



Brief Communication: Bridging the data gap – enhancing the 1 representation of global coastal flood protection 2

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13 Abstract. Understanding coastal flood protection is crucial for assessing risks from natural hazards and climate 14 change. However, there is a significant lack of quantitative data on coastal flood protection and their standards. 15 FLOPROS, currently the only global database of flood protection standards, relies on limited coastal observations 16 and simplified assumptions. Despite these limitations, it is widely used by the research community, leading to 17 potential uncertainties in impact estimates. We propose that a new community-driven effort is needed to develop 18 a more complete dataset, and we present COASTPROS-EU, a dataset compiling coastal flood protection standards 19 within Europe. This effort further highlights the urgent need for enhanced information. Establishing an accurate 20 dataset requires using both bottom-up and top-down approaches and ensuring diverse societal representation.

21 1. Coastal flood protection

22 In Europe alone, damage from coastal flooding currently amounts to €1.4 billion annually, with around 100,000 23 people exposed (Feyen et al., 2020). The rise in global temperatures caused by anthropogenic greenhouse gas 24 emissions means that the frequency and severity of coastal flood events is projected to increase over the next 25 decades, for example due to sea level rise (Taherkhani et al., 2020). Concurrently, the degradation of foreshore 26 vegetation and human-induced subsidence, due to land use and sediment retention by dams, contribute to 27 heightened coastal flood hazards. This presents significant challenges for low-lying coastal communities and 28 ecosystems, which are home to a large portion of the world's population, land area and assets (Bevacqua et al., 29 2020; Reguero et al., 2015).

- 30 The latest IPCC Synthesis Report warns of significant, irreversible damage to coastal areas from climate-induced
- 31 flooding, with coastal flood hazard continuing to increase well beyond 2100 due to sea level rise (IPCC, 2023).
- Additionally, exposure to coastal flood events is expected to increase in the future due to factors such as increasing 32
- 33 urbanisation in coastal areas (Darlington et al., 2023; Reimann et al. 2023; Neumann et al., 2015).
- 34 Addressing coastal flood risk and understanding the potential future impacts requires a comprehensive
- 35 understanding of current coastal flood protection measures and standards, both in terms of infrastructure (e.g.,
- levees) and nature-based solutions (e.g., mangroves) (Caretta et al. 2022; van Zelst et al., 2021; Toimil et al., 36
- 37 2020). However, the complexity and challenges involved in quantitatively assessing current flood protection
- 38 levels hinder our understanding of flood protection on a global scale. Enhanced and detailed data on coastal flood





39 protection is necessary to better prepare for and mitigate the risks associated with climate change and coastal

40 flooding.

41 2. FLOPROS

42 In 2016, Scussolini et al. introduced the FLOPROS database, providing the first global collection of information 43 on flood protection standards across different spatial scales. It consolidates information on protection standards 44 (expressed as flood return periods) associated with protection measures and regulations. FLOPROS is structured 45 into three layers: the design layer, which details engineered protection levels of existing river and coastal flood 46 infrastructure derived from literature; the policy layer, which specifies legislative and normative standards for 47 protection from river and coastal floods, also derived from literature; and the model layer, which infers river flood 48 protection standards based on observed relationships with per capita wealth and flood risk. 49 The FLOPROS model layer assumes a maximum flood protection of a 1000-year return period and a minimum

of a 2-year return period (no protection). An algorithm interpolates these values based on GDP per capita for different income regions. The model layer determines protection standards for sub-country units by calculating expected annual damage and interpolating additional units linearly. This approach overlooks the complexities of the determinants of flood protection standards between and within regions.

54 To our knowledge, FLOPROS and its coastal update by Tiggeloven et al. (2020), is the only global dataset 55 documenting existing structural flood protection measures at the sub-national level, making it a cornerstone in 56 contemporary research endeavours assessing flood risk. Consequently, the database is frequently used in coastal 57 flood assessments (e.g. Almar et al., 2021; Hermans et al., 2023; Vousdoukas et al., 2018; Yesudian & Dawson, 58 2021; Ward et al., 2017). FLOPROS was created to support research related to large-scale flood risk management 59 and has been utilised in several high-level policy documents, including PESETA IV (Feyen et al., 2020), PBL 60 (2023), UNEP (2023a, b). Initiatives such as the Intersectoral Model Intercomparison Project (ISIMIP), which integrates these findings into Integrated Assessment Models like REMIND (Sauer et al., 2021), and webtools such 61 62 as Aqueduct Floods also rely on FLOPROS. Additionally, many academic studies assessing current and future 63 flood risk in coastal areas depend on the FLOPROS database (e.g. Chen et al., 2023; Tiggeloven et al., 2020; Mortensen et al., 2024; Vousdoukas et al., 2020; Hermans et al., 2023; Devitt et al., 2023; Haasnoot et al., 2021). 64 65 As a result, FLOPROS is fundamental to current flood protection assumptions for coastal flood risk and impact 66 assessments. However, due to the limitations in FLOPROS, especially the limited number of observations for coastal flood 67

protection, we argue that caution should be exercised in utilising it in coastal contexts. Overreliance on the dataset may lead to an underestimation of future climate risks, implying protection where it does not exist, or overestimating adaptation efforts, thus undermining the urgency of climate mitigation.

71 Current and Future Efforts

Since the publication of FLOPROS, several initiatives have aimed to improve the representation of flood protection for coastal regions.

74 Originally, FLOPROS focused on river flood protection in its design and model layers. Tiggeloven et al. (2020)
75 extended this by calculating global coastal flood protection using the same model-based approach but did not

76 include new observations, leading to uncertainty in these estimates. Despite these advancements, there remains a

27 lack of clear distinction between the use of the original FLOPROS by Scussolini et al. (2016) and its updated





78 version by Tiggeloven et al. (2020). Frequently, both versions are cited without specifying whether coastal 79 protection levels are used from the design, policy or model layer (Yesudian & Dawson, 2021). A notable relevant 80 advancement is openDELve, which compiles an open database referencing the extent and design specifications 81 of levees for 152 deltas, including levee height, crest width, and construction material, in a harmonized format 82 (Nienhuis et al., 2022). However, there is a clear contrast in data availability between regions such as Africa, 83 South-East Asia, and Southern and Central America in comparison to Australia, Europe, UK, USA (Nienhuis et 84 al., 2022). Another significant research direction is the detection of flood defence infrastructure from high-85 resolution elevation data. Wing et al. (2019) applied a detection algorithm to map levees in the contiguous U.S., questioning the validity of the wealth-to-protection relationships used in FLOPROS. A similar method was 86 87 subsequently applied by Sasaki et al. (2023). 88 Knowledge of river flood protection standards has been enhanced by studies such as Boulange et al. (2021), which 89 reflect the protection provided downstream of global hydro dams. In China, river flood protection standards at 90 higher resolution and confidence levels are available thanks to Wang et al. (2021). Advanced statistical approaches 91 trained to infer flood protection standards from physical and socio-economic variables have been developed by 92 Zhao et al. (2023). An indirect approach to infer flood protection standards for Europe, using new data on impacts

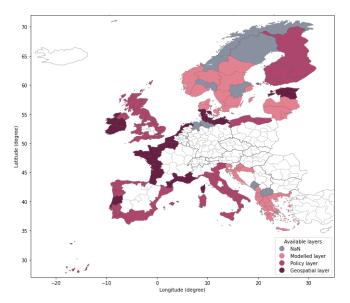
and potential flood occurrences, was recently implemented by Paprotny et al. (2024).

94 **3. COASTPROS-EU: a coastal flood protection standards database for Europe**

95 Despite various advancements in recent years, a dataset with comprehensive global representation of coastal flood protection measures and their standards is still lacking. We present here, COASTPROS-EU, a new database on 96 97 policy standards and defence structures along the European coast (Table S1). The database builds upon the 98 approach followed by FLOPROS. As such, it compiles information on European coastal defences for each NUTS2 99 region, referencing three topologies of layers, namely geolocated coastal defences, regional coastal defence 100 policies, and modeled defences based on Tiggeloven et al. (2020). Where applicable, flood protection standards 101 are expressed in return periods. The "Summary Return Period" summarise the most accurate information layer 102 type regarding flood protection collected. This column prioritizes the layers type in the following order: (a) 103 geolocated coastal defences, (b) policy standards, and lastly, (c) modeled defence if no other information is 104 applicable. The overview of the data availability summary is mapped in Figure 1. The database was produced 105 through two key initiatives. First, an online survey was distributed within the network of the CoCliCo (Horizon 106 2020) project and the Institute for Environmental Studies (IVM) of Vrije Universiteit Amsterdam. Second, a data 107 workshop was held at Vrije Universiteit Amsterdam in November 2023, where flood experts collected information 108 on flood defense and protection standards in their respective language using academic and grey literature (policy 109 reports and governmental data portals).







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Figure 1: Data availability overview of COASTPROS-EU, representing the best available coastal protection
 standards in Europe per NUTS2 region for three typologies of layers: geolocated coastal defences, policy standards,
 and modeled defence standards.

114 Through these combined efforts, we aim to provide a more accurate and comprehensive understanding of coastal 115 flood protection measures. By incorporating diverse data sources and methodologies, this new database addresses 116 the critical need for detailed, reliable information to better prepare for and mitigate the risks associated with

117 climate change and coastal flooding.

118 4. Embracing Diversity and Multi-Methods

Our new dataset only covers Europe and therefore does not satisfy the need for a global assessment. We argue that a global effort is essential to consolidate local information on coastal flood protection, ensuring representation from diverse social groups and geographical regions. This necessitates a multi-method approach, encompassing top-down methods like Earth Observation, as well as bottom-up approaches such as stakeholder interviews, surveys, and potentially crowdsourcing. Further, it has emerged that hybrid approaches to flood protection, that integrate structural and nature-based

measures, may offer the most effective and economically viable solutions (Du et al., 2020). As colleagues are gradually investigating and assessing the effectiveness and resilience of nature-based solutions, such as mangroves and salt marshes, for coastal flood protection (Inácio et al., 2022; Luo et al., 2023; Mortensen et al., 2024; Tiggeloven et al. 2022), we argue that it is also crucial to incorporate the flood protection standards provided by these measures.

- 130 To achieve this, there is a pressing need to ascertain where coastal flood protection is presently available and
- 131 effective, and where it is not. We call on the flood protection community to join these efforts, working together
- 132 to build a comprehensive, global understanding of coastal flood protection measures. Only through such a
- 133 comprehensive approach can a reliable resource be established, enabling the analysis of both current and future





- 134 coastal flood risk. Until then, we recommend using FLOPROS in applications that are commensurate with the
- 135 nature of the data and with its methodology, emphasizing and clearly communicating the limitations of the dataset
- 136 accordingly.

137 Data availability

- 138 The excel file and GIS shapefile of COASTPROS-EU are available on the following repository: De Plaen, J. J.-
- 139 F. G., Colmenares, M., Koks, E., Scussolini, P., Lena, R., Lincke, D., Kiesel, J., Wolff, C., Tiggeloven, T.,
- 140 Peregrina Gonzalez, E. D., & Le Cozannet, G. (2024). COASTPROS-EU (v0.1) [Data set]. Zenodo.
- 141 <u>https://doi.org/10.5281/zenodo.12784278</u>

142 Competing interests

143 At least one of the (co-)authors is a member of the editorial board of Natural Hazards and Earth System Sciences.

144 References

- 145 Almar, R., Ranasinghe, R., Bergsma, E. W. J., Diaz, H., Melet, A., Papa, F., Vousdoukas, M., Athanasiou, P.,
- 146 Dada, O., Almeida, L. P., & Kestenare, E. (2021). A global analysis of extreme coastal water levels with
- 147 implications for potential coastal overtopping. Nature Communications, 12(1), Article 1.
- 148 https://doi.org/10.1038/s41467-021-24008-9
- 149 Bevacqua, Emanuele et al. 2020. "More Meteorological Events That Drive Compound Coastal Flooding Are
- 150 Projected under Climate Change." Communications Earth & Environment 1(1): 47.
- 151 Boulange, J., Hanasaki, N., Yamazaki, D. et al. Role of dams in reducing global flood exposure under climate
- 152 change. Nat Commun 12, 417 (2021). https://doi.org/10.1038/s41467-020-20704-0
- 153 Caretta, M.A. et al. 2022. "Water." In Climate Change 2022: Impacts, Adaptation, and Vulnerability. Contribution
- 154 of Working Group II to the Sixth Assessment Report of the Intergovernmental Panel on Climate Change,
- 155 Cambridge, UK and New York, NY: Cambridge University Press, 551–712. doi:10.1017/9781009325844.006.
- 156 Chen, Jie et al. 2023. "Impacts of Climate Warming on Global Floods and Their Implication to Current Flood
- 157 Defense Standards." Journal of Hydrology 618: 129236.
- 158 Darlington, C., Raikes, J., Henstra, D., Thistlethwaite, J., & Raven, E. K. (2024). Mapping current and future

159 flood exposure using a 5 m flood model and climate change projections. Natural Hazards and Earth

- 160 System Sciences, 24(2), 699–714. https://doi.org/10.5194/nhess-24-699-2024
- 161 Devitt, L., Neal, J., Coxon, G. et al. Flood hazard potential reveals global floodplain settlement patterns. Nat
- 162 Commun 14, 2801 (2023). <u>https://doi.org/10.1038/s41467-023-38297-9</u>
- 163 Du, S., Scussolini, P., Ward, P. J., Zhang, M., Wen, J., Wang, L., Koks, E., Diaz-Loaiza, A., Gao, J., Ke, Q., &
- 164 Aerts, J. C. J. H. (2020). Hard or soft flood adaptation? Advantages of a hybrid strategy for Shanghai. Global
- 165 Environmental Change, 61, 102037. https://doi.org/10.1016/j.gloenvcha.2020.102037
- 166 Feyen, L., Ciscar Martinez, J., Gosling, S., Ibarreta Ruiz, D., Soria Ramirez, A., Dosio, A., Naumann, G., Russo,
- 167 S., Formetta, G., Forzieri, G., Girardello, M., Spinoni, J., Mentaschi, L., Bisselink, B., Bernhard, J., Gelati, E.,
- 168 Adamovic, M., Guenther, S., De Roo, A., Cammalleri, C., Dottori, F., Bianchi, A., Alfieri, L., Vousdoukas, M.,





- 169 Mongelli, I., Hinkel, J., Ward, P., Gomes Da Costa, H., De Rigo, D., Liberta', G., Durrant, T., San-Miguel-Ayanz,
- 170 J., Barredo Cano, J., Mauri, A., Caudullo, G., Ceccherini, G., Beck, P., Cescatti, A., Hristov, J., Toreti, A., Perez
- Dominguez, I., Dentener, F., Fellmann, T., Elleby, C., Ceglar, A., Fumagalli, D., Niemeyer, S., Cerrani, I., 171
- 172 Panarello, L., Bratu, M., Després, J., Szewczyk, W., Matei, N., Mulholland, E. and Olariaga-Guardiola, M.,
- 173 Climate change impacts and adaptation in Europe, EUR 30180 EN, Publications Office of the European Union,
- 174 Luxembourg, 2020, ISBN 978-92-76-18123-1, doi:10.2760/171121, JRC119178.
- 175 Haasnoot, M., Winter, G., Brown, S., Dawson, R. J., Ward, P. J., & Eilander, D. (2021). Long-term sea-level rise
- 176 necessitates a commitment to adaptation: A first order assessment. Climate Risk Management, 34, 100355.
- 177 https://doi.org/10.1016/j.crm.2021.100355
- 178 Hermans, T.H.J., Malagón-Santos, V., Katsman, C.A. et al. The timing of decreasing coastal flood protection due
- 179 to sea-level rise. Nat. Clim. Chang. 13, 359-366 (2023). https://doi.org/10.1038/s41558-023-01616-5
- 180 Hill, Kristina. 2015. "Coastal Infrastructure: A Typology for the next Century of Adaptation to Sea-level Rise." 181 Frontiers in Ecology and the Environment 13(9): 468-76.
- 182
- Inácio, M., Karnauskaitė, D., Mikša, K., Gomes, E., Kalinauskas, M., & Pereira, P. (2022). Nature-Based 183 Solutions to Mitigate Coastal Floods and Associated Socioecological Impacts. In C. S. S. Ferreira, Z. Kalantari,
- T. Hartmann, & P. Pereira (Eds.), Nature-Based Solutions for Flood Mitigation: Environmental and Socio-184
- 185 Economic Aspects (pp. 35-58). Springer International Publishing. https://doi.org/10.1007/698 2020 675
- Kreibich, Heidi et al. 2017. "Adaptation to Flood Risk: Results of International Paired Flood Event Studies: 186
- 187 ADAPTATION TO FLOOD RISK." Earth's Future 5(10): 953-65.
- 188 Lim, W. H., Yamazaki, D., Koirala, S., Hirabayashi, Y., Kanae, S., Dadson, S. J., Hall, J. W., & Sun, F. (2018).
- 189 Long-Term Changes in Global Socioeconomic Benefits of Flood Defenses and Residual Risk Based on CMIP5
- 190 Climate Models. Earth's Future, 6(7), Article 7. https://doi.org/10.1002/2017EF000671
- 191 Luo, Z., Tian, J., Zeng, J., & Pilla, F. (2023). Resilient landscape pattern for reducing coastal flood susceptibility.
- 192 Science of The Total Environment, 856, 159087. https://doi.org/10.1016/j.scitotenv.2022.159087
- 193 Mortensen, E., Tiggeloven, T., Haer, T., van Bemmel, B., Le Bars, D., Muis, S., Eilander, D., Sperna Weiland,
- 194 F., Bouwman, A., Ligtvoet, W., and Ward, P. J.: The potential of global coastal flood risk reduction using various
- 195 DRR measures, Nat. Hazards Earth Syst. Sci., 24, 1381–1400, https://doi.org/10.5194/nhess-24-1381-2024, 2024.
- 196 Neumann, B., Vafeidis, A. T., Zimmermann, J., & Nicholls, R. J. (2015). Future Coastal Population Growth and
- 197 Exposure to Sea-Level Rise and Coastal Flooding-A Global Assessment. PLOS ONE, 10(3), e0118571.
- 198 https://doi.org/10.1371/journal.pone.0118571
- 199 Nienhuis, J. H., J. R. Cox, J. O'Dell, D. A. Edmonds and P. Scussolini (2022). "A global open-source database of
- 200 flood-protection levees on river deltas (openDELvE)." Nat. Hazards Earth Syst. Sci. 22(12): 4087-4101.
- 201 O'Dell, J., Nienhuis, J. H., Cox, J. R., Edmonds, D. A., & Scussolini, P. (2021). A global open-source database
- 202 of flood-protection levees on river deltas (openDELvE). https://doi.org/10.5194/nhess-2021-291
- 203 Paprotny, D., Hart, C. M. P. 't, & Napoles, O. M. (2024). Evolution of flood protection levels and flood 204 vulnerability in Europe since 1950 estimated with vine-copula models. https://doi.org/10.21203/rs.3.rs-205 4213746/v1
- 206 PBL, 2023. The Geography of Future Water Challenges: Bending the Trend. PBL, The Hague.
- 207 Reimann, Lena & Vafeidis, Athanasios & Honsel, Lars. (2023). Population development as a driver of coastal
- 208 risk: Current trends and future pathways. Cambridge Prisms: Coastal Futures. 1. 1-23. 10.1017/cft.2023.3.





- 209 Reguero, Borja G. et al. 2015. "Effects of Climate Change on Exposure to Coastal Flooding in Latin America and
- the Caribbean" ed. Juan A. Añel. PLOS ONE 10(7): e0133409.
- 211 Sauer, Inga J. et al. 2021. "Climate Signals in River Flood Damages Emerge under Sound Regional
- 212 Disaggregation." Nature Communications 12(1): 2128.
- 213 Orie Sasaki, Yugo Tsumura, Masafumi Yamada, & Yukiko Hirabayashi. (2023). Automatic levee detection using
- a high-resolution DEM Case study in Kinu river basin, Japan.
 https://www.jstage.jst.go.jp/article/hrl/17/1/17 9/ article/-char/ja/
- 216 Scussolini, Paolo et al. 2016. "FLOPROS: An Evolving Global Database of Flood Protection Standards." Natural
- 217 Hazards and Earth System Sciences 16(5): 1049–61.
- 218 Taherkhani, M., Vitousek, S., Barnard, P.L. et al. Sea-level rise exponentially increases coastal flood frequency.
- 219 Sci Rep 10, 6466 (2020). https://doi.org/10.1038/s41598-020-62188-4
- 220 Tiggeloven, T., de Moel, H., Winsemius, H. C., Eilander, D., Erkens, G., Gebremedhin, E., Diaz Loaiza, A.,
- 221 Kuzma, S., Luo, T., Iceland, C., Bouwman, A., van Huijstee, J., Ligtvoet, W., & Ward, P. J. (2020). Global-scale
- 222 benefit-cost analysis of coastal flood adaptation to different flood risk drivers using structural measures. Natural
- Hazards and Earth System Sciences, 20(4), Article 4. https://doi.org/10.5194/nhess-20-1025-2020
- 224 Tiggeloven, T., de Moel, H., van Zelst, V. T., van Wesenbeeck, B. K., Winsemius, H. C., Eilander, D., & Ward,
- 225 P. J. (2022). The benefits of coastal adaptation through conservation of foreshore vegetation. Journal of Flood
- 226 Risk Management, 15(3), e12790.
- 227 Toimil, Alexandra et al. 2020. "Addressing the Challenges of Climate Change Risks and Adaptation in Coastal
- 228 Areas: A Review." Coastal Engineering 156: 103611.
- 229 UNEP, 2023. Adaptation Gap Report 2023. UNEP, Nairobi, https://www.unep.org/adaptation-gap-report-2023
- 230 UNEP, 2023. Adaptation Gap Report 2023: Underfinanced. Underprepared. Inadequate investment and planning
- 231 on climate adaptation leaves world exposed. The Adaptation Finance Gap Update 2023. Nairobi,
- 232 Vousdoukas, M. I., Mentaschi, L., Voukouvalas, E., Bianchi, A., Dottori, F., & Feyen, L. (2018). Climatic and
- socioeconomic controls of future coastal flood risk in Europe. Nature Climate Change, 8(9), Article 9.
 https://doi.org/10.1038/s41558-018-0260-4
- Vousdoukas, M.I., Mentaschi, L., Hinkel, J. et al. Economic motivation for raising coastal flood defenses in
 Europe. Nat Commun 11, 2119 (2020). https://doi.org/10.1038/s41467-020-15665-3
- 237 Ward, P., Jongman, B., Aerts, J. et al. A global framework for future costs and benefits of river-flood protection
- 238 in urban areas. Nature Clim Change 7, 642–646 (2017). https://doi.org/10.1038/nclimate3350
- Wang, D., Scussolini, P., and Du, S.: Assessing Chinese flood protection and its social divergence, Nat. Hazards
 Earth Syst. Sci., 21, 743–755, https://doi.org/10.5194/nhess-21-743-2021, 2021.
- 241 Wing, O. E. J., Bates, P. D., Neal, J. C., Sampson, C. C., Smith, A. M., Quinn, N., Shustikova, I., Domeneghetti,
- 242 A., Gilles, D. W., Goska, R., & Krajewski, W. F. (2019). A New Automated Method for Improved Flood Defense
- Representation in Large-Scale Hydraulic Models. Water Resources Research, 55(12), 11007–11034.
 https://doi.org/10.1029/2019WR025957
- 245 Yesudian, A. N., & Dawson, R. J. (2021a). Global analysis of sea level rise risk to airports. Climate Risk
- 246 Management, 31, 100266. https://doi.org/10.1016/j.crm.2020.100266
- 247 van Zelst, V.T.M., Dijkstra, J.T., van Wesenbeeck, B.K. et al. Cutting the costs of coastal protection by integrating
- 248 vegetation in flood defenses. Nat Commun 12, 6533 (2021). https://doi.org/10.1038/s41467-021-26887-4