

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

Thesis by
Denis Dreano

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TABLE OF CONTENTS

Examination Committee Approval	2
Copyright	3
List of Figures	8
List of Tables	9
1 Motivation	10
1.1 Importance of phytoplankton	10
1.2 Measuring Chlorophyll Concentration	11
1.3 Primary productivity in the Red Sea	12
1.4 Chlorophyll Concentration Prediction	13
1.5 Modeling Chlorophyll Concentration	14
2 Objectives	16
3 Plan	17
3.1 Task 1: Dataset building and Exploration	17
3.1.1 Motivation	17
3.1.2 Open Questions	18
3.1.3 Method and Work Done	18
3.2 Task 2: Forecasting Chlorophyll Concentration in Regional Aggregates	19
3.2.1 Motivation	19
3.2.2 Open Questions	19
3.2.3 Method	20
3.2.4 Expected Outcomes	20
3.3 Task 3: Global geostatistical model for forecasting	20
3.3.1 Motivation	21
3.3.2 Open Questions	21
3.3.3 Method	21

3.4	Task 4: Local geostatistical model for forecasting	22
3.4.1	Motivation	22
3.4.2	Open Questions	22
3.4.3	Method	23
3.5	Task 5: Assimilation of 1D ecological models and comparison to sta- tistical models	23
3.5.1	Motivation	23
3.5.2	Open Questions	24
3.5.3	Method	24
3.5.4	Expected Outcomes	24
3.6	Task 6: Improving an Ecological Model Data Assimilation Scheme through Statistical Predictive Models	25
3.7	Motivation	25
3.7.1	Open Questions	25
3.7.2	Method	26
3.7.3	Expected Outcomes	26
4	Miscellaneous	27
4.1	Instructions for Permission Letters	27
4.2	Some important checks	28
5	Creating the List of Abbreviations and List of Symbols	29
5.1	Introduction	29
5.2	How to use the <code>glossaries</code> package	29
5.2.1	Glossary entries	30
5.2.2	Abbreviation (Acronym) entries	32
5.2.3	Symbols entries	32
5.3	Referencing the entries in the text	33
5.4	Printing the lists	33
5.5	Test section	35
5.5.1	General information	35
5.5.2	Some Greek symbols	35
6	Concluding Remarks	36
6.1	Summary	36
6.2	Bibliography (or References or Works Cited)	36
6.3	References	37

6.4	Submission of Thesis	38
6.5	Future Research Work	38
References		39
Appendices		39

LIST OF FIGURES

LIST OF TABLES

Chapter 1

Motivation

1.1 Importance of phytoplankton

Phytoplankton are unicellular, photosynthetic algae that live in the upper layers of bodies of water (ocean, lakes, rivers or ponds). There are three main types of phytoplankton species: diatom (5-200 μ m), dinoflagellates (5-200 μ m) and cyanobacteria ($>5\mu$ m). Diatoms and dinoflagellates are found in nutrient rich environments and multiply rapidly when conditions are favorable. On the other hand, cyanobacteria are capable of surviving in very oligotrophic (nutrient poor) environments like the Red Sea. In the oceans, phytoplankton live in the surface layer where there is enough sunlight for photosynthesis.

Phytoplankton plays a fundamental role for the ocean ecology as it is at the basis of the marine food web. Zooplankton graze phytoplankton which are consumed by larger species. Higher concentrations of phytoplankton will therefore result in larger stock of predator fishes. High phytoplankton concentration also impacts their environment by creating dead zones when they die and are decomposed by bacteria. Due to the rapid growth of phytoplankton, it responds very well to changes in its environment, making it a key parameter to monitor the water quality.

Due to phytoplankton place at the bottom of the marine food chain, it is a key factor for fisheries and the marine ecology. Productive fishing zones like the regions in the Arabian seas, Californian coast, north-west African coast and Chilean coast are explained by the upwelling of cold nutrient rich water favourable to phytoplankton, which in turn feeds higher trophic levels. On the other hand, during the El-Nino phenomenon creates less favourable conditions for phytoplankton in the Eastern Pacific, resulting in a dramatic reduction of fish catches of fisheries in the western coast of South America.

Phytoplankton also plays the role of a biological CO₂ pump and strongly impact the Earth climate. During photosynthesis, phytoplankton captures carbon and releases oxygen. A part of this organic material stays in the food web, either transmitted to higher trophic level, or degraded by bacteria. Another part however sinks to the bottom of the ocean and sediments. Research is currently done to evaluate the way this biological pump works and how it affects climate.

1.2 Measuring Chlorophyll Concentration

Chlorophyll is a molecule that is food in algae, phytoplankton and plants that is critical for photosynthesis. Phytoplankton is a poor absorber of green light, and is responsible for the coloration of plants. When phytoplankton are present in high concentrations they change the water also takes a detectable green coloration (it can also take a red or blue coloration depending on the type of phytoplankton dominating). This offers a way to estimate the chlorophyll concentration of the water, which is a good proxy for phytoplankton concentration.

In-situ measurements of chlorophyll are however expensive and have limited temporal and spatial coverage. In-situ measurement of chlorophyll concentration can be

gathered through scientific cruises, buoy stations or gliders (unmanned submarines). These methods are expensive to deploy and therefore the coverage is limited. Political issues, like in the Red Sea, can also be a practical barrier to in-situ measurements.

Satellite measurements of chlorophyll provide excellent proxies for phytoplankton concentrations with a good temporal and spatial coverage. The SeaWiFS, MODIS and MERIS missions have provided an uninterrupted coverage of the world since 1997. High-resolution maps of daily chlorophyll concentration are freely accessible to the scientific community. Despite some limitations, in particular of missing data due to cloud coverage and sunglint, or problematic values in coastal areas, remotely-sensed chlorophyll concentration are used intensively by the scientific community. In regions, like in the Red Sea, where little in-situ measurements are available, it is often the most important data source.

1.3 Primary productivity in the Red Sea

Typical tropical seas (TTS), like the Red Sea, are characterized by a highly stratified structure, where warm nutrient-depleted surface water is separated by cold nutrient-rich by a steep gradient of temperature zone called pycnocline. The pycnocline acts as barrier that prevents nutrients to reach the surface water. As a result, TTS are oligotrophic and have low chlorophyll concentrations. Until recently, marine biologists have thought that TTS had therefore a very low productivity. However, recent investigations have contested this idea, that different upwelling mechanisms exist that bring new nutrients to the surface water.

Despite being an oligotrophic and challenging environments for marine life, the Red Sea presents a surprisingly rich and diverse ecosystem. Most of it lives in the very developed coral reef system. The source of nutrient for sustaining such a developed

ecosystem is not well understood yet, but the interaction with the open sea through the mesoscale eddies is believed to play an important role.

Remotely-sensed chlorophyll data show an important seasonality of the Red Sea primary productivity, that has been linked to winter deep mixing, and the inversion of the wind direction in the southern Red Sea, enhancing intrusion of nutrient rich Gulf of Aden water. Despite this strong seasonality, there is a large interannual variability caused by the unpredictable occurrence of large phytoplanktonic blooms. Diverse causes have been hypothesized for these blooms such as wind-induced mixing, eddies or dust storms carrying nutrients.

Although the Red Sea environment is relatively preserved, it is under increasing pressure due to human activities. An abrupt increase of temperature has occurred in the last decade that threatens the fragile coral reef system. Moreover, the increasing urbanization and fishing activity contribute to the fragilization of this unique ecosystem.

1.4 Chlorophyll Concentration Prediction

Models can be useful to identify causes behind the chlorophyll patterns we observe in the Red Sea. Many hypotheses have been made about the drivers of chlorophyll concentration in this region, but some of them have not been yet investigated through models. The role played by the exchange of water with the Gulf of Aden and winter overturning in the northern Red Sea have been successfully modeled with circulation and ecological models. However, the interaction between the open sea and coral reefs and the role of sand storms has not been investigated yet. Models, can also be helpful in discovering new dynamics affecting the chlorophyll concentration. In particular, the interaction between the productivity level of the different regions of the Red Sea

has not been studied yet.

Model predictions for chlorophyll concentration can also have practical applications. Phytoplankton blooms can be harmful to humans and marine life and are closely monitored in many regions of the world. In the Red Sea, where tourism and aquaculture are developing it is likely to become a concern too. Phytoplankton is also directly, and indirectly through zooplankton, the cause of microfouling that affects desalination plants. Anticipating a phytoplanktonic bloom might therefore be helpful in taking preventive actions. Finally, due to their short life-cycle, phytoplankton concentration reacts quickly to changes the environment, making it a key variable in water quality monitoring.

1.5 Modeling Chlorophyll Concentration

Ecological ordinary differential equation (ODE) deterministic models are a popular way to model marine ecology. Such models can be as simple as the nutrient-phytoplankton-zooplankton (NPZ) model that only has three variables representing two trophic level, or as complex as the European regional seas ecosystem model (ERSEM) that has dozens of variables and represent many ecological, biological and chemical interactions. Such a model has been couple to the MITgcm circulation model used to simulate the Red Sea ecology. However the complexity of these models makes them difficult to deploy and interpret their results.

On the other hand, data-driven statistical models are relatively easier to apply. They are relevant when the phenomenon producing the data is very complex or poorly known. They have been applied to predict chlorophyll concentration, mostly in small regions that have complex dynamics. Some statistical models, such as linear regression, GAM or tree regression have the advantage of being easy to interpret, and can

be used to understand the dynamics driving the chlorophyll concentration.

Phenomena such as propagation and diffusion play a key role in the chlorophyll spatial concentration, but are difficult to represent without spatial modeling. There is also a difference in the chlorophyll patterns of different regions of the Red Sea, in particular between the nutrient rich southern Red Sea and the oligotrophic northern Red Sea, and between the open ocean and the coastal waters. There is however no clear cut division between regions with different pattern, making it difficult to divide the Red Sea into regions. Finally the different regions of the Red Sea are believed to interact. A model is therefore needed to account for the spatial and temporal interaction of the chlorophyll.

Classical geostatistics is the most widely used spatial statistical models. It models spatial data as the realization of a two dimensional Gaussian process, of which one can estimate the parameters. Geostatistics can be easily extended to spatio-temporal datasets. Many flexible ways of constructing space-time covariance functions for these models have been proposed recently. Space-time geostatistics has been applied to many environment studies, but not to chlorophyll data yet.

Chapter 2

Objectives

The goal of the dissertation is to show that statistical predictive models can be used to help efficiently forecasting chlorophyll concentration in the Red Sea. Statistical methods can be more robust and computationally efficient when the underlying dynamics are very complex and observations are limited. The study of chlorophyll concentration is such a case. The dissertation will compare the 8-days prediction skill of increasingly sophisticated predictive models to the highly sophisticated ecological model ERSEM. We will explore the possibilities of combining statistical and deterministic models to improve the chlorophyll forecasts.

Efficient statistical models may be used as alternatives to the much more complex deterministic models in other seas. They can help researchers to gain insight into the dynamics of the phytoplankton. They can also help coastal communities to mitigate the effects of harmful phytoplankton blooms on public health and their economy. Moreover this study will help confirming hypothesizes that have been made about the interaction of Red Sea phytoplankton with the regional and global circulation.

Chapter 3

Plan

3.1 Task 1: Dataset building and Exploration

Duration: 2 months (by December 2014)

Submission: Journal of Marine Systems

Collaborator: Dionysios Raitsos

3.1.1 Motivation

A preliminary task to data modeling, is the gathering, cleaning and exploration of the data. Given the complexity and the size (40 GB) of the data, this is not an easy task. This first data analysis, will reveal if enough data has been gathered to make meaningful forecast, and what accuracy we can expect from the models. This step will also provide information that will help in designing statistical models: most significant variables, differences between regions, relevant data transformation, etc. Finally, this step will identify patterns in the data that will be useful to qualitatively evaluate predictive models.

3.1.2 Open Questions

- Can we efficiently identify outliers in the chlorophyll values?
- Is there a way to efficiently fill the missing values in the chlorophyll dataset?
- Can the data help understanding the mechanisms behind extreme blooms in the Red Sea?
- Can the hypothesizes about the dynamics behind the chlorophyll seasonal cycle be confirmed by the data?
- Are there more blooms in the past years?

3.1.3 Method and Work Done

- Identify data sources and load the data60
- Clean the data and fill missing values (DINEOF).....50
- Align and format the data in order to have a unique dataset...0
- Explore the dataset..20
- Study the correlation between chlorophyll and other variables (Linear Regression, GAM, data transformations)
- Select variables (Lasso, single variable regression, multistep regression)
- Study the regional aggregation (ACF)
- Explore spatiotemporal correlations (hovmoller plots, PCA, variograms)
- Estimate the Bayes factor/

3.1.4 Expected Outcomes

- A cleaned dataset that can be used in the following tasks
- A comprehensive exploration of the available data for chlorophyll study in the Red Sea
- A preliminary variable selection
- A clear picture of the major spatio-temporal patterns in the data
- A critical evaluation of the current hypothesis about the chlorophyll dynamics in the Red Sea

3.2 Task 2: Forecasting Chlorophyll Concentration in Regional Aggregates

Duration: 2 months (by February 2015)

Submission: Progress in Oceanography

Collaborator: Dionysios Raitsos

3.2.1 Motivation

Chlorophyll data is very complex. It is therefore useful to first simplify it by aggregating it spatially. The space-time dynamics of the chlorophyll data reflects the highly nonlinear dynamics of the underlying physical, chemical and biological phenomena. As shown by the north-south gradient and the seasonal behavior, the resulting space-time process is nonstationary in time and in space. The high-dimensionality in space can be reduced by considering a regional aggregation of the results. This would allow us to focus on the global scale phenomena: such as the interactions between

neighboring regions, the time-scale of large events and the difference in the physical variables affecting the chlorophyll concentration in each region. In the following tasks, these simple predictive models will also be a reference for evaluating more complex ones.

3.2.2 Open Questions

- Is the biological aggregation of the Red Sea proposed by (Raitso 2013) statistically meaningful?
- Can clustering methods be used to identify marine ecological zones based on chlorophyll data?
- Can a simple forecasting model allow us to understand the causes of chlorophyll blooms?
- Can the current hypotheses about the seasonal chlorophyll dynamics be validated?

3.2.3 Method

Define datasets (training and test datasets, cross-validation).....0Variable selection (Lasso, L1 regression, single-variable linear regression).....0Define regional aggregations (unsupervised learning, Hierarchical clustering, K-means).....0chlorophyll concentration (linear regression, GAM models, diagnostic, k-nearest neighbors).....0Predicting future extreme blooms (nearest-neighbours, logistic regression, decision trees).....0

3.2.4 Expected Outcomes

A regional division of the Red Sea that has been quantitatively evaluated. A critic of current hypothesis about the chlorophyll dynamics in the Red Sea. A lower bound on the performance of a more sophisticated model. An assessment of the limitation of aggregate methods for Chlorophyll data. An understanding on how the treatment of spatial correlations can improve the results.

3.3 Task 3: Global geostatistical model for forecasting

Duration: 1 month (by March 2015)

Submission: Spatial Statistics

3.3.1 Motivation

Geostatistical methods can be used to construct dynamical models for forecasting the chlorophyll concentrations that we can compare to deterministic models. Geostatistics is a robust method to model spatio-temporal data. Recently there has been a lot of research on expanding it to model spatio-temporal data. With Kriging, these models are powerful ways to do spatio-temporal prediction. As a particular case of Kriging, by predicting the spatial future field given the observation of the present field, we can derive a linear dynamical model. This linear model can be employed in a filtering setting like the Kalman filter. This is a desirable setup, as it is similar to the way deterministic models are employed to do forecasts given past observations.

3.3.2 Open Questions

- Can a global geostatistical model fit chlorophyll data?
- How non stationary is the data in time and space?
- What spatiotemporal covariance functions best fit the chlorophyll data?
- Can geostatistical methods be employed in a filtering setup?

3.3.3 Method

This task has already been started and had been the object of a submission for publication. The remaining work includes: Use the new dataset and the new covariates Compare the results to the ones of with the regional aggregates Expected Outcomes A methodology to employ a geostatistical model in a filtering problem. A characterization of the space-time non stationarity of the data, and the interaction of the temporal and spatial dimensions. An understanding of how spatial aggregation and geostatistical models can be used in the same model.

3.4 Task 4: Local geostatistical model for forecasting

Duration: 3 months (by June 2015) Submission: Journal of the American Statistical Association (Case Study) Collaborator: Raphael Huser

3.4.1 Motivation

This part will bring together the results of the two preceding tasks to develop a predictive model that takes into account the large-scale dynamics and the regional

spatio-temporal dynamics. In task 2, a predictive model is built, that represents the large scales behaviour of the Red Sea, but the spatial dimension inside each region is not addressed. We expect local features to play a role, such as the proximity to the coast, the bathymetry, proximity to other regions or major cities, etc. In task 3, we developed a methodology to use a geostatistical model in a dynamic fashion to do pixel-scale forecast. In this task, each regions will be modeled separately by a local geostatistical model that can do local prediction. These models will have access to aggregate covariates from neighboring regions in represent the global scale behaviours.

3.4.2 Open Questions

What are the most adapted space-time covariance models for chlorophyll data? How to use global covariates in a geostatistical model? What are the differences in the fine-scale dynamics of chlorophyll in each region? Can the fine scale behaviour of phytoplankton be predicted accurately? What are the spatial features that are important for the chlorophyll dynamics?

3.4.3 Method

Extract local dataset from previous tasks Design the training and test datasets, and the cross-validation method Design and evaluate the mean function given the past covariates Fit the local geostatistical model to the residuals. Evaluate the model predictions and compare the results with task 2 and 3. Expected Outcomes A methodology to aggregate local geostatistical models An improvements in the prediction skills over the models of task 2 and 3. An understanding of the differences between each regions. A critical evaluation of the space-time covariance models for fitting chlorophyll data.

A better characterization of the regional chlorophyll dynamics.

3.5 Task 5: Assimilation of 1D ecological models and comparison to statistical models

Duration: 3 months (by September 2015)

Submission: Journal of Geophysical Research

Collaborator: George Triantafyllou / Boujeema

3.5.1 Motivation

The three previous tasks focus on constructing increasingly sophisticated predictive models for the chlorophyll concentration in the Red Sea. In this part these models will be compared to a 1D ecological model (ERSEM). This model is well detailed and very complex. The goal of this part will be to identify the merits of each modeling approach, and propose ways in which they can complement each other. To allow for comparison, the model will be run in each of the regions found in task 2. Available data will also be assimilated to the model through a smoothing assimilation scheme that will use an expectation-maximization algorithm for parameters estimation.

3.5.2 Open Questions

Are statistical methods competitive for forecasting chlorophyll concentrations? How can statistical and deterministic models complements each other? Can statistical method forecast interesting dynamical features? Are there significant regional differences in the relative performances of both approaches? How to estimate the parameters of ecological models?

3.5.3 Method

Define the metrics for comparison Calibrate the ERSEM model on each of the regions
 Define an assimilation scheme and the data for the ERSEM model Implement the
 assimilation scheme Run the simulation and aggregate the results Do the comparisons
 with the statistical models

3.5.4 Expected Outcomes

A complete set of measures of the prediction skills of each approach. A method to
 estimate assimilation and model parameters in an assimilated ecological model. A
 set of case studies of the behaviours of each method for forecasting interesting events.
 An understanding of the limitations of geostatistical models to predict nonlinear
 dynamics. Propositions on how the two approaches can complement each other.

3.6 Task 6: Improving an Ecological Model Data Assimilation Scheme through Statistical Pre- dictive Models

Duration: 3 months (by September 2015)

Submission: Journal of Geophysical Research

Collaborator: George Triantafyllou / Boujeema

3.7 Motivation

In the previous task, we compared the forecasts of the ecological ERSEM model to
 that of the statistical models we developed from tasks 2 to 4. In this task we will

study how these two approaches can be complementary. Specifically, we will study the use of statistical forecasts model to improve the forecasts of the ERSEM ecological model. The forecasts of the statistical models will be treated as observations, that can be assimilated by the filtering scheme used with the ERSEM model, and will give an improved forecast. When real observations will be available, they will be assimilated sequentially. This, method will allow the different ERSEM models on each cluster to communicate indirectly their states to one another.

3.7.1 Open Questions

Can statistical predictive models be used to communicate information between deterministic model? Would the access to information about other regions improve the model forecasts? What are the global patterns of ecological dynamics in the Red Sea?

3.7.2 Method

Define new assimilation scheme Define metrics to measure model improvement Prepare training and test datasets Train statistical model Run simulation with assimilation of statistical observation Compare with results of task 5

3.7.3 Expected Outcomes

An improvement in the prediction skills of the deterministic approach A methodology to couple deterministic ecological models through statistical models Insights on the global ecological dynamics of the Red Sea

Chapter 4

Miscellaneous

4.1 Instructions for Permission Letters

- Include your return address, telephone number and email address, and date the top of the letter.
- Confirm the exact name and address of the addressee. Call the person to confirm the copyright ownership.
- State clearly the name of your university and your thesis title.
- Describe precisely the proposed use of the copyrighted material. If necessary or appropriate attach a copy of the quotations, diagrams, pictures, and other materials. If the proposed use is extensive, such as the general use of an archival or manuscript collection, describe it in broad and sweeping terms. Your objectives are to eliminate any ambiguities and to be sure the permission encompasses the full scope of your needs.
- The sample signature form at the end of the sample letter is appropriate when an individual grants the permission. When a company, such as a publishing house, is granting permission, use the following signature form.

4.2 Some important checks

- Appendices can be referred/cited as Appendix B.
- Equations can be referred using 'eqref' command.
- Bibliography can have different types of references such as conference proceedings [?], journal articles [?], books [?], miscellaneous references including web links etc. [?], and theses/dissertations [?] among others.

Chapter 5

Creating the List of Abbreviations and List of Symbols

5.1 Introduction

The most versatile package to create the List of Abbreviations (LoA) and List of Symbols (LoS) is currently the `glossaries` package. With the `glossaries` package, one can create those and even more lists all in the same document. Every list is sorted alphabetically and can even have the page numbers where the entries appear (if that's desired) just like an “Index of terms” list.

In the following there is a description on how to use the `glossaries` package. The material is taken from the documentation of the package and some other examples that can be found online.

5.2 How to use the `glossaries` package

The `glossaries` package works more or less like the `Makeindex`. In fact one needs to use the `makeindex` command to actually create the lists (see §5.4). The main difference is that when creating an index, one only has to define the index terms in

the text, using an `\index{term}` command. On the other hand, in order to create the LoA and LoS one needs to define those entries and use a `\gls{term}` or similar command to reference them in the text.

The definition of those entries must be in the preamble right after the definition of all the lists and the `\makeglossaries` command. It is probably a good idea to have them in a separate file, which you include (as is done in the example `Thesis.tex` with the `\include{Lists}` command).

The general format for entries is

```
\newglossaryentry{label}{definition}
```

The first argument (*label*) is a label that *uniquely* identifies this entry. The second argument (*definition*) is a comma-separated list of **key=value** pairs. For example

```
,
\newglossaryentry{datacomp}{name=data compression, description=
the process of encoding information using less bits than the
original representation uses}
```

In this example there are two keys, namely the **name** and the **description**. The key **name** has the value “data compression” and the key **description** has the value “the process... uses”. The **glossaries** package understands that a key value ends when it encounters a comma and treats the next word as a key. The value of the key **name** is what will appear in the text when referenced by a `\gls{datacomp}` command. The value of the key **description** is what will appear in the default Glossary (or any other) list.

5.2.1 Glossary entries

Some more examples of glossary or symbols entries are given below.

```
,
\newglossaryentry{elite}{name={\'e}lite, description=select
group or class, sort=elite}
```

In this example notice the use of `{\'e}` notation to produce the accented letter é. Because `makeindex` will not know how to sort this alphabetically (`makeindex` is hardcoded for english), it is a good idea to use the key `sort` to specify how we want this entry to be sorted. In this example the entry “élite” will be treated as if it were “elite”.

```
,
\newglossaryentry{pi}{name={\ensuremath{\pi}}, sort=pi,
description={ratio of circumference of circle to its diameter}}
```

In this example the entry is π . Notice the `\ensuremath{}` command which makes sure that the term `\pi` is indeed in math mode (if it isn’t then it prepends and appends the `$` sign) so that LaTeX doesn’t throw an error. Also notice that the curly brackets enclosing the `description` value are not mandatory here but they *should* be used if the description value contains a comma. Otherwise the `glossaries` package will understand that the comma denotes the end of the value and treat the following word as a key.

```
,
\newglossaryentry{ohm}{name=ohm, symbol={\ensuremath{\Omega}},
description=unit of electrical resistance}
```

This example defines an entry for both the Glossary list (due to the key `name`) and the LoS (due to the key `symbol`).

5.2.2 Abbreviation (Acronym) entries

Acronym entries can be defined using `\newglossaryentry` command but there is also a handy shortcut, namely the `\newacronym` command. For example

```
\newglossaryentry{led}{name=LED, description={light-emitting
diode}, first{light-emitting diode (LED)}}
```

is equivalent to the much shorter

```
\newacronym{led}{LED}{light-emitting diode}
```

Note that the first time the entry `led` is found, the `glossaries` package will print the description followed by the acronym in parentheses i.e. “light-emitting diode (LED)” (this is actually what the key `first` is for in the `\newglossaryentry` command).

Also calling `\acrlong{led}` will produce “Light-Emitting Diode” (i.e. the *long* version of the entry —the description) while `\acrshort{led}` will produce “LED” (i.e. the *short* version of the entry —the acronym).

5.2.3 Symbols entries

Entries for the List of Symbols follow the exactly same rule as the glossary entries, with the addition of `type=symbols` in the definition part of the entry. For example

```
\newglossaryentry{pi}{type=symbols, name={\ensuremath{\pi}},
description={ratio of circumference of circle to its diameter},
sort=pi}
```

If the key `type` is omitted, the main glossary (i.e. the Glossary) is assumed.

5.3 Referencing the entries in the text

In order to reference the entry in the text one just has to write `\gls{label}`. For example for the glossary entry `datacomp` defined in §5.2, one just has to write `\gls{datacomp}` which will produce the value of the key `name`, i.e. “data compression”. Note that

- `\Gls{datacomp}` will produce “Data compression” (i.e. the first is capital),
- `\GLS{datacomp}` will produce “DATA COMPRESSION” (i.e. all capital),
- `\glspl{datacomp}` will produce “Data compressions” (i.e. plural),
- `\Glspl{datacomp}` will produce “Data compressions” and
- `\GLSpl{datacomp}` will produce “DATA COMPRESSIONS”.

The plural form is formed by just appending an “s”. If the plural form of an entry is different, one just has to define it in the definition part using the key `plural`. For example

```
\newglossaryentry{bus}{name=data bus, description=a subsystem
that transfers data between computer components, plural=buses}
```

There are quite a few more keys in the documentation of the package that allow even more flexibility.

5.4 Printing the lists

The following piece of code is already in the `Thesis.tex` file. Here is an explanation of what each line does, in case something need to be modified.

```

1 \printglossary[type=\acronymtype,style=long, title=List of
2           Abbreviations, toctitle=List of Abbreviations,
3           nonumberlist=true]
4
5 \printglossary[type=symbols,style=long]
6
7 \printglossary[style=altlist, toctitle=Glossary, nonumberlist=true]

```

Lines 1-2 should appear where you want the List of Abbreviations to appear. They will print the entries and show them in the document’s Table of Contents (ToC). Notice that I had to change the default title “List of Acronyms” to “List of Abbreviations” for both the chapter title and the ToC entry.

Line 4 should appear where you want the List of Symbols to appear. It will print the symbols entries and show them in the document’s ToC.

Lines 6-8 should appear if you would like to have a Glossary (optional). They will print the Glossary entries and show an entry “Glossary” in the document’s ToC. The `nonumberlist=true` suppresses the page numbers in the list.

In order to actually see the lists in your document, you need to run LaTeX once and then run the following commands in the command line (they can also be found in the preamble of the `Thesis.tex` as comments):

```

makeindex -s Thesis.ist -t Thesis.alg -o Thesis.acr Thesis.acn
makeindex -s Thesis.ist -t Thesis.slg -o Thesis.syi Thesis.sbl
makeindex -s Thesis.ist -t Thesis.glg -o Thesis.gls Thesis.glo

```

If your main input file is not `Thesis.tex`, then replace all the occurrences of `Thesis` with that filename. Then run LaTeX once again.

Sometimes (depending on the entries) this procedure has to be repeated once more.

5.5 Test section

In this section there is some text, used to show how the `glossaries` package. See the source file of this chapter and of the Introduction for the exact usage.

5.5.1 General information

Our network uses Active Directory (AD). By using AD with Microsoft (MS) bases clients that have been installed using a response file from Compact Disc (CD), we can expect a high level of standardization.

5.5.2 Some Greek symbols

If you multiply a rational with π you always get an irrational result, because π itself is irrational. As a matter of fact, so are φ and λ , too.

Chapter 6

Concluding Remarks

6.1 Summary

The author must provide an overall summary and discussion of the significance of the work. If the dissertation or thesis consists of relatively independent chapters, a unifying summary should be included at the end or beginning of the dissertation or thesis. Such a summary will be significantly more expansive than the abstract.

6.2 Bibliography (or References or Works Cited)

As a page heading, use "BIBLIOGRAPHY" (or "REFERENCES" or "WORKS CITED") all in capital letters centered on the page. Always start a new page. Bibliographies may be single-spaced within each entry but must include 24 points of space between entries. It is recommended that you follow the standard citation format used by a major journal in your academic field and that the style be consistent throughout the dissertation or thesis.

6.3 References

The precise form of a bibliography or reference section can conform to the style current in the thesis or dissertation writer's discipline, but this form must be employed consistently throughout the thesis. All material already published must be reformat-
ted into the guidelines specified here and pagination and bibliographic style should be consistent with the remainder of the document. For MS Word users, the EndNote citation management software can be utilized as a referencing tool. It is available for download by KAUST students via the KAUST Library website.

A variety of helpful guides to bibliographic style in various fields are available from KAUST Library, including:

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- The Chicago Manual of Style. 16th ed. Chicago, IL: University of Chicago Press, 2010.
- A Manual for Writers of Research Papers, Theses, and Dissertations. Kate L. Turabian. 7th ed. / Chicago, IL: University of Chicago Press, 2007.
- MLA Style Manual and Guide to Scholarly Publishing. 3rd ed. New York: Modern Language Association of America, 2008.
- Scientific Style and Format: The CSE Manual for Authors, Editors, and Publishers. 7th ed. Council of Science Editors, 2006.
- United States Government Printing Office Style Manual. 30th ed. Washington, D.C.: U.S.G.P.O., 2008. (Also online: <http://www.gpoaccess.gov/stylemanual/>)

browse.html)

- In addition, many technical journals publish appropriate style rules.
- For more resources on scholarly writing, visit the Library's theses and dissertations webpages at <http://libguides.kaust.edu.sa/theses>.

6.4 Submission of Thesis

As soon as you have received approval of your thesis or dissertation, you must submit the full final approved document to the KAUST digital archive in the library. You may not submit a draft or partial document. Please follow these submission instructions:

Convert your file to a PDF. Please name the PDF with your first and last name (e.g., RashedAlzahraniThesis.pdf). Be sure this is the full, final copy that your committee has approved. Submit the PDF according to instructions on the library's theses and dissertations webpages at <http://libguides.kaust.edu.sa/theses>.

The submission of dissertations or theses to the library is determined by the library's policies and guidelines. For more information on the online status of your document or policies and guidelines please contact library personnel.

6.5 Future Research Work

The work presented in this thesis can be extended in the following directions.

List of your planned future work goes here.

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.