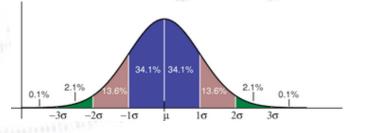
## Applied Statistics Course information 2020-21



Troels C. Petersen (NBI)



"Statistics is merely a quantisation of common sense!"

## **Applied Statistics 2020** ...all the technical stuff!

Technicals:

- Rooms and hours.
- Course structure and dates.
- Computers and software.
- Data sets.
- Literature.
- Curriculum.
- Problem set.
- Projects.
- Exam.
- Expectations.
- Goals.



The course webpage (central source of course information, bookmark or fail!):

http://www.nbi.dk/~petersen/Teaching/AppliedStatistics2020.html

Click on link in PDF, as copying text might not correctly get the "~" character right (especially on Windows!)

### General words on the course

These are extraordinary times, which call for extra-ordinary measures!

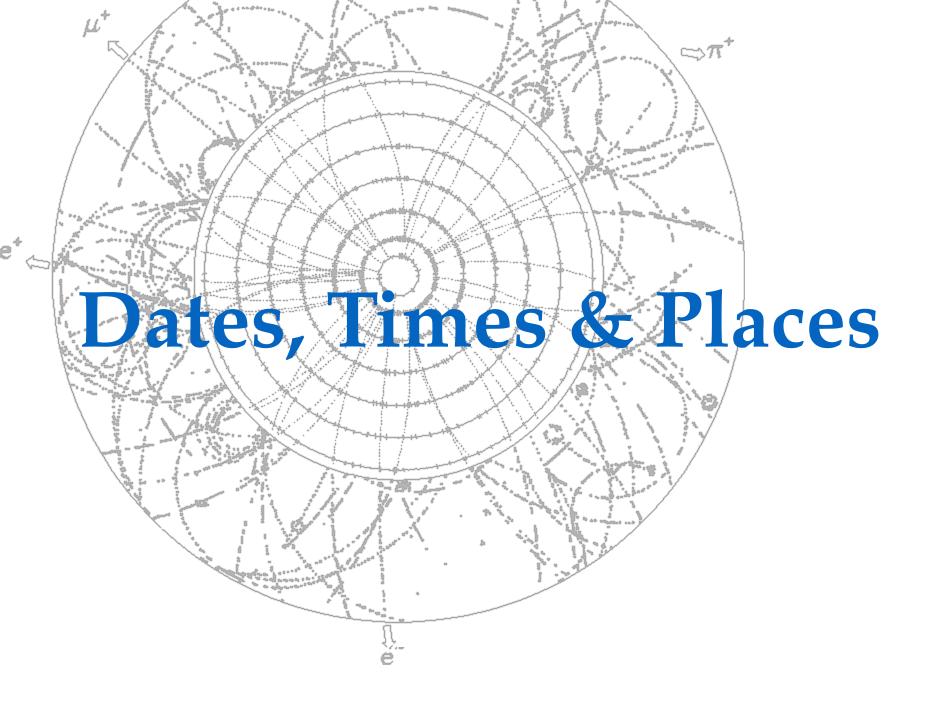
We will run the lectures **online only**, followed by in-person exercises. For those not attending, help/supervision will be available via Zoom, Slack & your favorit communication platform.

This will require both self-disciplin and dedication to the course work.

We will of course do our best to inspire, help, and promote collaboration, but it is up to you (more than normally), how much you want to learn/benefit from this course.

Course work can/should be done in collaboration with fellow students.

So please make small teams of peers, with whom you can discuss the many details of ML coding and the problems, challenges, and issues involved. This is you best way to **interact with peers**, **learning most**, **and not getting stuck**.



#### Lectures

The lectures will be by Zoom only.

This has some advantages:

- I will record the lectures (and chat) and put it on the course webpage.
- You will be able to write questions/comments in the chat during the lectures. You can either write to "everybody" or to the "TA on duty".

I know that Zoom is not the most inspiring source, but I'll do my best to keep the lectures (partially) inspiring and (remotely) entertaining.

### Exercises

Karsbæk Hvidevare Service ApS Ku - Science - Food-Nexs

Shabaz Kaffebar Takeout

enoms Alle

Min fødse

Thorvald sensvej 40

Academic Books Frederiksberg Campus Book store

Le Luma

Københavns Universitet, Frederiksberg Campus

Skolen ved Bülowsvej Dülowsvejhallen

Frederiksberg Volley

SFO Thorvald

Jakobskolen

Avenir Consult ApS

Claus Boberg

Bülowsvej - For Børn og Familier Exercises will be in Frederiksberg Thorvaldsensvei 40

Week 1 (47): Monday: aud - A2-70.04 (72 pers. ) øv - A2-70.02 (72 pers.) øv - A2-70.01 (72 pers.)

Tuesday: aud - A2-70.04 (72 pers. ) øv - A2-70.02 (72 pers.) øv - A2-84.12 (50 pers.)

Friday: aud - A2-84.01 (94 pers.) øv - A2-70.02 (72 pers.) øv - A2-73.02 (12. pers.)

However, we will keep the Zoom line open for students to get online help with the exercises.



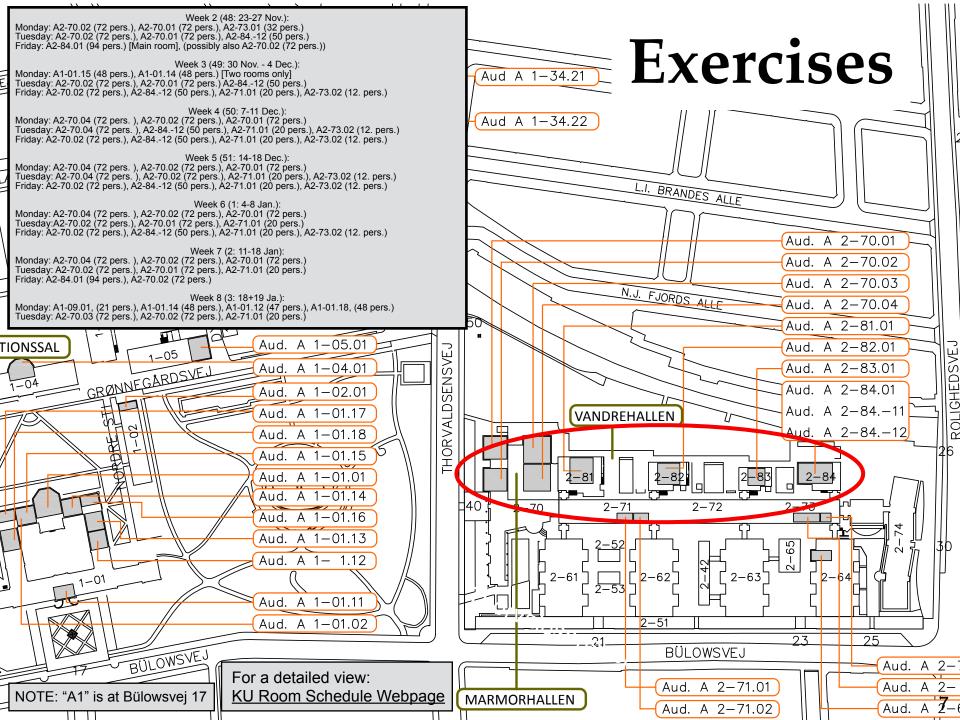
Notice for exercises: The management requires that there is one hour from end of online lectures to start of exercises. While adhering to this, we will not forbid anyone access to the exercise, and attempt ourselves to be there half an hour after lecture ends.

Institut for Planeog Miljøvidenskab Temporarily closed

Landbohøjskolens Have

For a detailed view: <u>KU Room Schedule Webpage</u>

les Alle 8-10



## Additional locations

My office (building M, top floor) **First Lab** For project experiments

170



#### **Entrance to Auditorium A**

For pre-course python help and measurement of lecture table (more information to come).

#### **Course dates & hours**

#### Dates:

Block 2 (schedule B) will in 2020-21 consist of the following weeks:

Week 1: 16.-20. November Week 2: 23.-27. November Week 3: 30. Nov. - 4. Dec. Week 4: 7.-11. December Week 5: 14.-18. December Week 6: 21.-22. December (we will not do anything "crucial" these two days!) Week 7: 4.-8. January Week 8: 11.-15. January Week 9: 18.-19. January Exam: 21st-22nd January

#### Hours:

Following schedule B, but after the first three weeks, we will be using the morning hours 8:15 - 9:00 Monday and Friday for "self-studying".

<u>Monday:</u> 8:15 - 9:45 Lectures 10:15 - 12:00 Exercises

<u>Tuesday:</u> 13:15 - 14:00 Lectures 14:30 - 17:00 Exercises

<u>Friday:</u> 8:15 - 9:45 Lectures 10:15 - 12:00 Exercises

### **Course dates & hours**

<u>Dates:</u> Block 2 (sch consist of th

Week 1: 16.-Week 2: 23.-Week 3: 30. Week 4: 7.-1 Week 5: 14.-Week 6: 21.-(we will no

Week 7: 4.-8. January

Week 8: 11.-15. January

Week 9: 18.-19. January

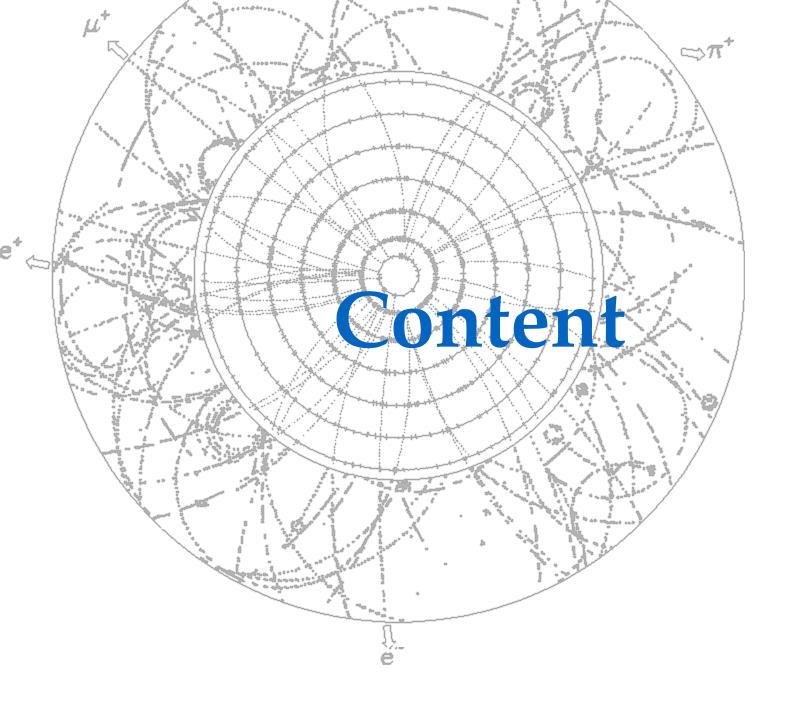
Exam: 21st-22nd January

Just to be clear: The course can be followed FULLY online, and it is perfectly alright to do so.

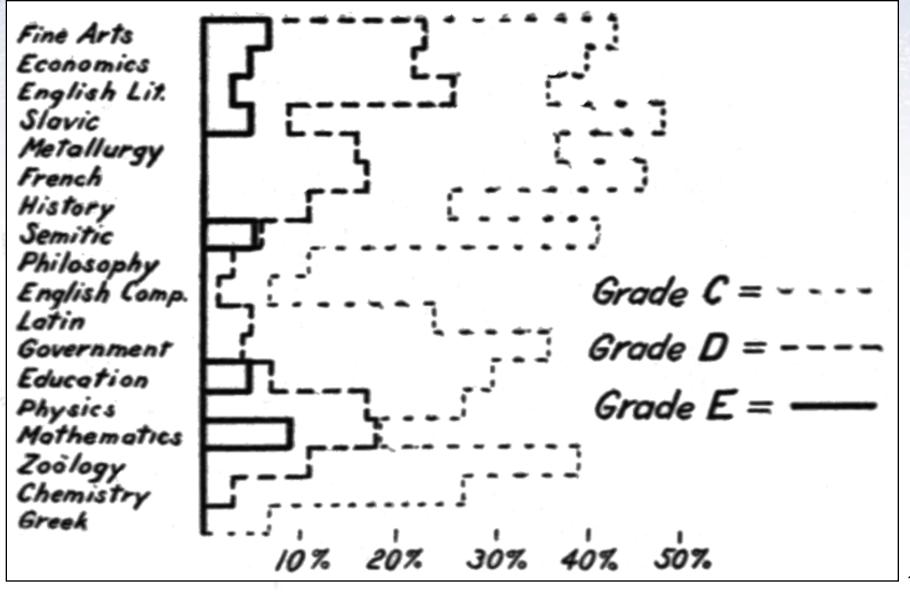
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14:30 - 17:00 Exercises

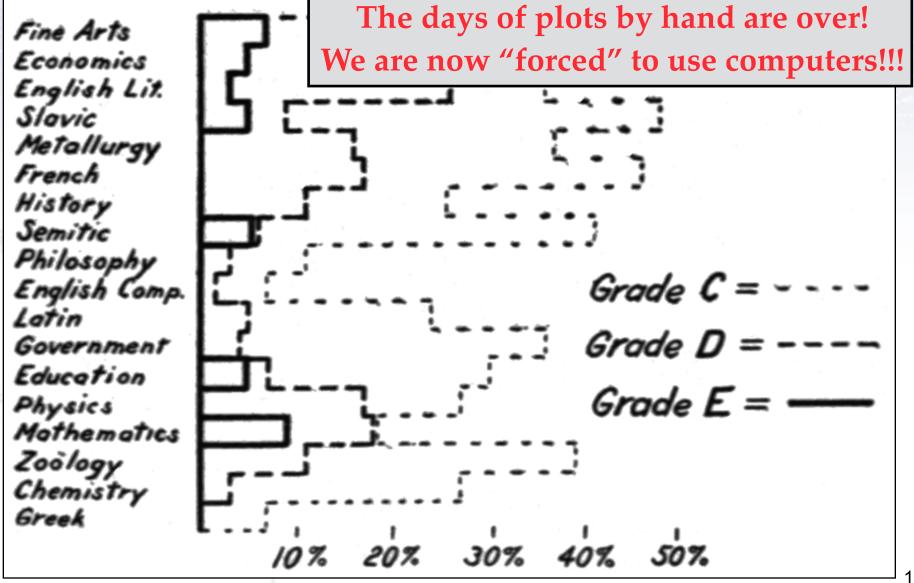
<u>Friday:</u> 8:15 - 9:45 Lectures 10:15 - 12:00 Exercises



#### **Computers and software**



### **Computers and software**



### **Computers and software**

The times are *way past* pencil and/or calculator stage! **Fast computers** is the *only* answer to do (any serious) data analysis.

Operating system: Programming: Editor:

Linux/MAC OS/Windows Python - version 3.8+ Jupyter Notebook (or own favorit!)

#### Python Packages used:

• NumPy, MatPlotLib, Pandas, iMinuit, SciPy, SeaBorn, os, and maybe others. Only iMinuit should possibly be "unknown" to many, but it is easy to install, and essential for fitting.

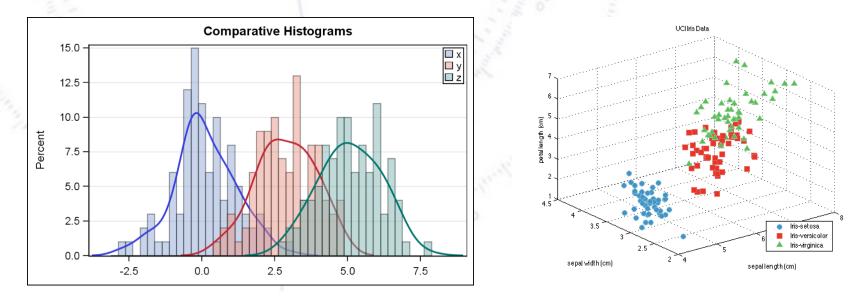
Note: You're not "forced" to use Python, but we will only supply code in Python.

#### Data sets

In general, any data set can be used for this course! If you happen to have an interesting and illustrative one, bring it to me/class!

I've tried my best to search for a large variety of data sets, but this is not always easy. Publicly available data sets are often old/small/biased/etc.

As a result, some data sets are from my own field (particle physics). This is both due to my access to data here, but also because particle physics is one of the fields providing *billions of measurements*.



### Literature

We use Roger J. Barlow's "Statistics", as it is an accessible introduction to statistics with many examples, and the best overall book (I think).

If anything, it is lacking a bit on how to generate random numbers according to a specific PDF and on categorising events.

I might occasionally also refer to:

- Bevington: Data Reduction & Error Analysis
- Cowan: Introduction to Statistics ...and notes from Particle Data Group!

NOTE: There is a great abundance of notes, Wiki, fora, etc. on both statistics but especially also Python on the web, which I encourage you to use (with a proper critical mind).

## Statistics

A Guide to the Use of Statistical Methods in the Physical Sciences

R. J. Barlow



### Literature

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## Statistics

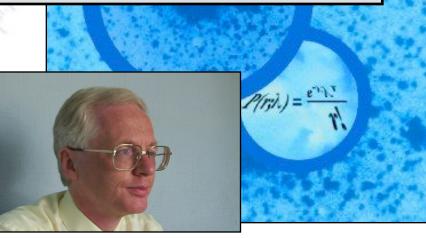
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...and notes from Particle Data Group!

NOTE: There is a great abundance of notes, Wiki, fora, etc. on both statistics but especially also Python on the web, which I encourage you to use (with a proper critical mind).



## **Additional literature**

Two additional great books are:

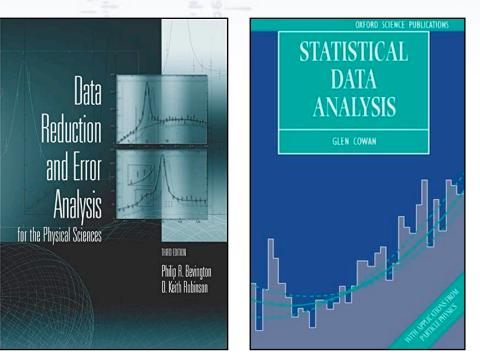
- P. R. Bevington: Data Reduction and Error Analysis
- Glen Cowan: Statistical Data Analysis

**Bevington** is a classic and very good basic introduction. If you don't understand something, try re-reading about it in Bevington.

**Cowan** is more "modern", and for the slightly more advanced reader. Great sections are:

- Producing random numbers
- Hypothesis testing

Links to electron versions of both books can be found on the course webpage.



#### Curriculum

The course will cover the following chapters in R. Barlow:

- Chapter 1 (All)
- Chapter 2 (All)
  - Exercises: All, except 2.5 and 2.9.
- Chapter 3 (Except 3.2.2, 3.3.2, 3.4.2, 3.5.2) Exercises: All, except 3.7.
- Chapter 4 (All)
  - Exercises: All, except 4.10.
- Chapter 5 (Except 5.1.3, 5.3.2, 5.3.3 (formal part), 5.3.4, 5.5) Exercises: 5.2
- Chapter 6 (Except 6.4.1, 6.7) Exercises: All
- Chapter 7 (Except 7.3.1)
  - Exercises: All, except 7.1, 7.3, and 7.7.
- Chapter 8 (Except 8.4.4, 8.4.5, 8.5.1, and 8.5.2) Exercises: All, except 8.6.
- Chapter 10 (All)

### **Core of Curriculum**

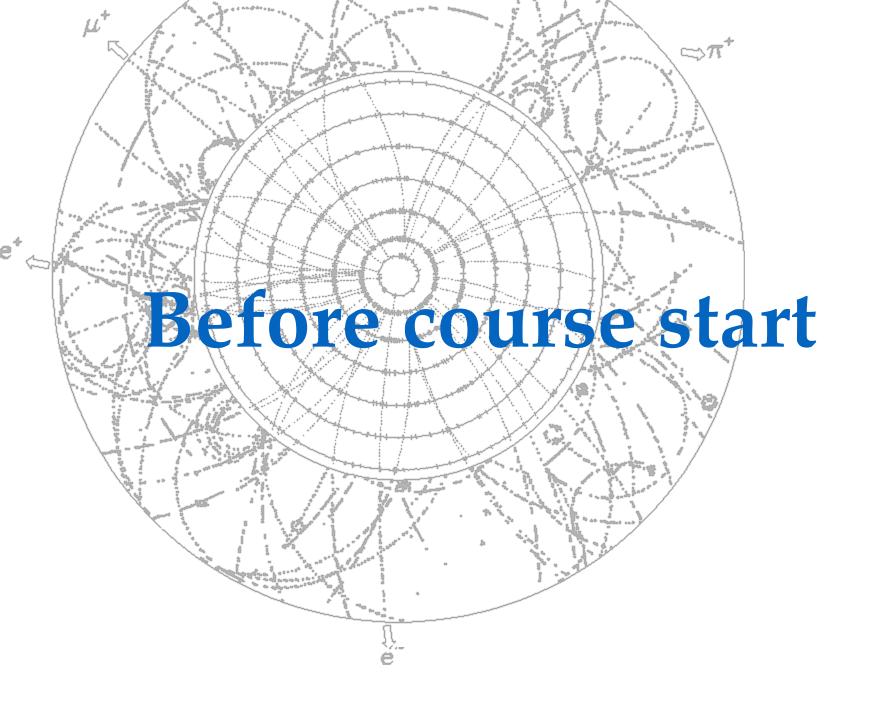
The course will **focus mostly on** the following chapters in R. Barlow:

- Chapter 2: 2.1, 2.2, 2.3, 2.4.1, 2.4.2, 2.6
- Chapter 3: 3.1, 3.2, 3.2.1, 3.3, 3.3.1, 3.4.1, 3.4.7, 3.5.1
- Chapter 4: 4.1, 4.2, 4.3, 4.3.1, 4.3.2, 4.3.3
- Chapter 5: 5.1, 5.1.1, 5.1.2, 5.2, 5.6
- Chapter 6; 6.1, 6.2, 6.2.1, 6.2.2, 6.2.3, 6.2.4, 6.3, 6.4
- Chapter 8: 8.1, 8.2, 8.3, 8.4, 8.4.1, 8.4.2, 8.4.3

This is less than 80 pages, but... they do not only require reading! **They request understanding!!!** 

The plan is to go through most of curriculum in 4-5 weeks, spending the rest of the time on applying it.

It is through application that statistics is really understood.



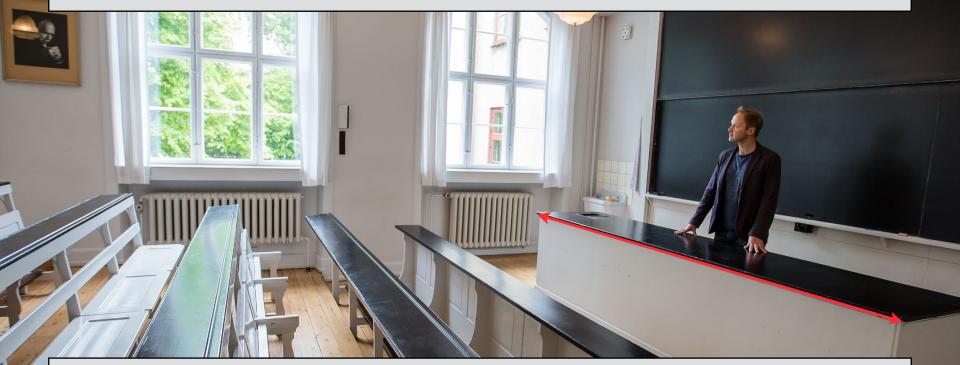
## **Check list**

In order for me to consider you inscribed in this course, you should make sure that you pass the following check list:

- Have read the course information (slides on course webpage). Otherwise, you don't know what is going to happen.
- Have filled in the questionnaire (on course webpage). Otherwise, we don't know what you know and don't know.
- Have measured the length of the lecture table in Auditorium A\*. Otherwise, you haven't contributed to a common course dataset.
- **Be registered on Absalon or accept invitation by me to be so.** Otherwise, you won't get any of the general information I write out.
- **Be able to run Python on ERDA and(/or) on your own laptop**. Otherwise, you can't follow the exercises or solve problems.

\* NOTE: Instructions can be found on the course webpage.

#### NBI AUDITORIUM A: ORIGIN OF QUANTUM MECHANICS ..AND WHERE MOST NOBLE PRIZE WINNERS IN PHYSICS HAVE BEEN.



CHALLENGE (IN LATER EXERCISE): DETERMINE THE LENGTH OF THE LECTURE TABLE WITH A 30CM RULER AND 2M FOLDING RULE ...AND CALCULATE ITS UNCERTAINTY!

### Exactly what to do

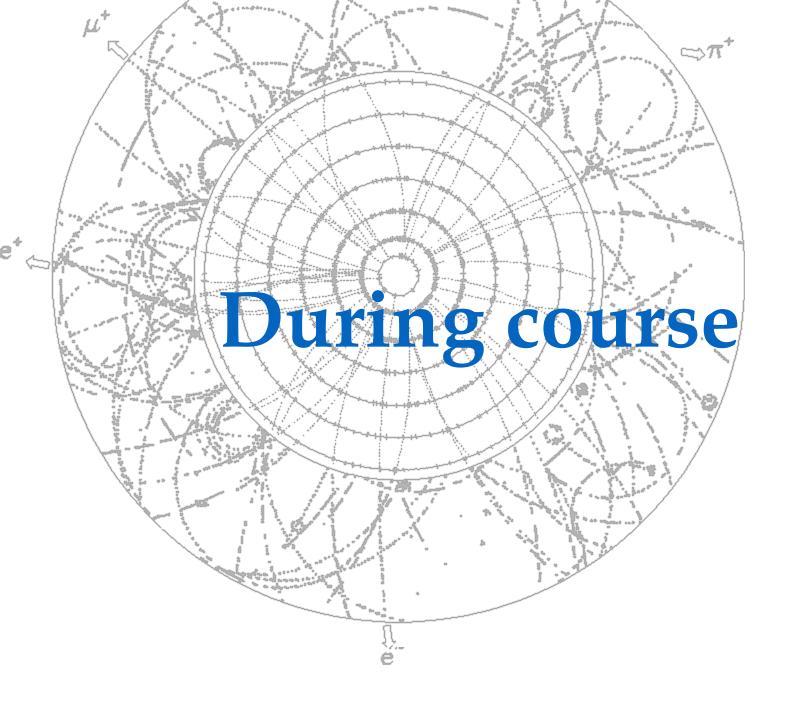
Show up in Auditorium A (NBI, Blegdamsvej 17) at one of the five 1-hours time slots shown on the course webpage\*.

- 1. Say hello to the TA in the Auditorium, and get a slip of paper for the measurements.
- 2. Grab the 30cm ruler and measure the length of the lecturing table. Write down the result to the <u>millimeter</u>. Do not round!
- 3. Think about what uncertainty you (gu)estimate this measurement has, and write that down too.
- 4. Measure the length again, now with the 2m folding rule.
- 5. Again, also write down your estimate of the uncertainty.
- 6. Do all of the above (1-5) within 2 minutes!

#### Do NOT round your result, even if precision might be limited. Do NOT change your results, even if you suspect a mistake.

\*Service: 19th 11:00-12:00, 22nd 15:30-16:30, 26th 11:00-12:00, 29th 11:00-12:00, 29th 15:30-16:30 in October.

24



## Project

In the second / third week of the course you will be working on the data analysis following two (simple?) experiments for about two weeks.

They will be in **First Lab** on (dividing class into two halves, wearing face masks, the other half having lectures and exercises as normally, TBC):

- Friday the 27th of November 8:15-12:00.
- Monday the 30th of November 8:15-12:00.

This is your chance to fully do the statistics behind an experiment and play with real data to gain experience of what planning an experiment and detailed data analysis requires! This *will count 20% in your final grade!!!* 

It will require the use of computers and modifications of some of the code you have been running. You will be working in groups of 4-5 persons, and only one report (2-4 pages) is required from each group.

Real life problems/experiments will resemble this project!



## Project

The project is an attempt at **precision measurement** of the Earth's gravitation locally at NBI, using only "simple" methods (OK - a little bit of cheating there).

You will be doing two separate experiments (both seen before by most):

- Simple pendulum.
- Ball rolling down an incline.

The goal is to **determine g in two ways and propagate the uncertainties** on these measurements. More on that (in time) on the webpages under "project".

Project deadline: One report (in PRL style) per group only is to be handed in by **Sunday the 13th of December 22:00**.

Your group will be paired with another group to give each other feedback. We will of course grade projects internally.

**In case you can't participate in person**, you will be asked to do the pendulum experiment only, but working by yourself.



### **Problem set**

During the course, I will give a larger problem set to be solved and handed in. It is due on Sunday the 3rd of January 2021 by 22:00.

This will cover most of the curriculum covered at this point, and it *will count 20% in your final grade!!!* 

It will require the use of computers and modifications of some of the code you have been running.

You are welcome (even encouraged) to work in groups, but **each student must hand in their own solution**, and you should **state your collaboration**.

The problem set is extensive, so I suggest that you start early.

The final exam will somewhat resemble this problem set!



#### Exam

Exam will be a **36 hour take-home exam** with a set of problems, which resembles the one previously given.

It will cover most of the curriculum, and it *will count 60% in your final grade!!!* 

It will require the use of computers and modifications of some of the code you have been running.

#### You must work on your own!

I will provide this exam on: **Thursday the 21st of January 8:00am.** 

It will then naturally have to be handed in: **Friday the 22nd of January before 18:00!** 





### Expectations

I want (read: insist) this course to be useful to all of you!

Therefore, please give me feedback (during the course, thanks!), if you have anything to add/suggest/criticise/alter.

This also means, that I will require much from you - as much as I can without spoiling the social life of your youth!

In return, I'll try to make statistics as interesting as possible (and not deprive you of all your early mornings).

"Taking Applied Statistics is like training to a marathon. You work hard to obtain your goal and some times you question yourself why you started this to begin with. But after all the hard work you have become stronger and have obtain an experience for life. Applied Statistics is without any doubt the course on my Bachelor degree I'm most proud of and the course I have learned the most from."

[Anonymous, 2019-20 course evaluation]

#### **Problems?**

If you experience problems in relation to Applied Statistics, whatever their origin and nature, then write me!

I may not be able to do anything about it, but I will try my best. However, if I don't know about your problems, then I most certainly can not do anything about them.

I consider myself fairly large, as long as I feel that this largeness is met by sincerity and will.

But... you need to write me in the first place! That is your responsibility.

#### **Course book and References**

#### Roger J. Barlow: Statistics (course book!)

(*A guide to the use of statistics methods in the physical sciences*) Very good introduction, which goes further than Bevington (see below). Very much to the point.

<u>Philip R. Bevington: Data reduction and error analysis.</u> Classic introduction with very good examples - a standard reference in all of experimental physics.

#### Glen Cowan: Statistical Data Analysis

A bit brief, but once you got the hang of statistics, this book contains much of what you will ever need, written in a useful or precise way.

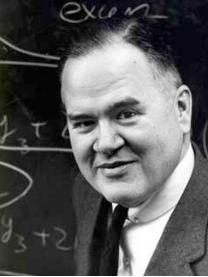
"If you read one book, then you're being introduced to the subject. If you read several books, then you're studying the subject" [Professor at the Faculty of Law]

## **Statistical practices**

#### The famous statistician John Tukey (1915-2000) was quoted for wanting to teach:

- The usefulness and limitation of statistics.
- The importance of having methods of statistical analysis that are robust to violations of the assumptions underlying their use.
- The need to amass experience of the behaviour of specific methods of analysis in order to provide guidance on their use.
- The importance of allowing the possibility of data's influencing the choice of method by which they are analysed.
- The need for statisticians to reject the role of "guardian of proven truth", and to resist attempts to provide once-for-all solutions and tidy over-unifications of the subject.
- The iterative nature of data analysis.
- Implications of the increasing power, availability and cheapness of **computing facilities**.
- The training of statisticians.

"Far better an approximate answer to the right question, which is often vague, than an exact answer to the wrong question, which can always be made precise." J. W. Tukey



# **Top 10** Most important things in applied statistics

1. Errors decrease with the **square root of N** 

2. ChiSquare is simple, powerful, robust and provides a fit quality measure
 3. Binomial distribution → Poisson distribution → Gaussian distribution

4. Error propagation is craftsmanship - fitting is an art
5. Error on a (Poisson) number, N: √N on a fraction, f=n/N: √f(1 - f)/N.
6. Correlations are important and needs consideration
7. Hypothesis testing of H<sub>0</sub> (null) and H<sub>1</sub> (alt.) is done with a test statistic t
8. The likelihood (ratio) is generally the optimal estimator (test)
9. Low statistics is terrible – needs special attention
10. Prior probabilities needs attention, i.e. Bayes' Theorem