How reusable are your data? - Towards truly FAIR open data for

urban drainage

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Highlights

- We critically review some examples of urban drainage Open Research Data
- Re-using non-contact spectral pollution monitoring data slightly improved the predictive performance through more reliable data analysis
- Bottlenecks are mostly concerned with the interoperability and the reusability of the data

Available, reliable, and reusable datasets from sewers would have enormous value

Generating new insight from existing data is a major cornerstone of the scientific process. Re-using existing observations with a fresh idea, possibly including complementary datasets, may answer questions that the initial investigators did not even consider. Or demonstrating that an existing idea can be usefully applied to a wider range of circumstance can deliver significant benefits to society. In this fashion, Open Research Data are at the heart of scientific discovery and open science ("Research Parasite Award," 2021). As we all know, experimentation with wastewater and especially in full-scale urban drainage systems is laborious, potentially hazardous and often costly. Consequently, a culture of open (research) data in the field of urban drainage could save substantial costs and reduce project risk especially for research and industrial R&D. However, in the urban drainage area only very few open research datasets exist, which can be difficult to interpret and hence reuse (Abdel-Aal et al., 2018; Nedergaard Pedersen et al., 2021; NYS, 2013; Rivertrust, 2022; Špačková et al., 2021).

Reusing observations in our field, is challenging, among other things, because observations come from various sensors, such as weather radars, ultrasonic depth and velocity probes, or spectrometer probes, for which detailed meta-data, e.g. sensor failures (Figure 1, left) are lacking. Thus, it can be difficult to interpret the data or to assess their "usability" in other studies (Figure 1, right). Openly available, reliable, and re-usable datasets would make it possible to i) study domain-specific processes, ii) build exploratory and predictive models, iii) better calibrate existing models, vi) assess the impact of policies, etc. Several funder of research now encourage researchers to follow the FAIR principles (Finable, Accessible, Interoperable and Re-useable) when collecting project specific data (EC, 2022). Unfortunately, in our field, generally accepted standards are lacking.

| The Rivers Is my | river fit to p | lay in? | | Dataset A | 1 |
|---------------------|----------------|------------|---------------|--|---|
| | - | | | NYS Combined Sewer Overflows (CSOs) Explore Open Data from New York State | Easy to understand and includes essential metadata |
| Q Cherton | | 0 | | 10 | ✓ Subtitle |
| 0° 0° 0° 0° | | | | State of New York • updated a year ago (Version 3) | ✓ Tags |
| eigh | | | | Date Code Discussion Activity Metadata Download (656 kB) New Notebook | Overview description |
| | Duration | Spills | EDM Operation | ton- Lisep | ✓ Cover image |
| Site Name | [hrs] | [#] | [%] | Treid & License CC0: Public Domain Tags warth and nature, socrata | Rich, machine readable file formats and metadata |
| BIGGLESWADE-DAR | 12.50 | 13 | 99.42% | Description | ✓ File descriptions |
| BIGGLESWADE-SHC | 1.50 | 1 | 100.00% | Content | O Column descriptions |
| BILLERICAY STW | 0.00 | 0 | 68.88% | The dataset represents the locations of combined server overflow (CSOs) outfall locations in NVS. It also include | License specified |
| | | - | | overflow detection capabilities of CSO communities and overflow frequency data within a specified timeframe. | Acceptable file formats used |
| BLACKHORSE DROV | 0.00 | 0 | 11.35% | Context | Assurances the dataset is |
| BLACKMORE-THE G | 28.50 | 4 | 100.00% | This is a dataset hosted by the State of New York. The state has an open data platform found here and they update their information according the amount of data that is brought in. Explore New York State using Kaggie | Maintained O Provenance is specified |
| BLAKESLEY TPS | 0.50 | 1 | 8.64% | and all of the data sources available through the State of New York organization page! | O Update frequency is specified |
| BOCKING-BRADFOR | | 0 | 99.99% | Update Prequency: This dataset is updated annually. Acknowledgements | O Has a public kernel or task |
| | 0,000 | Manchester | | Hidde This dataset is maintained using Socrata's API and Keggla's API. Secrata has assisted countless organizations | |

Figure 1. Left: Openly available dataset on CSOs in the UK, which is provided in .csv format, has good metadata and thus is INTEROPERABLE and REUSABLE. Right: Open CSO data from the State of New York, which has a comparably high "usability" score, due to specified licenses for re-use, and meta-data descriptions. Formal assurances that this dataset is maintained are lacking.

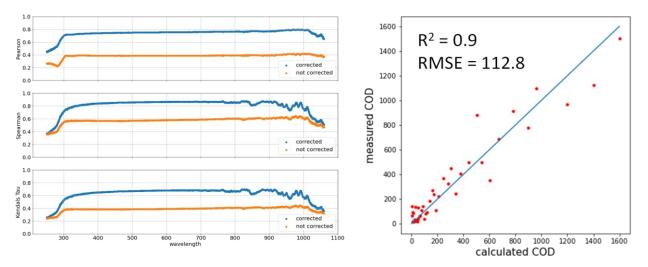


Figure 2. The reuse of spectroscopy data improves the predictive power. Left: Re-analysis (blue) leads to higher correlation coefficients and subsequently to better predictions of COD (right) compared to the original study. While bottlenecks of reusing the data concern all FAIR aspects, most issues in this study concerned INTEROPERABILITY and REUSEABILITY.

In this paper, we present our experience with reusing a unique research dataset on non-contact monitoring of wastewater pollution and then discuss issues regarding implementing of the FAIR principles in the urban drainage community.

Predicting COD from non-contact monitoring of wastewater pollution

In a ground-breaking study, Agustsson et al. (2014) used non-contact monitoring to predict simultaneously the chemical oxygen demand (COD) and turbidity (TUR) concentrations from diffuse reflectance UV-Vis spectra (200–1100 nm). The measured spectra were analyzed using partial-least-squares (PLS) regression. The correlation coefficient between the measured and the reference concentrations of COD was promising (R^2 =0.85). In our re-analysis of the data, we improved the predictive power for COD (R^2 =0.90) slightly, by applying the following steps: First, we identified relevant wavelengths by correlation analysis (Figure 2, left, blue lines). Second, we repeated the calculations, considering the additional COD of the NTU turbidity standard (0.45 (mgO2/L)/NTU) (red lines). Third, we re-fitted their original leave-one-out PLS model (Figure 2, right).

Improving the reusability needs community standards and incentives

Regarding the FAIR principles for open data, we draw the following conclusions: To FIND the data, we had to contact the authors, who provided them by email. While they were ACCESSIBLE, because the data were saved in the commonly accepted ASCII standard, they were not machine-readable without the need for specialized or ad hoc algorithms for translating and mapping. Thus, INTEROPERABILITY and REUSABILITY were only achieved through several in-depth conversations with the data producers. In our view, this was mostly, because accepted standards are lacking in our community. At the SPN10 conference, we would like to discuss how i) to develop a culture in which data interoperability can be expected and ii) we improve incentives to reuse data and so improve the quality and impact of research from the sewer processes and networks community.

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