

# Hurricane flooding and water quality issues: opportunities for increased resilience

Danica Schaffer-Smith<sup>1,2</sup>, Soe W. Myint<sup>3</sup>, Rebecca L. Muenich<sup>4</sup>, Daoqin Tong<sup>3</sup>, Julie E. DeMeester<sup>2</sup>

<sup>1</sup>Center for Biodiversity Outcomes, Julie Ann Wrigley Global Institute of Sustainability, Arizona State University, Tempe, AZ. <sup>2</sup>The Nature Conservancy North Carolina, Durham, NC.

<sup>3</sup>School of Geographical Sciences & Urban Planning, ASU. <sup>4</sup>School of Sustainable Engineering & the Built Environment, ASU. Contact: d.schaffer-smith@tnc.org

## Motivation and objectives

Hurricanes are often accompanied by poor water quality threatening humans and aquatic species<sup>1-5</sup> (e.g., Fig. 1), yet impacts are difficult to measure<sup>6</sup>. Increased storm frequency and intensity, coupled with ongoing land use change, will exacerbate impacts to vulnerable communities and ecological systems<sup>6-8</sup>. North Carolina experienced two ‘500-yr’ storms 2016-2018, presenting a timely case for assessing floodplain resilience to inform interventions. Flood extent mapping can help to quantify potential impacts<sup>9</sup>.



**Figure 1. Hurricane-related water quality issues include low oxygen and fish kills (A: Lock & Dam 1, Cape Fear River) and widespread distribution of harmful contaminants (B: swine facility near Kinston, NC).**

### Objectives:

- 1) Delineate flooding from Hurricanes Matthew (2016) and Florence (2018).
- 2) Assess implications of differences between exposure compared to hazard maps vulnerable human communities and freshwater networks.
- 3) Identify opportunities to reduce future flooding and water quality problems.

## Methods

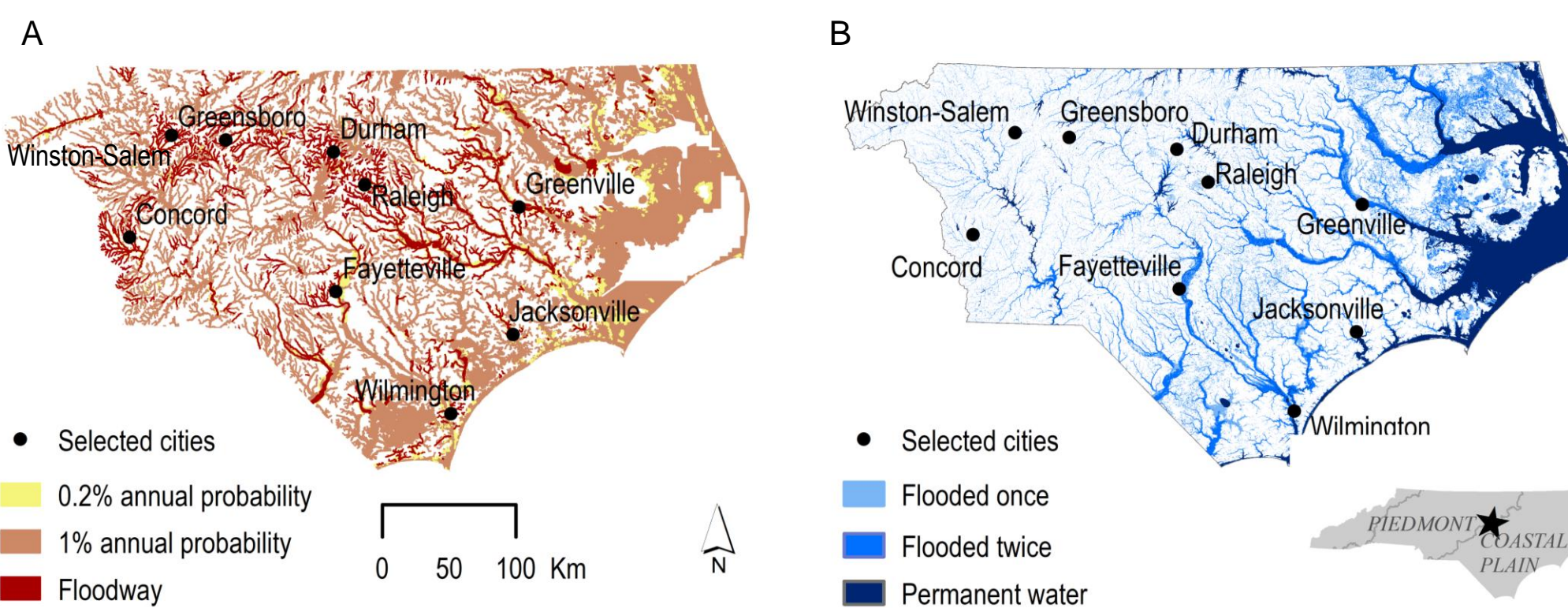
- We mapped flood extent with Sentinel-1 radar<sup>10</sup>, topography<sup>11-13</sup>, landcover<sup>14,15</sup>, and floodplain<sup>16</sup> data using random forest models<sup>17</sup> in Google Earth Engine<sup>18</sup>. We used high-resolution aerial photography<sup>19</sup> and high water marks<sup>20,21</sup> for model validation.
- To examine potential impacts on vulnerable human populations<sup>22</sup> and freshwater networks<sup>23</sup> across flood hazard and exposure areas, we used quantile regression<sup>24</sup>.
- We identified flood-prone pollutant sources<sup>25,26</sup> and water supply and treatment infrastructure; in addition we mapped locations where nature-based solutions could reduce flooding and improve water quality.

## References

1. Khan, S.J., et al. (2015) *Water Res.*, 85.
2. Cann, K.F., et al. (2013) *Epidemiol. Infect.*, 141.
3. Schwarzenbach, R.P. (2006) *Science*, 313.
4. DeLorenzo, M.E., et al. (2001) *Environ. Toxicol. Chem.*, 20.
5. Wing, S., et al. (2002) *Environ. Health Perspect.*, 110.
6. Tapsell, S.M., et al. (2002) *Philos. Trans. R. Soc. Lond. Ser. Math. Phys. Eng. Sci.*, 360.
7. Brouwer, R., et al. (2007) *Risk Anal.*, 27.
8. Kotzee, I., et al. (2016) *Ecol. Indic.*, 60.
9. Boryan, C.G., et al. (2018) *IGARSS 2018*.
10. Copernicus (2018) Sentinel-1 SAR data.
11. Nobre, A.D., et al. (2011) *J. Hydrol.*, 404(1-2).
12. USGS (2015) 10m National Elevation Dataset.
13. Terziotto, S. & Hopkins, K.G. (2018) Geomorphological features of North Carolina.
14. Homer, C.G., et al. (2015) *Photogramm. Eng. Remote Sensing*, 81(5).
15. Pekel, J-F., et al. (2016) *Nature*, 540(7633).
16. Wing, O., et al. (2017) *Water Resour. Res.*, 53(9).
17. Breiman, L. (2001). *Machine Learning*, 45(1).
18. Gorelick, N. et al. (2017) *Remote Sens. Environ.*, 202.
19. NOAA & FEMA (2018) Emergency Response Imagery.
20. USGS (2018) High water marks.
21. NC Division of Emergency Management (2018) High water marks.
22. Flanagan, B.E., et al. (2011) *J. Homel. Secur. Emerg. Manag.*, 8.
23. Benner, R., et al. (2014) North Carolina's Freshwater Resilience, The Nature Conservancy.
24. Koenker, R. (2005). *Quantile Regression*. Cambridge: Cambridge University Press.
25. NC Department of Environmental Quality (2018) Online GIS.
26. The Environmental Working Group & Waterkeeper Alliance (2016) North Carolina poultry facility locations.
27. Arnold, J.G., et al. (2012) *Trans. ASABE*, 55.

## Hazard mapping underestimated impacts on vulnerable systems

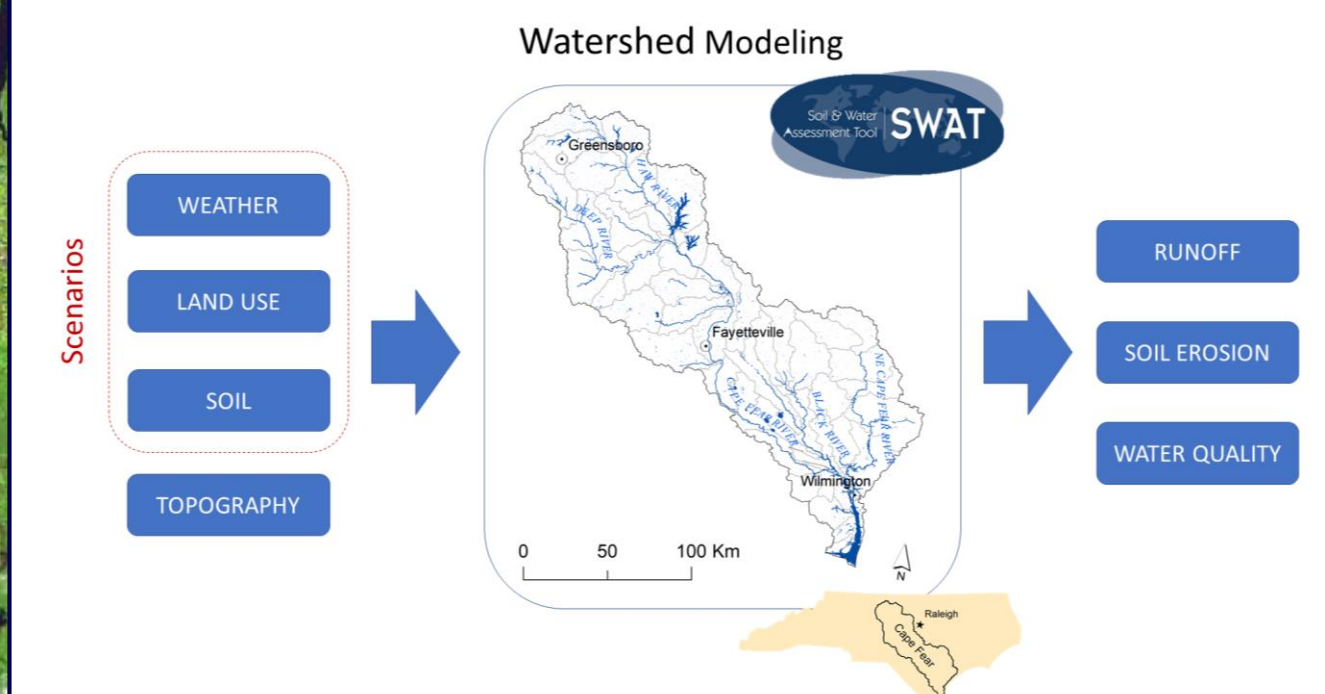
Across the Piedmont and Coastal Plain of North Carolina, we identified hurricane flooding (>91% accuracy) beyond hazard zones—Hurricane Florence exceeded the 1% annual probability zone by ~23% (Fig. 2). Furthermore, the legal floodplain underestimated impacts for communities with higher proportions of older adults, disabilities, unemployment, and mobile homes, as well as for headwater streams with restricted elevation gradients.



**Figure 2. Areas well beyond state mapped flood hazard zones (A: 0.2% probability = ‘500-yr’ floodplain, 1% annual probability = ‘100-yr floodplain’) were affected by flooding from Hurricanes Matthew and Florence, as detected with Sentinel-1 SAR (B).**

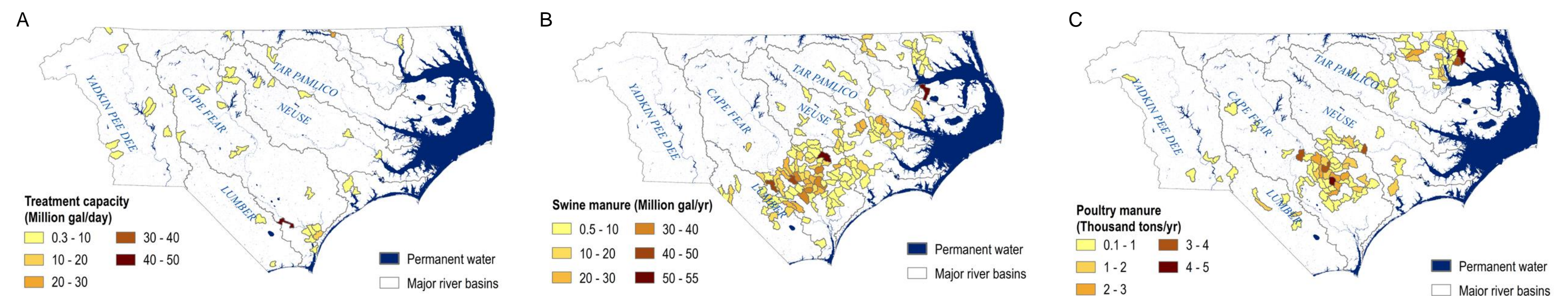
## Implications and Next Steps

- **Results suggest that current hazard mapping is inadequate for resilience planning to protect vulnerable systems.**
- **Modification of design standards, land-use policies, and operation of infrastructure that conveys and treats water and pollutants are warranted.**
- **Interventions will be more thoroughly assessed using a Soil and Water Assessment Tool Model<sup>27</sup> in collaboration with the U.S. Geological Survey.**



## Potential impacts and opportunities

Repeated flooding affected numerous potential sources of water contaminants, including 218 wastewater treatment plants (~55% capacity), and 91 swine farms (~500 million tons/yr manure). To illustrate potential impacts due to flooding beyond the 100-yr floodplain (1% annual probability), we use the example of nutrient sources subject to distinct regulatory limitations, including wastewater treatment plants (National Pollution Discharge Elimination System [NPDES] permitted point-source), swine facilities (NPDES permitted point-source, or non-point source) and poultry facilities (non-point source) (Fig. 3). We also identified ~4.8 million km<sup>2</sup> of forests and wetlands lacking formal protection, and ~1.7 million km<sup>2</sup> of working lands where restoration or management changes could be considered.



**Figure 3. Potential nutrient load by watershed from facilities beyond the ‘100-yr’ floodplain affected by Hurricanes Florence and Matthew. A: Permitted wastewater treatment plants. B: Permitted swine farms, which also include lands where waste is regularly applied. C: Poultry farms not regulated by NPDES.**

Copernicus Sentinel-1 SAR data were processed by ESA. Applied Flow Technology provided modeled 1,000-year floodplain data. The Environmental Working Group provided poultry facility location data. Funding was provided by a NatureNet Science Fellowship.

Photo: NASA Landsat 8 image of the Trent River, North Carolina, September 19, 2018.