Statistical Modeling of the Red Sea Chlorophyll Concentration and Application to the ERSEM Ecological Model

Thesis by

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APPENDICES

A Appendix A Title

Detailed experimental procedures, data tables, computer programs, etc. may be placed in appendices. This may be particularly appropriate if the dissertation or thesis includes several published papers.

B Appendix B Title

Your content goes here.

C Papers Submitted and Under Preparation

- Author 1 Name, Author 2 Name, and Author 3 Name, "Article Title", *Submitted to Conference/Journal Name*, further attributes.
- Author 1 Name, Author 2 Name, and Author 3 Name, "Article Title", *Submitted to Conference/Journal Name*, Mon. Year.