

### Physics-guided statistical modelling of flood inundation for rapid deployment

### **用于快速部署的洪水淹没物理指**导统计 模型

Fraehr N, <u>Wang QJ 王全君</u>, Wu W, and Nathan R June 2023

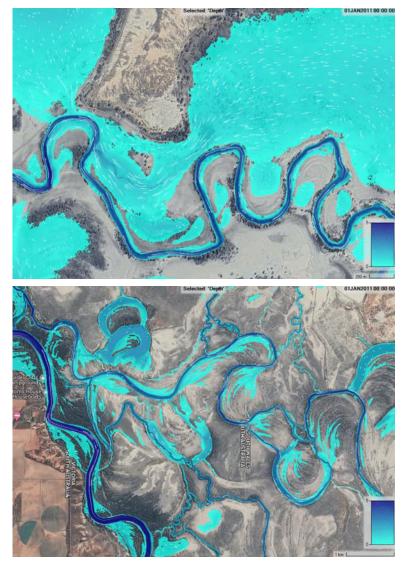




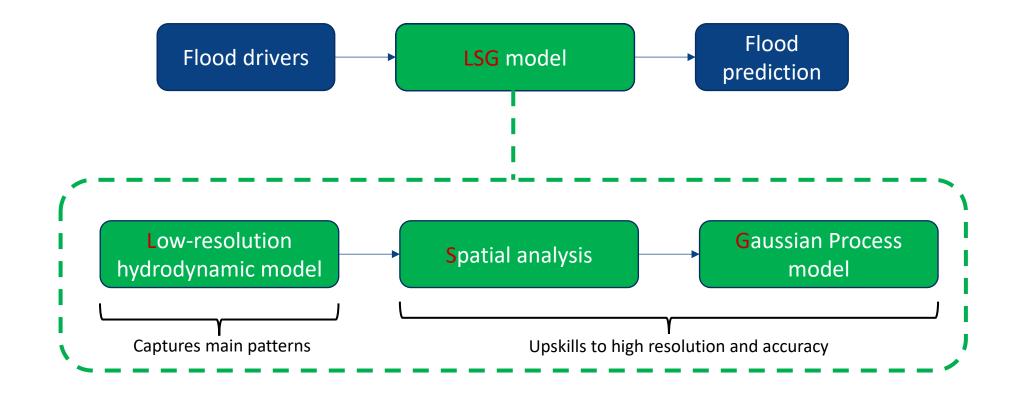
# The problem: flood inundation modelling 问题:洪水淹没模拟

• Hydrodynamic models (MIKE, TUFLOW, HEC-RAS)



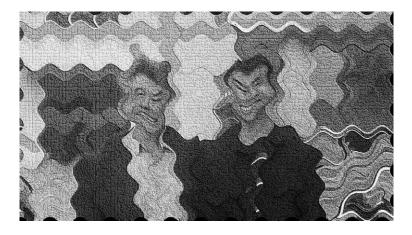








## Our approach 我们的方法



#### Feature/pattern matching ?







• Reducing dimensions 减维

• Statistical upskilling/calibration of the reduced variables 改进/校准减维后的变量

• Reverse back to high dimensions 反算回到高维



- Reducing dimensions 减维
  - Empirical orthogonal function (EOF) analysis 经验正交函数分析
- Statistical upskilling/calibration of the reduced variables 改进/校准减维后的变量
  - Gaussian process 高斯过程

Reverse back to high dimensions 反算回到高维

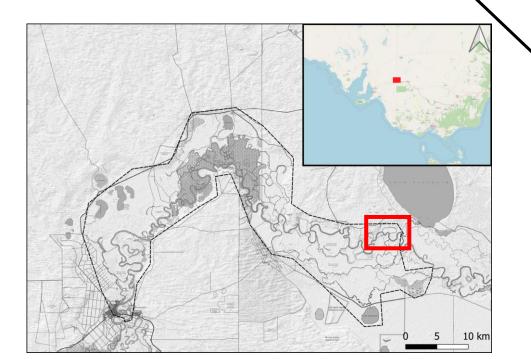
- Reverse EOF analysis

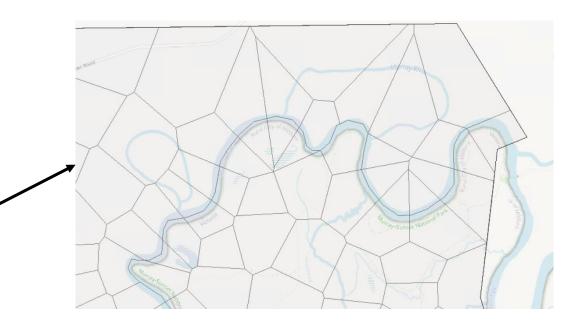


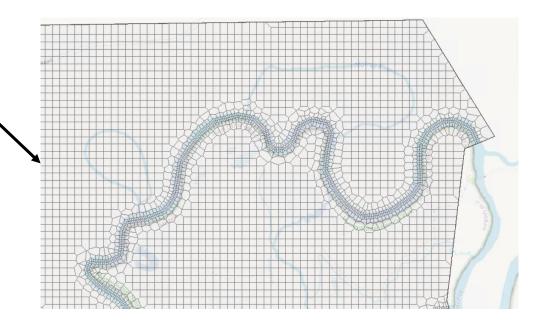
#### Chowilla floodplain (740 km<sup>2</sup>)

- Part of the Murray river
- Flat and complex topography
- Slow moving water

Low-resolution model: HEC-RAS (1,434 cells) High-resolution model: HEC-RAS (109,914 cells)





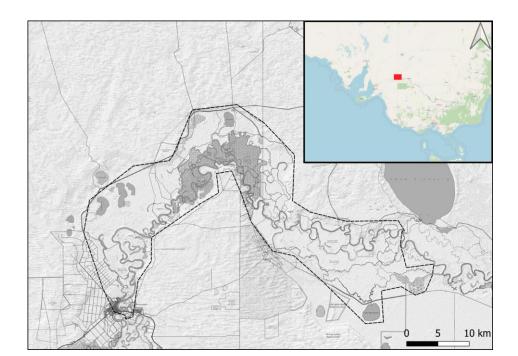




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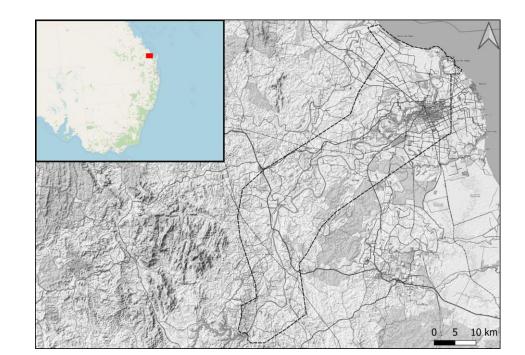
Low-resolution model: HEC-RAS (1,434 cells) High-resolution model: HEC-RAS (109,914 cells)



#### Burnett river (1,479 km<sup>2</sup>)

- Coastal river
- Steep and canyon like topography
- Fast flowing water

Low-resolution model: HEC-RAS (15,256 cells) High-resolution model: TUFLOW (3,697,597 cells)





### **Results – Computational time** 结果 - 计算时间

#### Chowilla floodplain (3.5 month event)

Low-resolution model: HEC-RAS

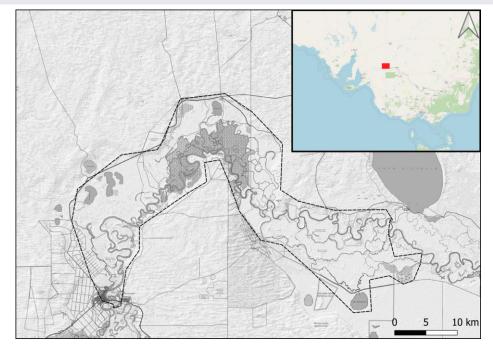
• 28 s

Upskilling

• 5 s

High-resolution model: HEC-RAS

• 10 hr 43 min 34 s



#### Burnett river (430 hr event)

Low-resolution model: HEC-RAS

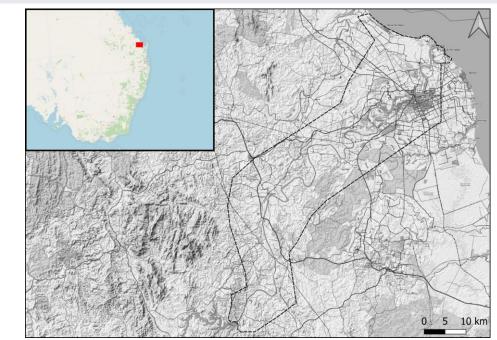
• 10 s

Upskilling

• 17 s

High-resolution model: TUFLOW

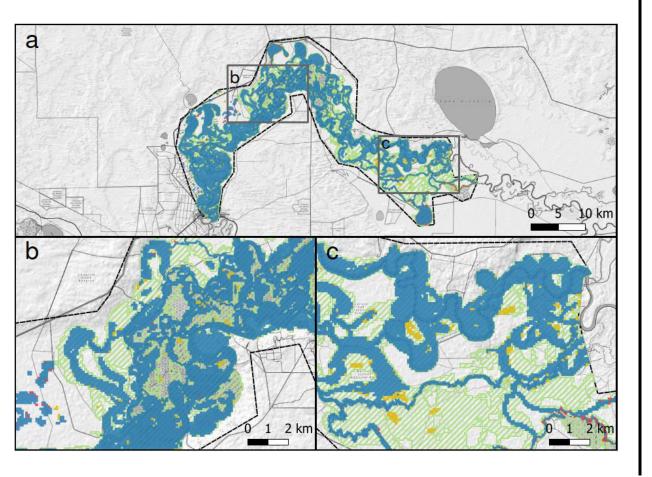
• 36 hr 20 min 0 s



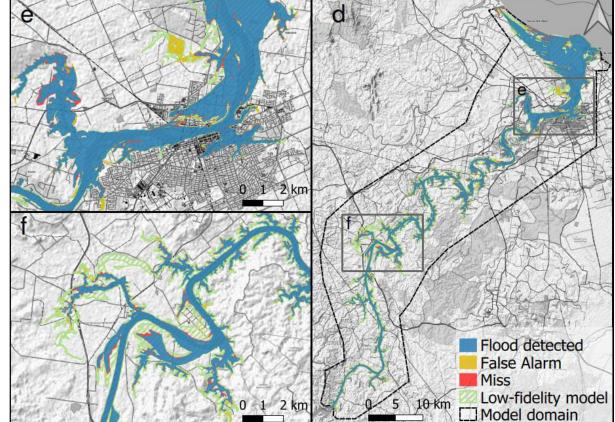


### Results – Inundation extent 结果 - 淹没范围

#### Chowilla floodplain



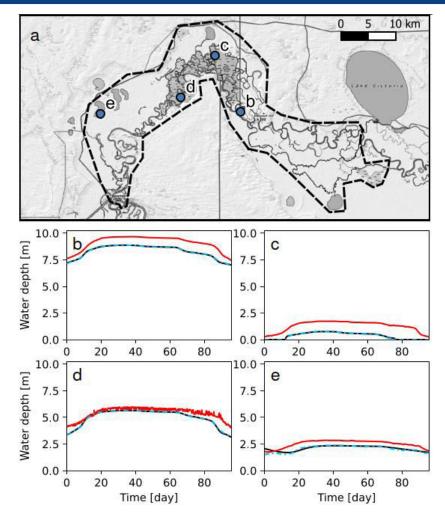
#### **Burnett river**



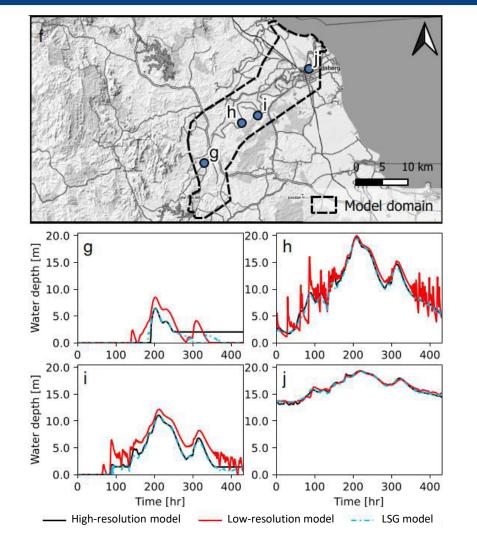


### Results – Water depth 结果 – 淹没深度

#### Chowilla floodplain



#### **Burnett river**



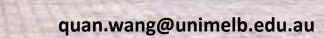
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- The LSG model compared to traditional high-resolution models
  - Over 1000 times faster
  - Has similar accuracy
- Real-time flood forecasts for large domains
- Informed decisions by emergency response
- Probabilistic design flood for infrastructure planning



- Fraehr N, Wang QJ, Wu W and Nathan R (2022) Upskilling low-fidelity hydrodynamic models of flood inundation through spatial analysis and Gaussian Process learning, Water Resources Research, 58, e2022WR032248. <u>https://doi.org/10.1029/2022WR032248</u>
- Fraehr N, Wang QJ, Wu W and Nathan R (2023) Development of a fast and accurate hybrid model for floodplain inundation simulations, Water Resources Research, 59, e2022WR033836. <u>https://doi.org/10.1029/2022WR033836</u>
- Fraehr N, Wang QJ, Wu W and Nathan R, Supercharging hydrodynamic inundation models for instant flood insight , **Nature Water**, 11 September 2024



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# **Flood inundation modelling**

- Machine learning
  - Zhou Y, Wu W, Nathan R and Wang QJ (2022) Deep learning-based rapid flood inundation modelling for flat floodplains with complex flow paths, Water Resources Research, <u>https://doi.org/10.1029/2022WR033214</u>
  - Yang Q, Wu W, Wang QJ and Vaze J (2022) A 2D hydrodynamic model-based method for efficient flood inundation modelling, Journal of Hydroinformatics, <u>https://doi.org/10.2166/hydro.2022.133</u>
  - Zhou Y, Wu W, Nathan R and Wang QJ (2021) Python program for spatial reduction and reconstruction method in flood inundation modelling, MethodsX, DOI: <u>https://doi.org/10.1016/j.mex.2021.101527</u>
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  - Xie S, Wu W, Mooser S, Wang QJ, Nathan R and Huang Y (2020) Artificial Neural Network based Hybrid Modeling Approach for Flood Inundation Modeling, Journal of Hydrology, <u>https://doi.org/10.1016/j.jhydrol.2020.125605</u>47.
  - Chu H, Wu W, Wang QJ, Nathan R and Wei J (2019) An ANN-based emulation modelling framework for flood inundation modelling: application, challenges and future directions, Environmental Modelling & Software, <u>https://doi-org/10.1016/j.envsoft.2019.104587</u>
- Library maps
  - Wang W, Wang QJ, Nathan R and Velasco-Forero C (2022) Rapid prediction of flood inundation by interpolation between flood library maps for real-time applications, Journal of Hydrology, <u>https://doi.org/10.1016/j.jhydrol.2022.127735</u>