Fluvial sediment supply to a mega-delta reduced by shifting tropical-cyclone activity

Stephen E. Darby¹, Christopher R.Hackney¹, Julian Leyland¹, Matti Kummu², Hannu
Lauri³, Daniel R. Parsons⁴, James L. Best⁵, Andrew P. Nicholas⁶, Rolf Aalto⁶

¹Geography and Environment, University of Southampton, Southampton SO17 1BJ,
 United Kingdom
 ²Water and Development Research Group, Aalto University, Aalto, Helsinki, Finland

³EIA Finland Ltd., Sinimäentie 10B, 02630 Espoo, Finland

⁴Department of Geography, Environment and Earth Sciences, University of Hull, Hull,
HU6 7RX, United Kingdom

- ⁵Departments of Geology, Geography & GIS, Mechanical Science and Engineering and
- 12 Ven Te Chow Hydrosystems Laboratory, University of Illinois, Champaign, IL 61820,13 USA
- ⁶Department of Geography, University of Exeter, Exeter, EX4 4RJ, United Kingdom
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The world's rivers deliver 19 billion tonnes of sediment to the coastal zone annually¹, 17 18 with a significant fraction being sequestered in large deltas, home to over 500 million people. Most (>70%) large deltas are under threat from a combination of rising sea 19 levels, ground surface subsidence and anthropogenic sediment trapping^{2,3}, and a 20 21 sustainable supply of fluvial sediment is therefore critical in preventing deltas being 'drowned' by rising relative sea levels^{2,3,4}. Here, we combine suspended sediment 22 23 load data from the Mekong River with hydrological model simulations to isolate the 24 role of tropical cyclones (TCs) in transmitting suspended sediment to one of the 25 world's great deltas. We demonstrate that spatial variations in the Mekong's 26 suspended sediment load are correlated (r = 0.765, p < 0.1) with observed variations 27 in TC climatology, and that a significant portion (32%) of the suspended sediment load reaching the delta is delivered by runoff generated by TC-associated rainfall. 28 29 Furthermore, we estimate that the suspended load to the delta has declined by $52.6 \pm$ 30 10.2 Mt over recent years (1981-2005), of which 33.0 ± 7.1 Mt is due to a shift in TC 31 climatology. Consequently TCs play a significant role in controlling the magnitude of, and variability in, transmission of suspended sediment to the coast. It is likely that 32

anthropogenic sediment trapping in upstream reservoirs is a dominant factor in
explaining past^{5,6,7,8}, and anticipating future^{9,10}, declines in suspended sediment loads
reaching the world's major deltas. However, our study shows that changes in TC
climatology affect trends in fluvial suspended sediment loads and thus are key to
fully assessing the risk posed to vulnerable coastal systems.

The world's largest rivers contribute a disproportionately large fraction (Extended 38 39 Data Table 1) of the terrestrial sediment flux, which has both created, and is critical in 40 sustaining, their great deltas. Moreover, river borne sediments are a key vector for carbon and nutrients, thereby playing a vital role in global biogeochemical cycles^{11,12}. However, a 41 42 significant majority (>70%) of large deltas are now recognized as being under severe threat from rising relative sea levels^{2,3}, in part due to reported anthropogenically-driven 43 reductions in sediment loads^{5,6,7,8}. Many large rivers are located in tropical regions 44 45 (Extended Data Figure 1) that exhibit highly seasonal flow regimes affected by tropical cyclones (TCs). Previous work has shown that TCs can deliver much higher than normal 46 47 levels of rainfall, effectively triggering landslides and mobilizing sediments into the river network, thereby generating very high instantaneous sediment loads^{13,14,15}, showing that 48 TCs are effective agents of erosion in uplands. However, notwithstanding some prior 49 studies in smaller drainage basins^{16,17}, the role of TCs in driving sediment delivery to the 50 lowlands and coast remains unclear. As noted, this is particularly the case for large rivers 51 52 that carry much of the terrestrial sediment flux because these rivers are, in their mid- to lower- reaches, typically bound by massive floodplains that can sequester significant 53 volumes of suspended sediment into storage during floods¹⁸. Here we address this 54 uncertainty by quantifying the significance of TCs in driving suspended sediment loads 55 56 through an exemplar mega-river, the Mekong.



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Figure 1. The hydrometereological gauging network of the Mekong River and associated 59 tropical cyclone climatology. a, Locations of hydrological stations at Luang Prabang 60 $(19.892765^{\circ} \text{ N} \ 102.133603^{\circ} \text{ E}; \text{ upstream drainage area, } A = 323,600 \text{ km}^2)$, Mukdahan 61 $(16.542981^{\circ} \text{ N} \ 104.731914^{\circ} \text{ E}, A = 464.100 \text{ km}^2)$, Pakse $(15.113891^{\circ} \text{ N} \ 105.801083^{\circ} \text{ E}, A = 464.100 \text{ km}^2)$ 62 = 632,600 km²), Stung Treng (13.524850° N 105.942341° E, $A = 722,300 \text{ km}^2$) and Kratie 63 $(12.481499^{\circ} \text{ N} \ 106.017898^{\circ} \text{ E}, A = 734,200 \text{ km}^2)$ in the Mekong River drainage basin, also 64 showing the topography of the basin and the locations of the meteorological stations used 65 herein. **b**. Climatology of tropical cyclones as represented by a normalized Accumulated 66 Cyclone Energy (ACE)⁴² metric during 1981-2005. c, Estimates of mean annual rainfall 67 associated with tropical cyclones during 1981-2005. Details of the procedures used to 68 estimate the rainfall associated with tropical cyclones and the ACE metric are given in the 69 Methods. 70

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72 Draining the Tibetan Plateau and the Annamite Mountains bordering Laos and 73 Vietnam (Fig. 1), and with the monsoonal climate generating intense rainfall, the Mekong basin (795,000 km²) generates fluxes of water (450 km³ yr⁻¹)¹⁹ and sediment (~160 Mt yr⁻¹, 74 but see below)²⁰ that rank tenth and ninth, respectively, amongst the world's great rivers¹. 75 The Mekong is therefore similar to other major rivers (e.g., Ganges-Brahmaputra, Yangtze, 76 77 Mississippi) that transmit globally significant sediment loads and that are influenced in their mid to lower courses by TCs. Similar to these other rivers, the sediments of the 78 Mekong River have resulted in the formation of a large delta, with significant 79 contemporary debate on the extent to which declining sediment loads may in the future 80 increase the vulnerability of the Mekong delta to rising sea-level^{7,9,21}. 81

82 To quantify the influence of TCs on the suspended sediment transport regime, we 83 determined temporal (25 years) and spatial (1400 km study reach) variations in suspended 84 solids loads throughout the Lower Mekong River (see Methods). Specifically, we first 85 employed a distributed hydrological model, forced with two climate scenarios, one with 86 and the other without observed TCs, to simulate water discharges at five river gauging 87 stations (see Methods for model details and Fig. 1 for gauging station locations): Luang 88 Prabang in Laos (LP), Mukdahan in Thailand (MK), Pakse in Laos (PX), and Stung Treng 89 (ST) and Kratie (KT), both in Cambodia. Importantly, these five river gauging stations are 90 situated on an environmental gradient that spans regions that are weakly (LP) to moderately (MK, PX) to strongly (ST, KT) affected by TCs (Figs 1b, 1c). We then 91 92 analysed archival measurements of suspended solids concentration, collected by the 93 respective national hydrological agencies, to construct new suspended sediment rating 94 curves - statistical functions linking the rate of suspended sediment transport to water 95 discharge - for the five stations (see Methods and Extended Data Figure 2). These rating 96 curves were then used with the model-simulated water discharges to compute suspended 97 solids loads and to apportion these loads into TC-driven components ($Q_{s TC}$) using:

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$$Q_{s_TC} = Q_s \left(\frac{Q_{sim_TC}}{Q_{sim}}\right)$$
(1)

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101 where Q_s is the total suspended sediment load as computed using the sediment rating 102 curves with the total simulated flow discharge, Q_{sim} (*i.e.*, the flow discharge for the 103 baseline scenario with the observed climatology including TCs), and Q_{sim_TC} is the 104 proportion of the simulated flow discharge attributable to TCs. The quantity Q_{sim_TC} in Eq. 105 (1) is determined by differencing the flow discharges computed in the two scenarios with 106 (Q_{sim}) and without (Q_{no_TC}) TCs, such that $Q_{sim_TC} = Q_{sim} - Q_{no_TC}$.



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Figure 2. Daily flow discharge and suspended solids load at Kratie during 1st January 109 1995 to 31st December 1999. **a**, Daily simulated (Q_{sim}) and observed (Q_{obs}) water flows, 110 along with the daily water flows attributable to tropical cyclones (Q_{sim_TC}). **b**, Daily total 111 suspended solids load ($Q_{s;}$ in megatonnes per day) and daily suspended solids load 112 attributable to tropical cyclones (Q_{s_TC} ; also in megatonnes per day). Note that the period 113 1995 to 1999 encompasses the years during the 1981-2005 study period that are the most 114 (1996) and least (1999) strongly affected by tropical cyclones.

116 The hydrological model predicts water discharges that closely match historical 117 records (as an example we show data for Kratie in Fig. 2a, but results for all other stations 118 are shown in Extended Data Figure 3, with fit statistics summarized in Extended Data Table 2). Notable peaks and troughs in the total simulated flow discharge (Q_{sim}) and the 119 120 flow discharge attributable to TCs ($Q_{sim TC}$) are evident. These variable flows force 121 significant fluctuations in simulated instantaneous suspended sediment loads, but notably 122 there are multiple TC-forced suspended sediment transport events in most years (as 123 indicated by the peaks in **Fig. 2b**). Integrating over the 25-year study period then yields 124 estimates of mean annual suspended sediment load (Extended Data Table 3). Our estimate for Kratie $(87.4 \pm 28.7 \text{ Mt yr}^{-1})$, the station closest to the apex of the Mekong delta, falls 125 within the lower limit of the range (~81 Mt yr⁻¹ to 111 Mt yr⁻¹) of recent estimates^{1,22,23}, 126

127 although it is substantially less than the *c*. 150 - 170 Mt yr⁻¹ cited by older studies^{19,24} 128 based on less reliable datasets.

129 Importantly, our results illustrate the extent to which the modest (at annual timescales) rainfall totals associated with TCs nevertheless effectively generate runoff and 130 131 suspended sediment transport. During 1981-2005, TCs only delivered between 1.8% 132 (above Luang Prabang) and 4.7% (above Kratie) of annual rainfall, but generated between 133 13.7% (Luang Prabang) and 28.8% (Kratie) of annual runoff. The proportion of the mean annual suspended sediment load forced by TC-associated runoff is greater still, varying 134 135 between 15.2% (Luang Prabang) and 31.7% (Kratie) (Extended Data Table 3). There are 136 two reasons for this amplification effect. First, TC-derived rainfall is strongly seasonal, 137 falling largely during, or just after, the monsoon months, when catchments are pre-wetted; consequently TC-associated rainfall is very effective in generating runoff²⁵. Second, the 138 139 sediment rating functions linking suspended sediment flux and water discharge possess 140 exponents with values exceeding unity (Extended Data Figure 3), meaning that the peak 141 flows generated by TCs promote very high instantaneous suspended sediment fluxes. 142 Therefore, suspended sediment transport associated with TCs contributes substantially to 143 mean annual loads, with the former correlating well (r = 0.765, p = 0.099) with the time-144 averaged TC climatology as represented by the 1981-2005 Accumulated Cyclone Energy 145 (ACE; Extended Data Table 3).

Temporal trends in annual suspended sediment load (Q_s) , and the component of that load associated with TCs (Q_{s_TC}) , during 1981-2005 are shown for Kratie in **Fig. 3** (results for all the other stations are shown in Extended Data Figure 4). Nonparametric Mann-Kendall tests (see Methods) reveal that there have been declines in both Q_s and Q_{s_TC} at three (Mukdahan, Stung Treng, and Kratie) of the four stations that are either moderately or strongly influenced by TCs (the exception is Pakse, as discussed below). As 152 expected, the station that is only weakly affected by TCs (Luang Prabang, Extended Data 153 Fig. 4a) does not exhibit any significant trends in Q_s or Q_{s_TC} that are not artefacts of the 154 response of this station to upstream damming. Importantly, recent historical declines in Q_s 155 at Mukdahan, Stung Treng and Kratie (Extended Data Figure 4 and Fig. 3) are driven to a 156 large extent by declines in the suspended sediment load attributable to TCs ($Q_{s TC}$). Specifically, at Mukdahan 62% of the 21.4 Mt decline in Q_s between 1981 and 2005 is 157 158 attributable to reducing $Q_{s TC}$ (Extended Data Fig. 4b). At the Cambodian stations, 44% 159 (Stung Treng; Extended Data Fig. 4d) and 61% (Kratie; Fig. 3) of the declines in Q_s are 160 attributable to reducing $Q_{s TC}$. Thus, the response of Q_s over time is intimately tied to the 161 extent to which upstream catchments receive TC-derived rainfall (Extended Data Figure 162 5).

163 As noted above, Pakse is exceptional in that it is moderately influenced by TCs 164 (4.1% of annual rainfall is associated with TCs), but TC-driven runoff (8.4%) and 165 suspended sediment loads (9.3%) are both anomalously low compared to Mukdahan, 166 Stung Treng and Kratie (Extended Data Table 2). However, TC-associated rainfall is less 167 hydrologically effective at Pakse because flows there are strongly influenced by inflows 168 from a major west bank tributary system, the Mun/Chi, that joins immediately upstream of 169 the gauge and which drains a region that is only mildly influenced by TCs (Fig. 1). 170 Additionally, the exponent in the suspended sediment rating curve at Pakse is much less 171 than those at Stung Treng and Kratie (Extended Data Figure 2), meaning the higher flows 172 associated with TCs generate comparatively lower instantaneous suspended sediment 173 transport rates.



Figure 3. Time series of annual suspended solids loads at Kratie during 1982 to 2004. The total annual suspended solids load (Q_s ; megatonnes per year) and suspended solids load attributable to tropical cyclones (Q_{s_TC} ; also in megatonnes per year) are shown with significant (p < 0.05) trends as identified by Mann-Kendall analysis indicated by the dashed lines. The numerical value of the time-rate of change of annual suspended solids load (with error) is also indicated for each of the trend lines.

182 Our results are the first to demonstrate the substantial extent to which tropical 183 cyclones are effective in transmitting suspended sediment load through the lowlands of large rivers, a finding that has profound implications. A substantial portion (~40 to 50%)²⁶ 184 185 of the suspended sediment load of the Mekong River is deposited in its delta, home to 20 million people and the rice basket of SE Asia^{21,27}. Significant concerns have been raised 186 regarding the scale of recent and projected future reductions in the sediment load reaching 187 the delta, as a result of sand mining^{21,28} and upstream damming^{9,10,21}. However, our study 188 189 reveals that during the period 1981-2005, the Mekong at Kratie is estimated to have 190 experienced a cumulative loss of 33.0 ± 7.1 Mt of its suspended sediment load (Fig. 3) as 191 a result of changes in precipitation delivered by TCs crossing the Mekong basin (Extended 192 Data Figure 5). Limitations in the observational data make it challenging to fully 193 contextualize the 1981-2005 trends in TC climatology, that are the focus of this paper, 194 within the longer term historical record (Extended Data Figure 6). Nevertheless, our key 195 finding, namely that changes in TC climatology represent a significant, but previously neglected, driver of suspended sediment transmission through the Mekong River, remains 196

197 robust. Furthermore, high-resolution climate models indicate that although the number and 198 intensity of TCs tracking across the South China Sea will likely increase under future 199 anthropogenic climate change, their track locations will shift eastwards and away from the Indochina peninsula, leading to net reductions in ACE over the Mekong basin²⁹. If these 200 201 projected reductions in ACE are correct, TC-driven suspended sediment delivery to the 202 Mekong delta will decline still further, exacerbating projected declines in sediment loads due to damming^{8,9,10} and sand mining and placing the delta at even greater risk. Although 203 204 our data focus on the suspended sediment load, the delivery of bedload sediment, which is important in the construction, or restoration, of deltas³⁰, would also be lessened by a 205 206 reduction in cyclone-associated sedimentation. Furthermore, other large rivers that 207 transport a significant proportion of the global sediment flux are also affected by TCs. Our 208 study indicates that their deltas may also be much more significantly affected by, and 209 vulnerable to, changes in tropical cyclone climatology than assumed in current 210 assessments of the impacts of future environmental change.

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212 References

- Milliman, J. D. and Farnsworth, K. L. *River discharge to the coastal ocean: A global synthesis*, Cambridge University Press, Cambridge (2011).
- Ericson, J. P., Vörösmarty, C. J., Dingman, S. L., Ward, L. G., Meybeck, M. Effective sea level rise and deltas: Causes of change and human dimension implications. *Glob. Plan. Change.* 50, 63-82; doi: 10.1016/j.globplacha.2005.07.004 (2006).
- 218 3. Syvitski, J. P. M *et al.* Sinking deltas due to human activities. *Nat. Geosci.* 2, 681-686
 219 (2009).
- 220 4. Darby, S. E., Dunn, F. E., Nicholls, R. J., Rahman, M. and Riddy, L. P. A first look at the
 221 influence of anthropogenic climate change on the future delivery of fluvial sediment to the
 222 Ganges–Brahmaputra–Meghna delta. *Environ.Sci: Processes Impacts* 17, 1587-1600; doi:
 223 10.1039/C5EM00252D (2015).

- 5. Vörösmarty, C. J. *et al.* Anthropogenic sediment retention: major global impact from registered river impoundments. *Glob. Planet. Change* **39**, 169-190; doi:10.1016/S09218181(03)00023-7 (2003).
- Walling, D. E. and Fang, D. Recent trends in the suspended sediment loads of the world's rivers. *Glob. Plan. Change* 39, 111-126 (2003).
- 229 7. Giosan, L., Syvitski, J. P. M., Constatinescu, S. and Day, J. Protect the world's deltas.
 230 *Nature* 516, 31-33 (2014).
- 8. Shuai Wang *et al.* Reduced sediment transport in the Yellow River due to anthropogenic
 changes. *Nat. Geosci.* 9, 38-42; doi: 10.1038/NGEO2602 (2016).
- 233 9. Kummu, M. J., Wang, J. J., Lu, X. X. and Varis, O. Basin-wide sediment trapping efficiency
 234 of emerging reservoirs along the Mekong. *Geomorphology* 119, 181-197;
 235 doi:10.1016/j.geomorph.2010.03.018 (2010).
- 10. Kondolf, G. M., Rubin, Z. K. and Minear, J. T. Dams on the Mekong: Cumulative sediment
 starvation. *Water Resour. Res.* 50, 5158–5169; doi:10.1002/2013WR014651 (2014).
- 238 11. Richey, J. E., Brock, J. T., Naiman, R. J., Wissmar, R. C. and Stallard, R. F. Organic Carbon:
 239 Oxidation and transport in the Amazon River. *Science* 207, 1348-1351 (1980).
- 240 12. Aufdenkampe, A. K. et al. Riverine coupling of biogeochemical cycles between land,
 241 oceans, and atmosphere. *Frontiers in Ecology and Environment* 9, 53-60;
 242 doi:10.1890/100014 (2011).
- 243 13. Milliman, J. D. and Kao, S. J. Hyperpychal discharge of fluvial sediment to the ocean:
 244 Impact of Super-Typhoon Herb (1996) on Taiwanese rivers. *J. Geol.* 113, 503-516 (1996).
- 245 14. Dadson, S. J. *et al.* Links between erosion, runoff variability and seismicity in the Taiwan
 246 orogen. *Nature* 426, 648-651; doi: 10.1038/nature02150 (2003).
- 247 15. Hilton, R. G. *et al.* Tropical-cyclone driven erosion of the terrestrial biosphere from
 248 mountains. *Nat. Geosci.* 1, 759-762 (2008).
- Terry, J. P., Garimella, S. and Kostaschuk, R. A. Rates of floodplain accretion in a tropical
 island river system impacted by cyclones and large floods. *Geomorphology* 42, 171-182;
 doi:10.1016/S0169-555X(01)00084-8 (2002).
- 252 17. Amos, K. J., *et al.* Supply limited sediment transport in a high-discharge event of the
 253 tropical Burdekin River, North Queensland, Australia. *Sedimentology* 51, 145-162 (2004).
- 18. Aalto, R. *et al.* Episodic sediment accumulation on Amazonian floodplains influenced by El
 Niño/Southern Oscillation. *Nature* 425, 493-497; doi:10.1038/nature02002 (2003).
- 256 19. Mekong River Commission (MRC). Overview of the Hydrology of the Mekong River Basin,
 257 Mekong River Commission. Vientiane, Laos (2005).
- 258 20. Milliman, J. D. and Meade, R. H. World-wide delivery of river sediment to the oceans. J.
 259 *Geol.* 91, 1-21 (1983).

- 260 21. Anthony, E. J., *et al.* Linking rapid erosion of the Mekong River delta to human activities.
 261 *Sci. Rep.* 5, 1475; doi: 10.1038/srep1475 (2015).
- 262 22. Kummu, M. and Varis, O. Sediment-related impacts due to upstream reservoir trapping on
 263 the Lower Mekong River. *Geomorphology* 85, 275-293; doi:
 264 10.1016/j.geomorph.2006.03.024 (2007).
- 265 23. Lu, X. X., Kummu, M. and Oeurng, C. Reappraisal of sediment dynamics in the Lower
 266 Mekong River, Cambodia. *Earth Surf. Proc. Landforms* 39, 1855-1865;
 267 doi:10.1002/esp.3573 (2014).
- 268 24. Wang, J. J., Lu, X. X. and Kummu, M. Sediment load estimates and variations in the lower
 269 Mekong River. *River Res. & Applications* 27, 33-46 (2011).
- 270 25. Darby, S.E. *et al.* Decoding the drivers of bank erosion on the Mekong River: The roles of
 271 the Asian monsoon, tropical storms, and snowmelt. *Wat. Resour. Res.* 49, 2146-2163; doi:
 272 10.1002/wrcr.20205 (2013).
- 273 26. Manh, N. V., Dung, N. V., Hung, N. N., Merz, B. and Apel, H. Large-scale suspended
 274 sediment transport and sediment deposition in the Mekong delta. *Hydrol. Earth Syst. Sci.*, 18,
 275 3033-3053; doi: 10.5194/hess-18-3033-2014 (2014).
- 276 27. Kontgis, C., Schneider, A. and Ozdogan, M. Mapping rice paddy extent and intensification
 277 in the Vietnamese Mekong River Delta with dense time stacks of Landsat data. *Remote Sens.*278 *Env.* 169, 255-269; doi: 10.1016/j.rse.2015.08.004 (2015).
- 279 28. Brunier, G., Anthony, E. J., Goichot, M., Provansal, M. and Dussouillez, P. Recent
 280 morphological changes in the Mekong and Bassac river channels, Mekong Delta: The
 281 marked impact of river-bed mining and implications for delta destabilisation.
 282 *Geomorphology* 224, 177-191; doi:10.1016/j.geomorph.2014.07.009 (2014).
- 283 29. Redmond, G., Hodges, K. I., Mcsweeney, C., Jones, R. and Hein, D. Projected changes in
 tropical cyclones over Vietnam and the South China Sea using a 25 km regional climate
 model perturbed physics ensemble. *Clim. Dyn.* 45, 1983-2000; doi: 10.1007/s00382-014286 2450-8 (2014).
- 30. Nittrouer, J. A. and Viparelli, E. Sand as a stable and sustainable resource for nourishing the
 Mississippi River delta. *Nat. Geosci.* 7, 350-354; doi: 10.1038/ngeo2142 (2014).
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- 290 Supplementary Information is available.
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304 Author Contributions

305 S.E.D., J.L., C.H., D.P., J.L.B., A.P.N. and R.A. jointly conceived the study. C.H., S.E.D.,

J.L., J.L.B and D.P. collected and processed the field data. C.H. constructed the sediment
rating curves and, with S.E.D., undertook the data analysis. M.K. and H.L. conducted the
model simulations, with the tropical cyclone track data and rainfall anomalies being
computed by J.L. S.E.D. drafted the paper, which was then edited by all co-authors.

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311 Author information

- 312 The authors declare no competing financial interests. Correspondence and requests for
- 313 materials should be addressed to S.E.D. (<u>S.E.Darby@soton.ac.uk</u>).
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315 Methods

Hydrological Model. The VMod hydrological model³¹ was selected based on its success
in prior studies of the Mekong River basin^{25,32,33}. As implemented for the Mekong River,
VMod employs a 5×5 km (25 km²) grid, with surface elevation, gradient, aspect,
vegetation and soil type in each cell being extracted from the SRTM DEM³⁴, GLC2000
land cover³⁵ and FAO soil-type³⁶ data sets, respectively.

321 VMod simulations were forced using daily rainfall and temperature data estimated 322 from a network of 151 meteorological stations (Fig. 1a). Specifically, the precipitation 323 data employed herein are from the Mekong River Commission (MRC) hydrometeorological database³⁷, supplemented with GSOD (Global Surface Summary of 324 the Day) data³⁸ for the Chinese part of the basin. These data have been carefully quality 325 controlled³², and the MRC data therefore represent the highest quality available data, with 326 327 the best density of precipitation stations. However, as is frequently the case in developing 328 nations, resource constraints have meant that there has not yet been a more recent release 329 of the MRC product, constraining our study to the period 1981-2005. However, also 330 pertinent to this choice of study period is the fact that in 2005 the total active storage of all dams on the Mekong was 7.2 km³, of which the active storage of Chinese dams was only 331 0.8 km³, meaning that the potential impact of dams is still rather minor at this date⁹. In 332 contrast, by the year 2015 these figures had increased to \sim 55 km³ and 24 km³, respectively. 333

Estimates of daily rainfall totals and temperatures within each VMod grid cell were obtained by interpolating from the three nearest observations using inverse distance squared weighting. For daily rainfall totals, a multiplicative elevation correction (with coefficient 0.0002 mm m⁻¹) was employed to account for differences of elevation between each observation point and the location of the grid cell, whereas the temperature data were corrected for elevation using a lapse rate of -0.006 K m⁻¹. VMod simulates snowmelt

using a degree-day model, in which the amount of snowmelt is obtained from daily average temperature exceeding a given threshold multiplied by a snowmelt coefficient K_{melt} . The model also computes snow evaporation, snowpack water storage, and refreezing. The snowmelt parameters employed herein were calibrated in a previous study³² using flow measurements at the Chiang Saeng gauging station. Glacier melt is computed similarly to snowmelt, albeit using a different set of parameters and the assumption of infinite storage.

347 In VMod the flow discharge is routed along a river network that is generated using 348 DEM and map data. Each model grid cell has a river, either starting at that grid cell or 349 flowing through it, to which the runoff from the cell is added. Flow within the river 350 network is computed using a 1-dimensional river model with a kinematic wave 351 approximation. In this way simulated runoff at any point in the network reflects both the 352 local and upstream contributions of precipitation, with the precipitation being 353 deconstructed into cyclone and non-cyclone components as described in the Rainfall 354 Scenarios section, below. Note that, in the flow routing process, river cross-sections are 355 represented using two superimposed trapezoids, with the lower one representing the main 356 channel and the upper the floodplain, allowing for a representation of the effects of 357 overbank storage on downstream attenuation of the flood wave.

Fig. 2 (for Kratie, along with the left hand panels of Extended Data Figure 3 for the other hydrological stations) shows a comparison of simulated VMod versus observed runoff regimes at each of the gauging stations employed in this study. Note that, for clarity, **Fig. 2** shows data only for the period 1995–2000, a period that includes the years that are most and least affected by TCs, but the goodness of fit measures reported here are for the entire simulation period (1 May 1981 to 31 March 2005). The four goodness of fit measures used are: (i) the mean discrepancy ratio for daily flows (*Me*), which is the

365 average of all the ratios (computed at each daily time step) of simulated to observed daily 366 water flows, with Me = 1 indicating perfect agreement between simulated and observed 367 data; (ii) the mean discrepancy ratio for annual peak flows (Me_p) ; (iii) the root mean square error (*RMSE*), and; (iv) the Nash-Sutcliffe Index (NSI)³⁷. Based on these metrics 368 369 (Extended Data Table 2) VMod, on average, under-predicts daily water flows throughout 370 the study reach, while under-predicting the annual flood maxima in the lower parts (Stung 371 Treng and Kratie) and over-predicting annual flood maxima in the upper parts (Luang 372 Prabang, Mukdahan and Pakse) of the reach (Fig. 2, Extended Data Figure 3 and Extended 373 Data Table 2). Nevertheless, with NSI values varying between 0.749 (Luang Prabang) and 0.922 (Pakse), the overall performance VMod of is either "Very Good" (Luang Prabang, 374 375 Mukdahan, Stung Treng) or "Excellent" (Pakse, Kratie), based on the classification scheme of Henriksen et al.⁴⁰ 376

Rainfall Scenarios and Tropical Cyclone Climatology. The hydrological model as described above was run with two rainfall scenarios. The first "baseline" scenario replicated actual conditions in the 1981-2005 study period and employed observed rainfall totals. In the second scenario, these baseline totals were revised downwards by removing the rainfall estimated to have been delivered by tropical cyclones. The simulated runoff associated with tropical cyclones (Q_{sim_TC}) was then computed by differencing the daily flows simulated under the two scenarios.

To estimate rainfall totals associated with tropical cyclones, we first employed the IBTrACS (version v03r02) storm tracks database⁴¹ to locate the paths, at daily time steps, of all recorded tropical cyclones intersecting or passing near the Mekong Basin during 1981–2005. Rainfall anomalies associated with these storm paths were then defined by first interpolating, using the nearest neighbour, daily rainfall values observed at the network of 151 stations used in the baseline rainfall scenario onto a 0.1° (~11 km²)

390 resolution grid. Next, all rainfall stations located within a 500 km Haversine search radius^{42,43} from the centroid of the storm on that date were identified. These identified 391 392 stations were then temporarily (for the specific time step) removed from the analysis and 393 an updated rainfall surface (minus the identified stations) was re-interpolated onto the same 0.1° grid. A rainfall anomaly surface, representing estimated rainfall associated with 394 395 the identified storm and time step, was obtained by differencing the original and updated 396 surfaces. This process was repeated for each daily time step, allowing the observed rainfall 397 series at each meteorological station to be adjusted by subtracting rainfall anomalies 398 within the grid square specific to each gauge from the observed daily rainfall totals. Note 399 that since the hydrometeorological database we used in this analysis does not discriminate 400 between precipitation associated or not associated with tropical cyclones, it is not possible 401 to validate our estimates of cyclone-derived precipitation. For this reason, our estimates of 402 rainfall associated with tropical cyclones are deliberately based on a method (nearest neighbour interpolation) that is more conservative than prior studies⁴³ that simply assume 403 404 that *all* rainfall within the assigned search radius is related to tropical cyclones. By the 405 same token, while acknowledging that there is uncertainty regarding the typical radii of 406 tropical cyclones, our decision to employ a 500 km search radius is again conservative in 407 that it is at the lower end of the range of values typically employed in prior studies⁴⁴.

The IBTrACS data on which the above analyses are founded comprise six hourly best-track positions and intensity estimates. Only storms designated as in a tropical phase with one-minute maximum sustained surface wind speeds exceeding 34-knots (17.5 ms⁻¹) are included in our analysis. The IBTrACS data were also used to compute the accumulated cyclone energy (ACE) metric⁴⁵ that we employ to characterize the TC climatology over the Mekong River basin for the period 1981-2005. The ACE parameter is analogous to the power dissipation index (PDI)⁴⁶ in that it convolves intensity and

duration information for each individual TC observed in a defined area (here the subbasins for the five gauging stations that are the focus of this study), offering considerable
advantages over definitions based on the more familiar categorizations based on wind
speed⁴⁷. In this context, our estimates of ACE are obtained by squaring the 6-hourly
intensity estimates reported in the best-track database and integrating over the 1981-2005
study period.

422

421

- $C = a Q^{b}$ (1)

Sediment Rating Curves. Sediment rating curves of the form:

424

425 were constructed for each hydrological station on the Mekong River mainstem below the 426 China-Laos border and upstream of the Mekong delta by fitting observed suspended solids 427 concentration (SSC; C) and observed water discharge (Q) data (Extended Data Table 4) 428 using non-linear estimation techniques constructed using the Curve Fitting Toolbox in 429 Matlab version R2014a. Specifically, a non-linear least squares power law solver with one 430 term was applied to the raw data, using the Trust-Region algorithm. The use of the power law solver follows previous work^{48,49,50} in optimizing the fit at the higher values of 431 432 discharge and concentration that dominate overall transport. This procedure results in a 433 poor fit for low discharges at Pakse (Extended Data Figure 2) but using an alternative 434 solver, designed to improve the low fit, is not justified. This is because doing so makes 435 only a very minor (< 2%) difference in the mean annual sediment load at Pakse while 436 introducing significant errors into the more important high-flow fits at the other stations. 437 Note that our focus on suspended, rather than total, sediment load is not problematic since 438 bed load is less than 20% of the total load (based on comparisons of rivers from the data

439 compilation of Turowski *et al.*⁵¹ with suspended sediment concentrations similar to those
440 of the Mekong River).

441 In terms of the data sources feeding into the sediment rating curves (Extended Data 442 Table 4), at Luang Prabang, Mukdahan and Pakse the SSC and water discharge data were 443 obtained from hydrological records archived by the Mekong River Commission (MRC; 444 available to download from http://portal.mrcmekong.org/index). However, the MRC SSC 445 measurements are available only sporadically and have been acquired using a range of 446 methodologies (reflecting the different approaches taken by differing hydrological 447 agencies in this trans-national river) at the different gauging stations (Extended Data Table 448 4). All of the MRC's SSC measurements at Mukdahan were collected using USGS 449 designed isokinetic depth-integrated samplers (USGS D49 samplers) deployed at three 450 verticals over the cross-section. The three samples are composited to provide a single sample from which the suspended sediment concentration (SSC) is determined⁴⁹. For the 451 452 stations in Laos (i.e., Luang Prabang and Pakse), the MRC SSC data were initially (1961) 453 collected for a brief period using the same procedures as at Mukdahan, but subsequently 454 the depth-integrated samplers were replaced with USGS P61 point-integrating samplers. 455 To avoid potential problems with mixed sampling protocols in the datasets, and because 456 depth-integrated sampling relies heavily on the even ascent of the sampler through the 457 water column, to avoid biasing the SSC we excluded the relatively few data obtained 458 using depth-integrated samplers from further consideration. The point-integrated samplers 459 were deployed at three verticals over the cross-section, at heights of 0.2, 0.5 and 0.8 of the 460 flow depth in the case of the point-sample (producing nine individual samples, from which 461 the mean SSC for the cross-section is obtained by simple averaging). However, as shown in Extended Data Figure 7, because the concentration of suspended sediment varies, both 462 463 through the water column and laterally over the cross-section, simple averaging of point464 based samples systematically biases the resulting estimate of the cross-section averaged 465 SSC (relative to that obtained from alternative quasi-synoptic sampling techniques). We 466 corrected for this effect by reducing the SSC values recorded within the MRC database by 467 26% for all the Laos and Thai stations (Extended Data Figure 7). We derived this 468 correction factor by comparing the averaged cross-section SSC computed from acoustic 469 Doppler current profiler (aDcp) surveys in Cambodia, these aDcp surveys being 470 undertaken as part of an aDcp field calibration exercise designed to retrieve SSC data from 471 aDcp records archived by the Cambodian hydrological agency.

472 For the stations at Stung Treng and Kratie, sediment rating curves were 473 constructed using flow discharge and SSC data (Extended Data Table 4) retrieved from 474 the archives of the Cambodian Department of Hydrology and Water Resources (DHRW). 475 These DHRW data were acquired via deployments of a four-beam 600 kHz aDcp (RD 476 Instruments) during routine surveys undertaken in the period 2009 to 2014 by DHRW 477 personnel. These aDcp surveys do not directly record suspended solids concentrations, but 478 rather the archived DHRW data files contain acoustic backscatter (ABS) information 479 recorded during the original surveys. We retrieved suspended solids concentrations from 480 these ABS data by means of a calibration function (Extended Data Figure 7) that we 481 derived based on 54 point measurements of SSC deployed contemporaneously with the 482 DHRW aDcp to record coeval ABS values in the same parcel of water following past guidelines^{52,53,54}. In this field calibration procedure, the SSC data were obtained by 483 484 filtering (Whatman GF/C glass microfiber grade 47mm diameter 1.2 µm filter paper) and 485 weighing the mass of solids retained from water samples collected at a wide range of flow depths and channel locations using a 3-litre Van Dorn sampler⁵⁵ during fieldwork that was 486 487 spread over a wide range of flow conditions during 2013 and 2014. Consequently, the 488 calibration function encompasses a wide range of SSC and ABS data. Analysis of ABS

values and the suspended sediment grain size collected from the point samples reveals there is no relationship between the two, likely due of the narrow range of grain sizes within the LMR⁵⁶. Since the aDcp data provide a quasi-synoptic (less a blanking zone of 0.5 m at the top of the water column and a side-lobe interference zone of 10% of the flow depth at the bottom of the water column) image of ABS over the channel cross-section, the calibration function can be used to transform the ABS data to an accurate estimate of section-averaged SSC (Extended Data Figure 7), as also noted above.

Having derived the rating curves for each gauging station (Extended Data Figure 2), we then explicitly investigated whether the rating curves exhibit hysteresis effects associated with sediment exhaustion, which might be expected to lead to lower SSC values for a given discharge on the falling versus rising stages of the annual flood wave. However, no such evidence of hysteresis was identified (see Extended Data Figure 2), presumably due to fluctuations in SSC being subdued due to the large catchment areas and consequent effects of channel and floodplain storage in attenuating the peaks²⁴.

503 We also considered whether there is a shift in sediment transport during flows affected by TCs, for example as a result of increased sediment supply from catchment 504 505 erosion during storms. Specifically, we evaluated whether there are differences in 506 sediment rating curves for flows that are (using the VMod model outputs to identify TC-507 affected flows and then cross-matching to identify SSC measurements that are TC 508 affected) or are not affected by TCs. As indicated in Extended Data Table 4, this enabled 509 us to identify 34 SSC samples during TC affected flows at Luang Prabang (14% of all 510 observations at that station), whilst 30 samples were identified during TC affected flows at 511 Mukdahan (3% of observations). We found there were no significant (ANOVA, p > 0.05) differences between sediment ratings developed using the TC-affected versus the non-TC 512 513 affected SSC data at either station. This indicates that we can with confidence apply single

514 rating curves for these stations, for both TC-affected and TC-unaffected flows. Since we 515 are only able to discriminate TC-affected flows from VMod outputs during the 1981-2005 516 study period, and because there are no SSC data from this period at Stung Treng and 517 Kratie, and there are too few SSC data at Pakse to identify any TC-affected measurements, 518 there are no data to complete a similar formal analysis at these other three stations 519 (Extended Data Table 4). Nevertheless, the very tight fit of these three stations' ratings 520 (Extended Data Figure 2), alongside the point that these stations are TC-affected during 521 the period of SSC data collection, indicates that any shift in sediment transport processes 522 during TCs is unlikely to have any material effects on the estimation of suspended solid 523 loads at these locations.

Bearing in mind the relatively long periods over which the SSC data used to construct the sediment ratings at Luang Prabang, Mukdahan and Pakse were collected (Extended Data Table 4), we also tested for the possibility that varying ENSO phase, a known cause of hydroclimatological variability in the Mekong River, may lead to nonstationarity in the SSC values at these stations^{57,58}, using dummy variable regression analysis. Letting Z = 1 if ENSO phase is positive (i.e., El Niño) and 0 otherwise, then for the slope of the regression:

531

$$y = \beta_0 + \beta_1 Z X + \beta_2 X + \varepsilon \tag{2}$$

533

532

534
$$y = \begin{cases} \beta_0 + (\beta_1 + \beta_2)X + \varepsilon & \text{if ENSO phase is positive} \\ \beta_0 + \beta_2 X + \varepsilon & \text{if ENSO phase is negative} \end{cases}$$
(3)

535 Then, for the intercept of the regression:

536

537
$$y = \beta_0 + \beta_1 Z + \beta_2 X + \varepsilon \tag{4}$$

538

539
$$y = \begin{cases} (\beta_0 + \beta_1) + X + \varepsilon & \text{if ENSO phase is positive} \\ \beta_0 + X + \varepsilon & \text{if ENSO phase is negative} \end{cases}$$
(5)

540

541 Or, for both slope and intercept:

542

543
$$y = \beta_0 + \beta_1 Z + \beta_2 X + \beta_3 + \varepsilon$$
(6)

544

545
$$y = \begin{cases} (\beta_0 + \beta_1) + (\beta_2 + \beta_3) X + \varepsilon & if ENSO phase is positive \\ \beta_0 + \beta_3 X + \varepsilon & if ENSO phase is negative \end{cases}$$
(7)

546

We found no significant difference at the 0.05 significance level (ANOVA on dummy 547 548 variable regression coefficients for each site) in the SSCs, for a given Q, as a function of 549 ENSO phase, demonstrating that there is therefore no evident bias in the SSCs introduced 550 as a function of climate variability associated with ENSO. With the completion of the first 551 significant main-stem cascade of dams on the Chinese portion of the Mekong River in 552 1993, we also considered whether the SSC data differ pre- and post- 1993. Accordingly, a 553 similar analysis (Eqs 2-7) was conducted for those sites (Luang Prabang and Mukdahan) 554 at which SSC samples span the pre- and post- dam periods. We found that at Mukdahan 555 no significant difference exists at the 0.05 significance level (ANOVA on dummy variable 556 regression coefficients), implying there is no reason to split the data based on the pre- and 557 post- dam periods. However, a significant difference (p < 0.05) between the pre- and post-558 dam periods does exist at Luang Prabang (ANOVA test statistic = 9.7377, n = 236, df = 1, 559 232). Consequently, at Luang Prabang, we calculate suspended solids loads (see below) 560 using the pre- and post- dam rating curves (Extended Data Figure 2) for the periods 1981-561 1992 and 1993-2005, respectively. Finally, we emphasize that our analysis does not

account for anthropogenic factors, such as flow regulation through reservoirs, land-use or land cover change, or increasing sediment mining, that could potentially introduce a trend into the relationships between flow discharge and suspended sediment concentration at each gauging station. Our suspended sediment rating curves therefore assume stationarity of these factors over the 1981-2005 study period.

567 Sediment Load Estimation. The lack of hysteresis and apparent stationarity of the SSC 568 data means that we were able to employ a single (two at Luang Prabang, one for the pre-569 and one for the post- dam periods) sediment rating curve specific to each station 570 (Extended Data Figure 2), together with the continuous water discharge records obtained 571 from our hydrological modelling, to estimate daily suspended solids loads (Fig. 2; 572 Extended Data Figure 3) for the 1981-2005 study period. These daily loads were in turn 573 used to compute, by summation, the annual sediment loads for each station (Fig. 3; Extended Data Figure 4). Note that since the modelling period extended from 1st May 574 1981 to 31st March 2005, we report annual sediment loads only for those years (1982 to 575 576 2004 inclusive) for which full-year records are available. Mean annual suspended solids loads for each station over the 22-year period (1982 to 2004) were then obtained by 577 calculating the arithmetic mean of these annual loads (Extended Data Table 3). 578

579 **Statistical Analysis**. Mann-Kendall⁵⁹ tests, used to evaluate whether there are significant 580 (at 95% confidence) temporal trends (the magnitude of the trend being equated to Sen's 581 slope, with uncertainty equated to the 95% confidence bounds on the Sen slope estimates) 582 in the computed annual sediment loads, were computed in Matlab R2014a using the 583 ktaub.m file written by Jeff Burkey (2006), which is available from the Matlab Exchange 584 at <u>http://www.mathworks.com/matlabcentral/fileexchange/11190-mann-kendall-tau-b-</u> 585 with-sen-s-method--enhanced-/content/ktaub.m 586 **Data**: The precipitation and temperature data used in the hydrological model simulations are taken from the Mekong River Commission (MRC) hydrometeorological database³⁷ 587 588 (not available online) supplemented with GSOD (Global Surface Summary of the Day) data³⁸ for the Chinese part of the basin (ftp://ftp.ncdc.noaa.gov/pub/data/gsod/ years 1981-589 2005). The IBTrACS (version v03r02) storm tracks database⁴¹ that we used estimate the 590 591 track locations and hence precipitation anomalies associated with tropical cyclones was 592 downloaded from the **IBTrACS** website 593 (https://www.ncdc.noaa.gov/ibtracs/index.php?name=ibtracs-data **IBTrACS-All** data 594 v03r02 all storms line shapefile). Note that we are not able to make the input data files 595 used in the hydrological model simulations available as the precipitation and temperature 596 data are from the MRC (as described above) under a licence which precludes 597 redistribution of products or derived products. Water discharge data used in the validation 598 of the hydrological model are from the hydrological records archived in the MRC data portal (http://portal.mrcmekong.org/index as discharge records from Luang Prabang 599 600 (station ID 011201 unique dataset ID 21301), Mukdahan (station ID 013402 unique 601 dataset ID 3301), Pakse (station ID 013901 unique dataset ID 3141), Stung Treng (station ID 014501 unique dataset ID 2809), and Kratie (station ID 014901 unique dataset ID 602 603 2811)), as suspended sediment concentration data (available from are the 604 http://portal.mrcmekong.org/index as sediment concentration records from station ID 605 011201 unique dataset ID 4746, station ID 013402 unique dataset ID 4849, and station ID 606 013901 unique dataset ID, 4773, respectively) used to derive the sediment rating curves at 607 Luang Prabang, Mukdahan, Pakse. The aDcp data files used to derive the sediment rating 608 curves for the stations at Stung Treng and Kratie are available on request from the 609 Cambodian Department of Hydrology and River Works (DHRW; http://www.dhrw-610 cam.org/index.php).

611 **Code Sharing**: The VMod hydrological model software as employed in this study is 612 available to download from www.eia.fi/vmod.The related analytical code comprises the 613 bespoke Matlab scripts, authored by Dr Julian Leyland, that were used to partition out the 614 cyclone-influenced rainfall as described in the text. These scripts are not publically 615 available as they are currently being developed and used in commercial applications.

616

617 **References**

- 618 31. Koponen, J.H. *et al. HBV and IWRM Watershed Modelling User Guide*, MRC Information
 619 and Knowledge Management Programme. Available at
 620 http://www.eia.fi/index.php/support/download (2010).
- 621 32. Lauri, H. et al. Future changes in Mekong River hydrology: impact of climate change and
 622 reservoir operation on discharge. *Hydrol. Earth Sys. Sci.* 16, 4603-4619; doi: 10.5194/hess623 16-4603-2012 (2012).
- 624 33. Lauri, H. VMod 5km *Grid Hydrological Modeling Report (EIA Ltd.)*. Aalto
 625 University, Finland (2009).
- 34. Jarvis, A., H. *et al.* Hole-Filled Seamless SRTM Data V4, Int. Cent. for Trop. Agric. (CIAT)
 Available at <u>http://srtm.csi.cgiar.org (</u>2008).
- 628 35. IES. *Global Land Cover 2000* Available at <u>http://ies.jrc.ec.europa.eu/global-land-cover-</u>
 629 <u>2000 (</u>2000).
- 63036.FAO. WRBMapofWorldSoilResources.Availableat631http://www.fao.org/ag/agl/agll/wrb/soilres.stm. (2003).
- 632 37. Mekong River Commission. *Hydrometeorological database of the Mekong River*633 *Commission*. Mekong River Commission (MRC), Vientiane, Lao PDR (2011).
- 634 38. NCDC. *Global Surface Summary of the Day (GSOD)*, US National Climatic Data Center
 635 (NCDC) Data available at <u>ftp://ftp.ncdc.noaa.gov/pub/data/gsod</u> (2010).
- 636 39. Nash, J.E. & Sutcliffe, J.V. River flow forecasting through conceptual models part I—A
 637 discussion of principles. *J. Hydrol.* 10, 282–290 (1970).
- 638 40. Henriksen, H. J. *et al.* Assessment of exploitable groundwater resources of Denmark by use
 639 of ensemble resource indicators and a numerical groundwater–surface water model. *J.*640 *Hydrol.* 348, 224–240 (2008).
- 641 41. Knapp, KR. *et al.* The international best track archive for climate stewardship (IBTrACS):
 642 Unifying tropical cyclone best track data. *Bull. Am. Meterol. Soc.* 91, 363–376 (2010).

- 643 42. Rodgers, E.B. *et al.* Contribution of tropical cyclones to the North Pacific climatological
 644 rainfall as observed from satellites. *J. Appl. Meteorol.* **39**, 1658–1678 (2000).
- Englehart, P.J. & Douglas, A.V. The role of eastern North Pacific tropical storms in the
 rainfall climatology of western Mexico. *Int. J. Climatol.* 21, 1357–1370 (2001).
- Kubota, H. & Wang, B. How much do tropical cyclones affect seasonal and inter-annual
 rainfall variability over the Western North Pacific? *J. Climate* 22, 5495–5510 (2009).
- 649 45. Bell, G.D., et al. Climate assessment for 1999. Bull. Am. Meteorol. Soc. 81, s1–s50;
 650 doi:10.1175/1520-0477(2000)81[s1:CAF]2.0.CO;2. (2000).
- 46. Emanuel, K. Increasing destructiveness of tropical cyclones over the past 30 years. *Nature*436, 686-688; doi:10.1038/nature03906 (2005).
- 47. Webster, P.J. *et al.* Changes in tropical cyclone number, duration and intensity in a warming
 environment. *Science* **309**, 1844-1846; doi:10.1126/science.1116448 (2005).
- 48. Ferguson, R.I. River loads underestimated by rating curves. *Wat. Resour. Res.* 22, 74-76
 (1986).
- 49. Walling, D.E. *Evaluation and analysis of sediment data from the Lower Mekong River.*658 Mekong River Commission, Vientiane, Laos (2005).
- 659 50. Walling, D.E. The changing sediment load of the Mekong River. Ambio 37, 150-157 (2008).
- 51. Turowski, J.M., Rickenmann, D. and Dadson, S.J. The partitioning of the total sediment
 load of a river into suspended load and bedload: a review of empirical data. *Sedimentology*57, 1126–1146; doi: 10.1111/j.1365-3091.2009.01140.x (2010).
- 52. Kostachuk, R.J. *et al.* Measurement of flow velocity and sediment transport with an acoustic
 Doppler current profiler. *Geomorphology* 68, 25 37 (2005).
- 53. Szupiany, R.N. *et al.* Morphology, flow structure and suspended bed sediment transport at
 two large braid-bar confluences. *Wat. Resour. Res.* 45, W05415;
 doi:10.1029/2008WR007428 (2009).
- 54. Shugar, D. *et al.* On the relationship between flow and suspended sediment transport over
 the crest of a sand dune, Rio Parana, Argentina. *Sedimentology* 57, 252-272 (2010).
- 670 55. Van Dorn, W.G. Large-volume water samplers. *Eos Trans. AGU* 37, 682–684;
 671 doi:10.1029/TR037i006p00682 (1956).
- 672 56. Bravard, J-P., Goichot, M. and Tronchère, H. An assessment of sediment-transport
 673 processes in the Lower Mekong River based on deposit grain sizes, the CM technique and
 674 flow-energy data. *Geomorphology* 207, 174-189 (2014).
- 675 57. Räsänen, T. & Kummu, M. Spatiotemporal influences of ENSO on precipitation and flood
 676 pulse in the Mekong River Basin. *J. Hydrology* 476, 154 168 (2013).
- 677 58. Ward, P.J. *et al.* Annual flood sensitivity to El Niño Southern Oscillation at the global scale.
 678 *Hydrol. Earth Syst. Sci.* 18, 47-66 (2013).
- 679 59. Kendall, M. G. A new measure of rank correlation. *Biometrika* **30**, 81–93 (1938).





681 Extended Data Figure 1

683 Extended Data Table 1.

| Basin ID | Basin Name | Drainage Area (10 ⁶ km ²) | Mean annual runoff (km ³ yr ⁻¹) | Mean annual sediment flux (Mt yr ⁻¹) |
|----------|----------------|--|--|--|
| 1 | Amazon | 6.3 | 6300 | 1200 |
| 2 | Congo | 3.8 | 1300 | 43 |
| 3 | Mississippi | 3.3 | 490 | 120 |
| 4 | Ob | 3.0 | 390 | 16 |
| 5 | Nile | 2.9 | 30 | 0.2 |
| 6 | Yenisei | 2.6 | 620 | 4.1 |
| 7 | Parana | 2.6 | 530 | 90 |
| 8 | Lena | 2.5 | 520 | 20 |
| 9 | Niger | 2.2 | 160 | 40 |
| 10 | Amur | 1.9 | 350 | 52 |
| 11 | Yangtze | 1.8 | 900 | 470 |
| 12 | Mackenzie | 1.8 | 310 | 100 |
| 13 | Zambezi | 1.3 | 100 | 9 |
| 14 | St. Lawrence | 1.2 | 340 | 4.6 |
| 15 | Nelson | 1.1 | 89 | n/a |
| 16 | Murray-Darling | 1.1 | 7.9 | 1 |
| 17 | Orinoco | 1.1 | 1100 | 210 |
| 18 | Orange | 1.0 | 4.5 | 17 |
| 19 | Ganges | 0.98 | 490 | 520 |
| 20 | Indus | 0.98 | 5 | 10 |
| 21 | Rio Grande | 0.87 | 0.7 | 0.7 |
| 22 | Yukon | 0.85 | 210 | 54 |
| 23 | Danube | 0.82 | 210 | 42 |
| 24 | Shebelle | 0.81 | 19 | n/a |
| 25 | Mekong | 0.80 | 450 | 110 |
| 26 | Tocantins | 0.76 | 370 | 75 |
| 27 | Yellow | 0.75 | 15 | 150 |
| 28 | Brahmaputra | 0.67 | 630 | 540 |
| 29 | Columbia | 0.67 | 240 | 9.7 |
| 30 | Kolyma | 0.60 | 120 | 10 |







686

687 Extended Data Figure 3.

689 Extended Data Table 2.

| _ | Goodness of Fit Measures | | | | | | |
|--------------------------|---|--|---------------------------|-------------------------|--|--|--|
| - | Mean Discrepancy Ratio – Daily Flows | Mean Discrepancy Ratio - Annual Peaks | Root Mean Square Error | Nash-Sutcliffe Index | | | |
| River Gauging Station | (Me) | (Me_p) | $(RMSE, m^3 s^{-1})$ | (NSI) | | | |
| Luang Prabang | 0.99 | 1.19 | 1690 | 0.749 | | | |
| Mukdahan | 0.87 | 1.08 | 3170 | 0.821 | | | |
| Pakse | 0.89 | 1.15 | 2700 | 0.922 | | | |
| Stung Treng | 0.73 | 0.84 | 6210 | 0.789 | | | |
| Kratie | 0.77 | 0.89 | 5800 | 0.808 | | | |

694 Extended Data Table 3.

| River Gauging Station | Accumulated Cyclone Energy (ACE, 10 ⁴ kn ²) | Rainfall (<i>P</i> , mm) | Rainfall due to Tropical Cyclones (P_TC, mm) | Runoff $(Q, m^3 yr^{-1})$ | Runoff due to Tropical Cyclones $(Q_{TC}, m^3 yr^{-1})$ | Suspended Solids Load $(Q_s, Mt yr^{-1})$ | Suspended Solids Load due to Tropical Cyclones (Q _{s_TC} , Mt yr ⁻¹) | Proportion of Load Forced by Tropical Cyclones (%) |
|--------------------------|---|-------------------------------------|--|----------------------------------|--|---|--|---|
| Luang Prabang | 0.12 | 1157 | 21 | 3945 | 540 | 70.4 ± 21.8 | 10.7 ± 6.4 | 15.2 |
| Mukdahan | 2.84 | 1346 | 47 | 7230 | 1550 | 73.4 ± 15.9 | 16.5 ± 9.3 | 22.5 |
| Pakse | 3.49 | 1356 | 56 | 9155 | 770 | 79.8 ± 19.0 | 7.5 ± 6.6 | 9.3 |
| Stung Treng | 5.64 | 1436 | 67 | 10375 | 2960 | 71.3 ± 36.3 | 24.2 ± 19.3 | 34.0 |
| Kratie | 5.76 | 1438 | 67 | 10490 | 3020 | 87.4 ± 28.7 | 27.7 ± 17.6 | 31.7 |



695

696 Extended Data Figure 4







| Gauging Station | Number of Samples | Period of Data Availability | Sampling Method |
|-----------------|----------------------|--|------------------|
| Luang Prabang | 236 (34) | 1986-1989; 1992; 1997- 2000; 2002 | Point-integrated |
| Mukdahan | 1159 (30) | 1962-1965; 1967-1980; 1982; 1991-1994; 1996- 1997; 1999-2007 | Depth-integrated |
| Pakse | 60 (0) | 1998-2002 | Point-integrated |
| Stung Treng | 95 (0) | 2009-2014 | aDcp backscatter |
| Kratie | 140 (0) | 2009-2014 | aDcp backscatter |
| | | | |





Extended Data Figure and Table Captions

Extended Data Table 1. Overview of the drainage area, mean annual runoff and mean annual sediment yield for the world's 30 largest rivers as defined by drainage area, with data from Milliman and Farnsworth (2011)¹. The ID numbers identify the locations of the drainage basins shown on Extended Data Figure 1. The data indicate that the sediment loads from these 30 largest rivers together sum to 3.92 billion tonnes per year, a significant proportion (20.6%) of the total global riverine flux as estimated by Milliman and Farnsworth (2011).

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Extended Data Figure 1. Locations of the world's 30 largest (by drainage area) rivers
(the numbers identify the basins listed in Extended Data Table 1) in relation to the density
of all tropical cyclone tracks from 1842 to 2015 as recorded in the IBTrACS⁴¹ database.
Track density was calculated using the point density function in ArcGIS 10.1.

729

730 Extended Data Figure 2. Sediment rating curves for the five river gauging stations on the Lower Mekong River. The left hand panels show the relationship between flow discharge 731 (Q) and suspended solids concentration (C) at: a, Luang Prabang (pre-dam: n = 187, $r^2 =$ 732 0.338; post-dam: n = 49, $r^2 = 0.648$); **c**, Mukdahan (n = 1159, $r^2 = 0.497$); **e**, Pakse (n = 60, 733 $r^2 = 0.591$); **g**, Stung Treng (n = 95, $r^2 = 0.870$), and; **i**, Kratie (n = 140, $r^2 = 0.850$). The 734 right hand panels show how the relationships on the left-hand panels propagate through to 735 give the relationship between flow discharge (Q) and instantaneous sediment load (Q_s) at 736 the same stations: **b**, Luang Prabang (pre-dam: n = 187, $r^2 = 0.791$; post-dam: n = 49, $r^2 =$ 737 0.864); **d**, Mukdahan (n = 1159, $r^2 = 0.693$); **f**, Pakse (n = 60, $r^2 = 0.780$); **h**, Stung Treng 738 $(n = 95, r^2 = 0.900)$, and; j, Kratie $(n = 140, r^2 = 0.931)$. All the fits shown are significant 739 740 at p < 0.00001. Note that the scales for subplots **a** and **b** (Luang Prabang) differ from those for the other subplots. We recognize that the fits for Q versus Q_s on the right hand panels 741 are stronger than the fits between Q and C because of the auto-correlation arising when 742 743 transforming C to Q_s ($Q_s = C \times Q/1000$). For the stations at Mukdahan, Pakse, Stung Treng 744 and Kratie, a single rating curve is employed (black lines), as there is no evidence of hysteresis between the rising (filled circles) and falling (open circles) limbs of the 745 746 hydrograph (see Methods). At Luang Prabang, there is likewise no evidence of hysteresis between the rising (coloured closed symbols) and falling (coloured open symbols) limbs. 747 However, two rating functions are employed at this station, one for the pre-dam (orange 748 749 coloured lines) and post-dam (green coloured lines) periods (see Methods).

750 Extended Data Figure 3. Daily flow discharge and suspended solids load at selected Mekong River gauging stations during 1st January 1995 to 31st December 1999. The left 751 hand panels show daily simulated (Q_{sim}) and observed (Q_{obs}) water flows, along with the 752 daily water flows attributable to tropical cyclones (Q_{sim_TC}) at **a**, Luang Prabang; **c**, 753 Mukdahan; e, Pakse, and g, Stung Treng. The right hand panels show the daily total 754 suspended solids load (Q_{s} in megatonnes per day) and daily suspended solids load 755 756 attributable to tropical cyclones ($Q_{s TC}$; also in megatonnes per day) at **b**, Luang Prabang; 757 d, Mukdahan; f, Pakse, and h, Stung Treng. Note that the period 1995 to 1999 758 encompasses the years during the 1981-2005 study period that are the most (1996) and 759 least (1999) strongly affected by tropical cyclones.

760

761 Extended Data Table 2. Goodness of fit measures comparing VMod simulated and
762 observed water flows at five river gauging stations on the Lower Mekong River. Note that
763 the goodness of fit metrics are all based on the mean daily flows for the full simulation

period (1st May 1981 to 31st March 2005), with the exception of the Mean Discrepancy Ratio for the annual flood peaks (Me_p). The Me_p metric is computed using the ratio of simulated maximum daily discharge to observed maximum daily discharge in each year of the record (1981-2004 inclusive) studied herein.

768

769 Extended Data Table 3. Mean annual hydrometeorological parameters (1982-2004)
770 estimated at five hydrological stations on the Lower Mekong River. Errors represent one
771 standard deviation around the mean annual loads. The Accumulated Cyclone Energy
772 (ACE) for each station during the same period is also indicated.

773

Extended Data Figure 4. Time series of annual suspended solids load at selected river gauging stations during 1982 to 2004. **a**, Luang Prabang; **b**, Mukdahan; **c**, Pakse; **d**, Stung Treng. The symbols indicate the total suspended solids load (Q_s ; open circles) and suspended solids load attributable to tropical cyclones (Q_{s_TC} ; filled squares). Significant ($p \le 0.05$) trends as identified by Mann-Kendall analysis are indicated by the dashed lines, with the corresponding time-rate of change of annual suspended solids load annotated on the plot.

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782 Extended Data Figure 5. Spatial distributions of mean annual rainfall contributed from
783 tropical cyclones over the Mekong Basin. a, 1981-1985; b, 1986-1990; c, 1991-1995; d,
784 1996-2000; e, 2001-2005. Note the pronounced declines in rainfall associated with
785 tropical cyclones at Stung Treng and Kratie in particular.

786

787 **Extended Data Figure 6.** Strike counts for tropical cyclones tracking across the Mekong 788 basin during 1950-2013. The strike count data plotted are extracted from the IBTrACS⁴¹ 789 database and normalized by the maximum count (199) observed in 1964. We employ strike count, rather than precipitation, data in this longer term historical analysis because 790 reliable precipitation data are not available outside of the 1981-2005 period that is the 791 792 main focus of the study. Similarly, mean wind speed data, which in principle could be 793 used to estimate variations in Accumulated Cyclone Energy (ACE) as a proxy for precipitation, are available only sporadically outside of 1981-2005. In terms of strike 794 795 counts, the data suggest there is a periodicity in the long term cyclone climatology, with 796 the most recent data (2006-2013) having annual strike counts similar to the 1950-2013 mean of 87 ± 37 . However, these data must be treated with caution since strike count data 797 798 do not report the intensity or locations of cyclone tracks, both of which are important controls on the precipitation delivered to the basin by these TCs. 799 800

Extended Data Table 4. Suspended solids concentration (SSC) data sources used in 801 802 constructing the sediment rating curves employed in this study. Number of samples refers 803 to the total number of SSC data points used in the derivation of the sediment rating curves, with the numbers in parentheses indicating the number of SSC data points associated with 804 tropical-cyclone induced runoff events. The latter are defined herein as runoff events for 805 which at least 25% of the runoff was associated with tropical cyclone induced runoff. 806 807 Consequently, it is only possible to identify tropical cyclone affected SSC measurements 808 in the 1981-2005 model simulation period. Note that no tropical-cyclone induced runoff events were associated with the 60 SSC measurements made at Pakse during 1998-2002 809 and that the available data from Stung Treng and Kratie post-date the 1981-2005 study 810 811 period.

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814 Extended Data Figure 7. Procedures used to determine cross-section mean suspended sediment concentration from acoustic Doppler current profiler (aDcp) data. **a**, Calibration 815 function (solid line; n = 54, $r^2 = 0.9306$, p < 0.0001) linking the suspended solids 816 concentration (SSC) to acoustic backscatter (ABS) for the 600 kHz (RD Instruments) 817 aDcp instrument employed in this study (dashed lines indicate 95% prediction intervals). **b**, 818 Example of quasi-synoptic ABS field obtained from the aDcp survey at the Kratie gauging 819 station on 23/09/2013 (flow discharge, $Q = 57,000 \text{ m}^3 \text{ s}^{-1}$). Note that there is a small 820 blanking distance close to the water surface and a zone of side-lobe interference near the 821 822 bed (indicated by the dashed black lines) where no ABS values are returned, and the ABS 823 values in these zones are therefore determined by interpolation. c, Suspended solids concentration field obtained based on the ABS values in **b** and using the calibration 824 function in a. Note how the locations of the nine point-based SSC estimates collected 825 826 using the sampling procedure adopted at Luang Prabang and Pakse lead to a deviation of the cross-section mean SSC derived from the aDcp-estimated SSC field in c and the point-827 based sampling procedure. We compared 11 cross-section mean SSCs obtained using 828 829 point-based versus aDcp sampling procedures at locations throughout the Mekong River south of Kratie to correct (by 26%) the consequent bias arising from cross-section 830 averaging of point-based samples. 831