# Course Summary Protein Prediction I

Summer Term 2017

Based on the course 'Protein Prediction I for Computer Scientists (IN2322)' by the Chair of Bioinformatics, Technical University of Munich.

**Disclaimer**: This is an unofficial summary without any guarantee for correctness. It was created by students to improve their understanding of the subject and aid the learning process.

It should not in anyway serve as a replacement for visiting the lectures. Prof. Rost really makes it worthwhile to sit in his lectures, so go there.

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### **Protein Prediction I**

### **Course Summary, Summer Term 2017**

**tl;dr:** This purpose of this document to collaborativeley create a both concise and detailed course summary of the *Protein Prediction I* Lecture from 2017 Summer Term at TUM.

To learn as effective as possible, I would like to encourage everyone to engage in the discussion evolving around the content of this document. If you have questions or challenge what someone else wrote please do so in a **constructive way**. We are all new to the subject of Protein Prediction and mistakes happen. Let's learn from them together!

### Official Lecture Resources

Lecture Homepage: https://www.rostlab.org/teaching/ss17/pp1cs

Lecture Wiki: https://i12r-studfilesrv.informatik.tu-muenchen.de/sose17/pp4cs1/index.php/Main Page

Youtube Channel: https://www.youtube.com/channel/UCU6j8BG4RbEtTgylZJ6Vpow

### **Getting Started**

This document is set up a **Gitbook** and hosted on **Github**. When you read this, you were already granted access to the repository so the first step is done.

The easist way to start contributing is to download **Gitbook Editor** (available for Mac, Linux, Windows) from here.

Before you add / change anything, please read through the Contribution Guide.

### **Contribution Guide**

Tell others what you work on | Write meaningful commit messages | Push often | Use American English

Why is there a contribution guide? I think it is in everyone's best interest to keep this summary as easy to understand as possible for everyone. This guideline should help to maintain consistency across the entire document.

Each section may contain a short additional information on how to format things specific to that section. Please have a look there as well.

### 1. Adding new content

### 1.1 Adding minor updates

If you add minor updates, like the answer to a single question, you can do this on the develop branch directly. Make sure your commit has a meaningful message.

### 1.2 Adding major updates

If you add major updates, like several related changes (e.g. an entire lecture summary), go along as follows:

- 1. Add a new **issue** on Github, describing what you are working on
- 2. Create a feature/<issue-name> branch and add your changes
- 3. Open a pull-request to merge back into develop and add the other contributers as reviewers
- 4. Once the pull request is merged, delete your feature branch and close the issue by referencing the merge commit

Why so complicated? This way the issues reflect new changes and are transparent for all contributors.

### 2. Challenging existing content

If you find obvious mistakes (typos, clearly wrong statements) just change them directly.

If you are challenging statements, answers to questions etc. which might not be trivial to understand go along as follows:

- 1. Open a new **issue** on github.
- 2. Reference the the statement in question you consider to be wrong
- 3. Provide an explanation why you think it is wrong
- 4. Provide your correct solution.

### 3. Adding new contributors

The purpose of this document is to foster collaborative learning - hence to make this as inclusive as possible. This being said, too many collaborators would probably lead to chaos . If you know other students personally, you want to add to the project shoot me a message and we will figure it out.

#

# 1. Lectures

### 1.1 Introduction: Bioinformatics

02.05.2017 | Slides | Lecture Recording

### 1. Defintions

**Computational Biology:** Biology Replacing experiments by computers (including neurobiology, image processing)

Bioinformatics: anything that has to do with storing and using the information about bio-sequences

### 2. Biology Introduction

Central to biology is the question: How does life work?

Question: What is common to life?

DNA, Protein, RNA

Question: How many bacteria do we care around?

About 2 kilos. Humans carry around more bacterial DNA than human DNA.

Question: Which elements make up life?

- 65.0 % O, Oxygen
- 18.6 % C, Carbon
- 9.7 % H, Hydrogen
- 3.2 % N, Nitrogen
- 1.8 % Ca, Calcium
- 1.0 % P, Phosphorus

Question: What is life? Can you define it?

Descriptive definitions of life:

- Homeostatis (regulation of internal environment to maintain constant state)
- Organization (Unit: Cells)
- Metabolism
- Growth
- Adaptation
- Response to stimuli
- Reproduction

Question: Are viruses life?

Strictly speaking NO. Viruses on their own cannot replicate and thus are not alive. However, one could say that viruses are alive / represent life once they infected a cell and replicate.

### 2.1 Organisms

### **Different Type of Cells:**

Prokaryotic Cells: Mainly found in bacteria and archaea.

- no nucleus
- usually unicellular
- no cell organells

Eukaryotic Cells: Found in animals and plants

- nucleus
- · usually mulicellular
- · cell organelles

Note: The density within cells can be described as almost solid.

**Note:** Different organisms use the same amino acids for proteins. However, they differ in their codon usage (which RNA triplets are translated into which amino acid).

Questions

Question: What is the smallest building block of life that can replicate?

cells

Question: How many different cells are in a typical human?

200

Question: What are the parts of the cell called?

organelles

Question: Which part of the cell is called the "powerhouse"?

mitochondria

Question: What part of a plant is involved with photosynthesis?

chloroplast

Question: What is mitosis?

cell division

Question: Who first used the term cell?

Robert Hooke

**Question:**How many elements are found in amounts larger than trace amounts (0.01%) in our bodies?

11

Question: When communities of living things interact with non living things they are called ...?

ecosystem

Question: The most common molecule in the human body is ... ?

Water: H\_2O

Question: What do bacteria have in common?

Single Cells

#### 2.2 Genes

Question: What is DNA made out of?

DNA is a linear polymer out of 4 bases / nucleotides. DNA exists in cells mainly as a twostranded structure called the double helix. Each of the bases has a complementary base.

- G: Guanine => Cytosine
- A: Adenine => Thymine
- T: Thymine => Adenine
- C: Cytosine => Guanine

Question: What is RNA made out of?

RNA is a single stranded linear polymer out of 4 bases / nucleotides.

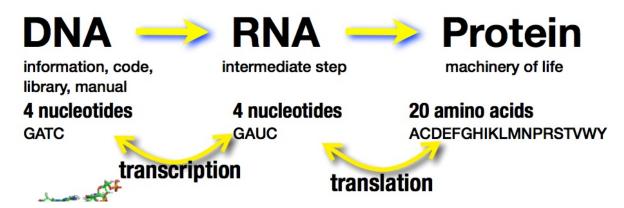
- G: Guanine
- A: Adenine
- U: Uracil
- C: Cytosine

Question: What is a gene?

A gene is a region of DNA, which contains all information for the creation of an entire RNA strand.

### 2.3 Central Dogma

# Central dogma of molecular biology



**DNA:** Stores genetical information in a 4 letter alphabet. Double stranded helix.

**RNA**: Working copy of DNA, needed to produce a protein. (Oversimplification). Single stranded. Different types of RNA.

**Protein:** Composed of 20 letter alphabet (amino acids). Machinery of Life: Proteins do the work in our body.

**Transcription:** Process of turning a part of the DNA (a gene) into RNA.

**Translation:** Process of turning a RNA strand into a protein by a Ribosome. Each amino acid is encoded as a RNA nucleotides triplet.

In rare cases it is also possible that RNA translate to either RNA or DNA

# Note: SEQUENCE leads to STRUCTURE leads to FUNCTION. Always!

### 3. Protein Introduction

Question: How many proteins does a typical human have?

Between 20.000 and 25.000 different kinds of proteins.

Question: What are functions of proteins?

- Defense (e.g. antibodies)
- Structure (e.g. collagen)
- Enzymes (metabolism, catabolism)
- Communication / Signaling (e.g. insulin)
- Ligand binding / Transport (e.g. hemoglobin)
- Storage (e.g. ferritin)

Question: How many residues long are typical proteins?

Between 35 and 30.000 residues. The median is around 400.

### Question: Do proteins consist of units?

Proteins are built up of several domains. Most proteins have more than 2 domains.

### Question: How many proteins are known?

About 85 millions sequences are known. However, the 3D structure (experimentally determined) of only 120.000 proteins is known.

### Question: Is this gap (known sequences vs known 3D structure) expected to increase?

Yes, the gap is expected to increase. The amount of new sequences has increased drastically (far faster than Moore's Law) in the past. This is expected to continue. Advances in experimentally determining protein 3D structure could only improve marginally, but today experimentally determining the 3D structure of a proteins still costs about 100 000 EUR.

# 1.2 Introduction: Structure

# 1.3 Alignments 1

# 1.4 Alignments 2

# 1.3 Comparative Modelling

# **1.6 Secondary Structure Prediction**

??.05.2017 | ??? | ???

# 1.7 Secondary Structure Prediction 2

# **1.8 Secondary Structure Prediction 3**

### 1.9 Membrane Structure Prediction 2

# **1.10 TMSEG**

### 1.11 Beta Membrane and Accessibility

22.06.2017 | Slides | Lecture Recording

### Recap

### Lipid bilayer (membranes)

- hydrophilic outside,
- hydrophobic inside

Normal surroundings of proteins are **solvent** (hydrophilic, water). Generally, the core of a protein is **hydrophobic**.

### **Trans Membrane Helices (TMH)**

- really small fraction of experimentally known proteins (3D structure)
- but 15% to 25% of all proteins
- 60% of drug targets
- only about 2% of all unique structures have membrane helices
- 1D prediction very successful

### **Beta Barrels**

TMB = Trans Membrane Barrel

- "barrels" formed out of β-sheets connected by hydrogen bonds, which go through the membrane
- looking from the tops they have a hole
- they are pores, letting anything pass that is small enough

#### **Beta Barrel Prediction: PROFtmb**

#### Model Design:

- Hidden Markov Model
- structure based labels (states)
  - · inside loop
  - · outside loop
  - strand up
  - strand down

How to assess whether this model makes sense?

 Count the different states in the set of proteins, where you know (from experiments where the barrels are)

- Put the observation into the priors for the HMM (Hidden Markov Model) and train for all the others
- Check the results (per residue) predicted vs observed

Conclusion: Remarkable performance

BUT: Can we distiguish proteins with / without TMB?

#### Challenges:

- Where do barrel domains start / end?
- Sometimes barrels are built out of several peptide chains (proteins)
- Per Protein Performance: Accuracy vs Coverage
  - Where to put the threshold when analysing a new protein?
    - Intuitive / Literature: Intersection of Accuracy and Coverage
    - Optimized per Case: E.g. for Master Thesis high accuracy if more important than coverage, as experimental biologists will follow up on only a few of the found proteins in further research

### Accessibility

What is it about? Why is this relevant?

- · accessibility of residues to water
- · outside vs inside
- 1) Absolute Accessibility: ASA (square Ångstrøm, 1 Å = 0.1 nm)

Long side chains may appear more accessible: Different amino acids have a different length of their side chain and thus the absolute accessibility per amino acid differs.

Using absolute accessibility may lead to wrong conclusions.

2) Relative Accessibility: ASA / max ASA

### 3) "States":

- · buried, exposed
- · buried, intermediate, exposed

Note: It doesn't matter whether something is 80% or 100% exposed, but it does matter whether something is 0% or 20% exposed. Also, drawing the line where to set the "best" threshold between the states is discussed in academia.

RostLab Approach: Square Root -> Switch from percentage to predicting 10 states

### **Solvent Accessibility**

Accessibility helps in predicting protein function.

- sub cellular localization
- protein-protein interactions
- flexibility / motion from structure

Historically: Prediction by hydrophobicity

hydrophobic: insidehydrophilic: outside

PHDacc: Machine Learning Approach

- 10 output units
- Advantage: No need to decide on treshold beforehand. Threshold can be chosen for future needs.
- Advantage: Mapped to a 2 state system (burried / exposed) each prediction also carries the confidence in the prediction

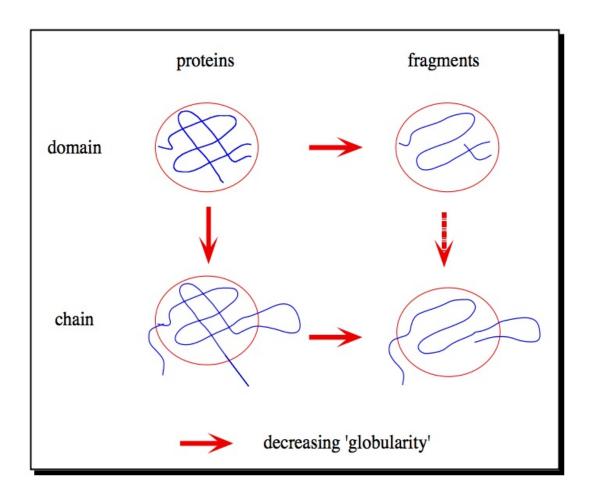
### **Detailed Prediction Problematic:**

**ConSurf:** Significant gain by evolutionary information (in/out with > 75% accuracy)

### More Globular - More likely expressed

Note: I really don't get this slide / content. Anyone an idea, what is meant by that?

- **Domains** are compact structures on their own (= they fold on their own)
- Question: How can we see (by a sequence) what we are related to?( Related to what?)
  - Answer: Predict the residues on the surface. ( Why???)
  - 1) Take a 2 state model (burried / exposed)
  - 2) Predict the residues which are exposed
  - 3) Check to which of these (see image) the sequence fits best
  - Assumption: Protein are spheres. (Which is apparently the case in an overwhelming fraction of proteins)



# 2. Exercises

# 2.1 Introduction

# 2.2 Biological Background

### 2.3 Protein Structure

# 2.4 Alignments

# 2.5 Resources for Bioinformatics

# 2.6 Secondary Structure Prediction

# 2.7 Homology Modeling

# 2.8 Wrap Up

### 3. Exam Questions

This section contains possible exam questions compiled from different sources.

### **Contribution Guide: Exam Questions**

Since all questions here are answered by students, there might be some mistakes in them. Hence a few more words on how to best handle this section.

### 1. Adding a new question

Just add the question in the respective file. Optimally, you can already provide an answer.

### 2. Answering a question

To clearly distinguish questions from answers, please put answers in **blockquotes** right under the respective question.

### Example:

- How can 1D secondary structure information be used to derive a 3D model?
- It is not possible to derive a 3D model from 1D information. (Trick Question)

### 3. Updating an answer

If you think an answer does not properly answer a question (e.g. it is wrong or the answer is not sufficient), mark the answer and open a new **issue** on Github to discuss the question and share your improved answer.

(Use the emoji to mark the possibly wrong answer inline)

### **Example:**

- How can 1D secondary structure information be used to derive a 3D model?
- It is not possible to derive a 3D model from 1D information. (Trick Question)

### 3.1 Lecture Questions

This section contains possible exam questions asked Professor Rost in the lectures he dedicated to answering student questions. They are **highly relevant**, because he will sample exam questions from this pool.

### **Questions (Thursday, 22nd June)**

Question: How can you choose the e-value for PSI-BLAST depending on the size of the dataset?

Question: What is the regular process when you want to analyse a new sequence?

Question: What is a structural domain? What is a functional domain?

- structural domain: part of sequence with unique 3D structure
- functional domain: part of sequence with unique function

### **Questions (Tuesday, 27th June)**

### **Questions (Thursday, 29th June)**

Question: With a matching profile-profile comparison what can you say about the two families?

The assumption is that matching profiles share a similar / same structure and function.

**Question:** When I build a profile of a famliy: Do they share the same structure? Should I verify that they do? How do i do that?

The very assumption is that the proteins of one family share the same structure and function. When iteratively refining the profile with proteins retrieved by *profile-sequence* of \_profile-profile \_comparison (from the twilight- / midnight-zone), it can make sense to double check the new proteins with secondary structure prediction to avoid adding false-positives.

Question: Cross-Validation: What is it? How does it work? Why do we need it?

**Question:** What is the difference between a BLOSUM matrix and a PSSM (Position Specific Substitution Matrix)?

Question: What is the most successful method to predict 3D structure?

**Question:** What is homology modeling (= comparative modeling) and how does it work? What are the limitations of it?

**Question:** How can you predict structure in the [a] daylight- [b] twilight- [c] midnight-zone?**Question:** What is the assumption behind all alignment methods that is incorrect and nevertheless seems to work? Give a method that aligns 2 proteins without that assumption.

The assumption is that the alignment of the residue at position **i** is independent of the **i+1**. (Short alignment i and i+1 are independent).

Method w/o that?

Question: Why do we have so few experimentally confirmed structures in the PDB?

ca. 85 million proteins are known, but only about 120 000 are in the PDB.

Sequencing technology has improved and become a lot cheaper and hence many more proteins were discovered. While there were improvements in 3D structure determination, it still costs at least 100 000 euros to experimentally determine the 3D structure of a protein. It is expected that this divide will further increase.

Question: Why do we need redundancy reduction for machine learning?

The training data for the ML model should be representative for the problem for which it should predict.

**Question:** Say the 3D structure for **N** thousand proteins were known and they serve as input for a method predicting 1D structure. How can you define the value for \_sequence-unique \_that you have to apply to create an unbiased data set? Why do you need an unbiased dataset?

Question: How do you compare proteins of different length?

**Question:** What is the significance in using information from protein families (also inferred as evolutionary information) as input to the ML device predicting 3D structure?

- It is additional information for the ML device, which is clearly relevant for the structure
- the profile is a record with information about the 3D reality of the protein

Question: How can I use 1D information to get a 3D structure? What can you do with a 1D structure?

It is impossible to reconstruct a full 3D structure from 1D information. 1D structure can be used for

optimizing a profile

- predict whether a protein is soluble
- predict whether a protein is a transmembrane protein
- input for further secondary structure prediction

Question: What is a 2D contact map (distance map)? How can it be obtained?

**Question:** Explain the concept between the notation of 1D, 2D, 3D structure. What is in the PDB? What does the DSSP give?

# 3.2 Exercise Questions

This section contains possible exam questions asked and answered as part of the exercises.

### 3.3 Old Questions

This section contains possible exam questions sourced from students of previous Protein Prediction I lectures.

### 3.3.1 Exam Structure: 2016ST

We where able to obtain last years exam structure. Let's try to answer all of the concrete questions :-)

Part 1 is mandatory, for the rest choose 3 out of 4.

### 1. Multiple Choice (5 questions, 10 points)

- Secondary Structure
- RMSD Protein Similarity
- Hydrogen Bonds (α-helix, β-sheets, long/short bonds)
- 100% sequence identity => same structure? (PIDE)
- Can modern prediction methods correctly predict structure in the midnight zone?
- About "Cryo-Microscope"
- About "X-Rays"

### 2. Sequence Alignment (10 points)

- · Explain each of the following alignment techniques and provide one method for each
  - Sequence Sequence
  - · Sequence Profile
  - Profile Profile
- General scoring BLOSUM62 matrix vs. PSSM
- Why is the sequence information valuable?
- How BLAST speed up pairwise alignments?
- Global vs Local alignment

#### 3. Sequence Structure (10 points)

- What data is needed to predict the structure with ML?
- Which tools and db you will use?
- How to prepare data for ML
- Which 2-3 features will help to predict?
- Would you apply method to all protein (query)?
- · Which measure would you use to evaluate your method?

### 4. Protein Structure (10 points)

- Why it is important to know 3D structure?
- Why is it so hard to compare 3D structure?
- Most successful ML algorithm for predicting structure, steps
- Method for experimental structure determination. Short explanation. How many structures are experimentally known?

### 5. Machine Learning (10 points)

- General definition of Machine Learning
- Cross validation
- What is 'feature'?
- ETP explain, example
- Name and describe one ML method
- Name and describe "sequence" in context of PP
- Discuss how to predict Protein Structure from amino-acid sequence using ML
- Q2: which is better, how to prove your's is better, which value you will publish? ( What is Q2)

### 3.3.2 Lecture 1: Introduction Bioinformatics

Question: What is common to life?

DNA, Protein, RNA

Question: How many bacteria do we care around?

About 2 kilos. Humans carry around more bacterial DNA than human DNA.

### Question: Which elements make up life?

- 65.0 % O, Oxygen
- 18.6 % C, Carbon
- 9.7 % H, Hydrogen
- 3.2 % N, Nitrogen
- 1.8 % Ca, Calcium
- 1.0 % P, Phosphorus

### Question: What is life? Can you define it?

There is no holistic definition of life: Descriptive definitions of life are

- Homeostatis (regulation of internal environment to maintain constant state)
- Organization (Unit: Cells)
- Metabolism
- Growth
- Adaptation
- Response to stimuli
- Reproduction

Question: Are viruses life?

Strictly speaking NO. Viruses on their own cannot replicate and thus are not alive. However, one could say that viruses are alive / represent life once they infected a cell and replicate.

Question: What do bacteria have in common?

Single Cells

Question: What are the differences between prokaryotic and eukaryotic cells?

**Prokaryotic Cells:** mainly found in bacteria and archaea, usually unicellular, no nucleus, no cell organelles

**Eukaryotic Cells:** Found in animals and plants, usually multicellular, have nucleus, have cell organelles

Question: How can the density of a cell be described?

The state inside a cell is almost solid. We can think of a cell similar to a Christmas day on Time Square: Everything is densely packed, but there is still movement.

Question: What is the smallest building block of life that can replicate?

cells

Question: How many different cells are in a typical human?

200

Question: What are the parts of the cell called?

organelles

Question: Which part of the cell is called the "powerhouse"?

mitochondria

Question: What part of a plant is involved with photosynthesis?

chloroplast

Question: What is mitosis?

cell division

Question: Who first used the term cell?

Robert Hooke

**Question:**How many elements are found in amounts larger than trace amounts (0.01%) in our bodies?

11

Question: When communities of living things interact with non living things they are called ...?

ecosystem

### Question: The most common molecule in the human body is ... ?

Water: H\_2O

### Question: What do bacteria have in common?

Single Cells

### Question: What is a gene?

A gene is a region of DNA, which contains all information for the creation of an entire RNA strand.

#### Question: What is DNA made out of?

DNA is a linear polymer out of 4 bases / nucleotides. DNA exists in cells mainly as a twostranded structure called the double helix. Each of the bases has a complementary base.

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- T: Thymine => Adenine
- C: Cytosine => Guanine

#### Question: What is RNA made out of?

RNA is a single stranded linear polymer out of 4 bases / nucleotides.

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### Question: Do all organisms use the same amino acids / codons?

Different organisms use the same amino acids for proteins. However, they differ in their codon usage (which RNA triplets are translated into which amino acid).

### Question: How many proteins does a typical human have?

Between 20.000 and 25.000 different kinds of proteins.

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