Original Paper

# Template for preparing a submission to Bioinformatics using RMarkdown

**Quang P. Nguyen [1,2], Anne G. Hoen [1,2], H. Robert Frost [2],**

[1]Department of Epidemiology, Geisel School of Medicine at Dartmouth College
[2]Department of Biomedical Data Science, Geisel School of Medicine at Dartmouth College

To whom correspondence should be addressed. E-mail: bob@email.com

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## Abstract

**Motivation:** This section should specifically state the scientific question within the context of the field of study.
**Results:** This section should summarize the scientific advance or novel results of the study, and its impact on computational biology.
**Availability:** This section should state software availability if the paper focuses mainly on software development or on the implementation of an algorithm. Examples are: 'Freely available on the web at XXX.' Website implemented in Perl, MySQL and Apache, with all major browsers supported'; or 'Source code and binaries freely available for download at URL, implemented in C++ and supported on linux and MS Windows'. The complete address (URL) should be given. If the manuscript describes new software tools or the implementation of novel algorithms the software must be freely available to non-commercial users. Authors must also ensure that the software is available for a full TWO YEARS following publication. The editors of Bioinformatics encourage authors to make their source code available and, if possible, to provide access through an open source license.
**Contact:**bob@email.com
**Supplementary information:** Supplementary data are available at Bioinformatics Online.

## 1 Introduction

## 2 Materials and Methods

## 3 Methods

### 3.1 Competitive Isometric Log-ratio (cILR)

The cILR method generates sample-specific enrichment scores for microbial sets using the isometric log-ratio transformation (Egozcue *et al.*, 2003). The cILR method takes two inputs:

- $\mathbf{X}$: $n$ by $p$ matrix of positive counts for $p$ taa and $n$ samples measured through either targeted sequencing $p$ matrix of positive counts for $p$ taxa and $n$ samples measured through either targeted sequencing (such as 16S rRNA) or whole genome shotgun sequencing. Usually $\mathbf{X}$ is generated from standard sequence processing pipelines such as DADA2 (Callahan *et al.*, 2016) and MetaPhlAn2 (Truong *et al.*, 2015)

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- $\mathbf{A}$: $p$ by $m$ indicator matrix annotating the membership of each taxa $p$ to $m$ sets of interest. These sets can be Linnean taxonomic classifications annotated using databases such as SILVA Quast *et al.* (2013), or those based on more functionally driven categories such as the tropism of each microbe ($a_{i,j} = 1$ indicates that microbe $i$ belongs to set $j$).

The cILR method generates one output:

- $\mathbf{E}$: $n$ by $m$ matrix indicating the enrichment score of $m$ pre-defined sets identified in $\mathbf{A}$ across $n$ samples.

The procedure is as follows:

1. **Compute the cILR statistic**: Let $\mathbf{M}$ be a $n$ by $m$ matrix of cILR scores. Let $\mathbf{M}_{i,k}$ be cILR scores for set $k$ of sample $i$:

$$\mathbf{M}_{i,k} = \sqrt{\frac{\sum_k A_{ik}(p - \sum_k A_{ik})}{p}} \ln\left(\frac{g(\mathbf{X}_{i,j}|\mathbf{A}_{j,k} = 1)}{g(\mathbf{X}_{i,j}|\mathbf{A}_{j,k} \neq 1))}\right)$$

where $g()$ is the geometric mean. This represents the ratio of the geometric mean of the relative abundance of taxa assigned to set $k$ and remainder taxa.

2. **Compute the cILR statistic on permuted $\mathbf{X}$**: We seek to evaluate the empirical null distribution of the cILR statistic under $H_o$ that relative abundances in $\mathbf{X}$ of members of set $k$ are not enriched compared to those not in set $k$. Let $\mathbf{X}_p$ be the column permuted relative abundance matrix, and $\mathbf{M}_p$ be the corresponding cILR scores generated from $\mathbf{X}_p$.

3. **Fit Gaussian mixture distribution for each column of $\mathbf{M}_p$**

4. **Calculate finalized cILR scores as CDF values of the fitted mixture distribution**

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## 4 Discussion

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## 5 Conclusion

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for details. Authors must ensure that manuscripts are clearly indicated as NIH-funded using the guidelines above.

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