8-1.0 when

compared to a surge-tide-only flood scenario) and yellow areas indicate compound flooding regions (Cr value of 0-0.8).

Figure 8 highlights the tension between the two flood drivers during a compound flood event. Clearly, river flooding is a major driver within the delta. The river dominant red zone is large in all scenarios, illustrating river dominance but also areas of natural flood storage and retention. As the magnitude of river flooding increases in the past/present delta (e.g., opposing a comparatively small 10% AEP magnitude storm-tide; Fig. 8Pf, 8Pj, 8Pn), flood extents barely grow due to the highly-engineered system for capture and redistribution. However if normal 690 discharge routes into the sea become temporary inaccessible due to a larger storm-tide (Fig. 8Ph, 8Pl, 8Pp). This discharge turns inward spreading out into the lower delta and towards the Bassac River. This new flood extent is largely compound flood waters. The push and pull between the two flood drivers can also be seen with the movement of the compound zone: seawards as river dominant waters increase in magnitude (contrast Fig. 8Ph with Fig. 8Pn), and inland/upstream as storm tide become the dominant process (contrast Fig. 8Pf with Fig. 8Pp).

The same effects can be observed in the future results (Fig. 8F). However with greater flood volumes in the future, and projected higher storm-tides at the coast by year 2050, the compound zone is smaller, being squeezed with less apparent mixing. The areas of river or storm-tide dominance appear greater in the future too (e.g., contrast the red 1% AEP river flood, blue 1% AEP storm-tide floods of Fig. 8Pk with Fig. 8Fk). However there is also less 700 apparent spillover into the central/Bassac River regions when a storm-tide blocks egress of river flood waters in the future. Of additional note is the model response to the future 10% AEP storm tide (Fig. 8Ff, 8Fj, 8Fn), where no blue zone storm-tide dominant waters are seen. Figure 5Pb (past/present) and Fig. 5Fb (future), together with the profile plots of Fig. 6c and 6d, tells us that the 10% AEP storm-tide is very close to baseline levels, particularly at the coastline. As such, the reason why this occurs could be that the settings of the past/present flood defences in the model effectively mitigate the 10% AEP flood in the future delta (i.e., flood gates are triggered early because climate change adds an additional 0.25 m to sea levels through the entire simulation), and/or the subtleties of the 10% AEP storm-tide are missed in our approach to mapping flood extents. More detailed modelling may be useful to clarify.

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Figure 8 Compound Ratio for the 10%, 1% and 0.2% combination of events, illustrating the relative dominance of river vs storm tide flood processes within the domain for past/present (left side: Pf-Pp) and future (right side: Ff-Fp) scenarios.

6 Discussion

Results show that fluvial flooding in the Mekong River delta, coinciding with a storm-tide at the coast brings the effects of compound flooding to central regions of the Vietnamese lower delta where the highly engineered network of dykes, flood gates, and weirs can efficiently divert flood waters above the 0.5 m (summer dykes) to ~4 m (winter dykes) thresholds, into compartments of rice paddies and fisheries, and redistribute the unwanted volumes into the sea. But, in our test, we found that storm-tides act to oppose normal egress of high Mekong River flows around the struck coastline, thus compound flooding disrupts normal flood rerouting processes within some parts of the delta. Due to this temporary (< 2-day) block, greater depth of flooding is observed upstream (1-6 m 720 extra depth of flooding in the narrow channels between Kratie and Phnom Penh) in river dominant zones, and as much as an extra 3 m depth of flooding can occur in storm-tide dominant zones at the coastline $(\sim 100 \text{ km} \text{ wide})$ and, under 0.2% AEP flood conditions, up to \sim 160 km inland). The travel speed of TC's making landfall is also of significance in this context, because slower-moving TCs will increase the risk of compound flooding. The transport speed of the TC making landfall in our model was an average from the 10 events at point 4 (Sect. 4.2). However for slower than average TCs, associated storm surges would last for longer, as would the period of intense TC-linked rainfall.

The combination of TC-linked precipitation regionally, with storm-tides to Vietnam's eastern coastline, creates compound flooding in the main Mekong-Tien-Co Chiên River channel that spills into adjacent land: south-730 westwards around the Bassac/Hau River near to Can Tho (Ang Giang province), and north-eastwards towards the Plain of Reeds (Dong Thap province). This compound zone extends along $a \sim 50$ km to ~ 80 km section of the upper and middle delta, up to the Cambodia-Vietnam border, although the area covered varies with flood driver magnitude (e.g., a 10% AEP river flood combined with a 2% AEP storm surge would flood an extra ~26,300 km² of land above 0.1 m). Clearly, many Vietnam wards and communes in the central region are vulnerable to experiencing new, or greater, depths of flooding relative to the 'good' flood welcomed by farmers annually because of compound flooding linked to TC activity. Compound flood risk, particularly associated with TCactivity, is not something customarily included within regional and local emergency and flood management plans for this area, despite the projected consequences for inhabitants of these central areas, and thereafter for national food supply/security. However, strengthening resilience against climate risks, such as extreme flooding, is a 740 regional priority for those managing the wider basin (Basin Development Strategy and MRC Strategic Plan Mekong River Commission, 2021). The current plans largely benefit urban centres and high-value agricultural land in the mid-delta, such as around Can Tho, through flood defence upgrades (levees, tidal barriers, engineered systems).

Our results tells us that compound flooding in the future Mekong River delta will produce floods of greater magnitude, that last longer, and thus produce greater flood depths with more frequency than today. A greater area of the lower delta will be flooded overall, even for smaller magnitude compound events (a 1% AEP storm tide with a 1% AEP river flood scenario today is equivalent to a baseline flood by year 2050). In our model set up, south-western parts of the delta, around Hau Giang, Kien Giang and Bac Lieu provinces, are projected to flood in 750 the future delta. Assuming that the population of Vietnam continues to grow, by year 2050 more people will be

impacted by compound flooding, more often. If more land area becomes inundated (even for low category storms), then unless the flood risk can be effectively and fully mitigated, flood managers in the Mekong River delta may have to consider flood resilience as standard for homes, infrastructure and future agriculture in plans beyond 2030. If compound flooding is not unequivocally included within future strategic plans for the Mekong River delta, beyond 2030, a rethink may be required. That rethink could focus on particular risks from compound flooding such as (i) overtopping of existing flood defences (river and sea dykes) and flood storage availability; (ii) the likelihood of compound flood inundation to new areas of the delta, potentially not as fully protected as other flood-prone regions, and implications for its inhabitants; (iii) protecting high value land, and implications of future flooding on future land use needs; (iv) in a sinking delta what options are available to remove or relocate excess 760 flood waters; (v) consideration of compound flood duration and the implications of this directly on local health (e.g., sanitation, drinking water), social welfare, livelihoods, transport infrastructure and industrial systems; (vi) the likely future demographics and the implications of by age and distribution; and finally (vii) how compound flooding may alter current and future flood evacuation plans.

7 Conclusions

The overall aim of this paper was to better understand the issue of compound river and storm-tide flooding in the Mekong River delta as a result of plausible TC activity, and how it changes over time, through the use of a detailed 1D MIKE 11 river model, updated with recent survey data. We simulated one specific scenario of a TC striking close to the Co Chiên River distributary of the Mekong River. Our results show that compound flooding is markedly different from single-driver flooding in the delta. In the present climate, compound floods produce 770 greater depth of flooding, and floods travel into new areas of the delta if unmanaged (e.g., a modest 10% AEP river flood combined with a 2% AEP storm surge at the Mekong River mouth would flood an extra ~26,300 km² of land above 0.1 m). We identified an active compound zone within the central area of the Mekong River delta that is a mixture of storm-tide flooding and river flooding, and it changes shape and shifts depending on the magnitude of our two flood drivers.

By 2050 (SSP5-8.5 projections), sea level rise further exacerbates the compound hazard because a greater volume of water entering the delta will more quickly fill available flood storage areas, and storm tides begin at greater height. Our results suggest that, compared to today, future compound flooding increases in magnitude, duration and frequency in the Mekong River delta. A future delta with compound flooding that lasts longer in parts, and is 780 likely to flood at higher levels, more often, has important implications for how the future delta is managed, and for the status of flood defences, standards and storage today. The complication of compound flooding is an important consideration for deltas beyond the Mekong River delta, specifically those in Asian and African regions subject to a changing atmospheric climate over the coming decades. Any flood managers responsible for deltas in tropical and sub-tropical zones need to be aware of the extra hazards associated with TC-linked flooding today, and how this will change in the coming decades. Compound flooding will introduce extra considerations to not only flood defences, thresholds and flood detention/storage options, but also has implications for plans and policies relating to future land use, economic investment, population health, and access. Adaptation to this hazard

is critical for the future delta. Compound flooding may be best managed with layered defences over a wider area, for optimum flexibility, with an eye to both future depth of flooding and future flood durations.

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There are inherent uncertainties built into our modelled results, due to the series of assumptions made in the construction of future river discharges, and future extreme sea levels based on projections for our changing climate. Future studies could explore the bounds of this uncertainty with more data, or with new techniques. Alternatively, there are clear socio-economic impacts from compound flooding and future studies could explore this more widely. In our analysis, we employed a scenario assuming a worst case scenario of a TC strike and river flood peak occurring almost concurrently, at a date in the middle of the wet season. Variations of this set up will alter model outcomes and be interesting to explore. In particular, the compound hazard where TCs make landfall at different locations/orientations has not been explored here, nor the impact of compound flooding in a delta with changing morphologies due to sand mining, coastal development, or land subsidence. These topics could also be 800 interesting and rewarding areas of future research.

Author contribution

IDH conceptualised this work, designed the methodology, supervised the model design and provided supervision in the UK. IDH was also in charge of the COMPFLOOD project administration. The supervision, methodology development, and resources in Vietnam were provided by TBH and NNH, with formal data analysis carried out by QQL. MW carried out the hydrodynamic modelling simulations, conducted the formal analysis, and prepared the first draft of the manuscript. SD, NB, RM and JJ-MH provided key resources for this study. All authors commented on and edited the paper prior to submission. Kate Davis (University of Southampton) contributed 810 significantly to visualization in creating a number of figures for this manuscript.

Competing interests

The authors declare that they have no conflict of interest.

Acknowledgements

This work was supported by the UK Natural Environment Research Council (Grant Number NE/S003150/1), and the Ministry of Science and Technology of Vietnam and National Foundation of Science and Technology Development (NAFOSTED-RCUK fund). In personal communications, Dr Philip Minderhoud (Wageningen University) provided expert advice on the vertical datum adjustments required when working with local measurements in the Mekong River delta, and Dr Hal Voepel (University of Southampton) and Dr Christopher Hackney (Newcastle University) kindly shared processed river discharge data. The authors wish to acknowledge 820 the use of the IRIDIS High Performance Computing facility, and associated support services at the University of Southampton in the completion of this work. We thank our Illustration Technician Kate Davis (University of Southampton), for creating key figures in this document. At the University of Bristol, we would like to thank Dr Laurence Hawker and Prof Jeff Neal for sharing FAB-Digital Elevation Model (FABDEM) data, of the Mekong River delta (https://data.bris.ac.uk/data/dataset/s5hqmjcdj8yo2ibzi9b4ew3sn). FABDEM is derived from the European Space Agency's Copernicus GLO 30 DEM data (https://copernicus-dem-30m.s3.amazonaws.com/readme.html). Lastly, we thank the German Aerospace Centre, DLR, for sharing TanDEM-X data of the Mekong Delta which was extremely useful to in our analysis (https://tandemxscience.dlr.de/ © DLR 2020).

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