

Supplementary information

Best practices in machine learning for chemistry

In the format provided by the authors and unedited

Checklist for reporting and evaluating machine learning models

1. Data sources

- 1a. Are all data sources listed and publicly available?
- 1b. If using an external database, is an access date or version number provided?
- 1c. Are any potential biases in the source dataset reported and/or mitigated?

2. Data cleaning

- 2a. Are the data cleaning steps clearly and fully described, either in text or as a code pipeline?
- 2b. Is an evaluation of the amount of removed source data presented?
- 2c. Are instances of combining data from multiple sources clearly identified, and potential issues mitigated?

3. Data representations

- 3a. Are methods for representing data as features or descriptors clearly articulated, ideally with software implementations?
- 3b. Are comparisons against standard feature sets provided?

4. Model choice

- 4a. Is a software implementation of the model provided such that it can be trained and tested with new data?
- 4b. Are baseline comparisons to simple/trivial models (for example, 1-nearest neighbour, random forest, most frequent class) provided?
- 4c. Are baseline comparisons to current state-of-the-art provided?

5. Model training and validation

- 5a. Does the model clearly split data into different sets for training (model selection), validation (hyperparameter optimization), and testing (final evaluation)?
- 5b. Is the method of data split (data splitting (for example, random, cluster- or time-based splitting, forward cross-validation) clearly stated? Does it mimic anticipated real-world application?
- 5c. Does the data splitting procedure avoid data leakage (for example, is the same composition present in the training and test sets)?

6. Code and reproducibility

- 6a. Is the code or workflow available in a public repository?
- 6b. Are scripts to reproduce the findings in the paper provided?