

SS 2015

# Komplexitätstheorie

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<http://www14.in.tum.de/lehre/2015SS/kt/>

Sommersemester 2015

# Chapter 0 Organizational Matters

- Lectures:
  - 4SWS Mon 14:15–16:00 (MI 00.08.038)  
Thu 14:00–15:45 (MI 00.08.038)  
Compulsory elective in areas Algorithms and Scientific Computing, Informatics, Bioinformatics  
Module No. IN2007
- Exercises/Tutorial:
  - 2SWS Central exercise: Tue 12:15–13:45 (03.11.018)
  - Tutor: Chris Pinkau
- Valuation:
  - 4V+2ZÜ, 8 ECTS Points
- Office hours:
  - Mon 12:00–13:00 and by appointment

- Tutorials:
  - Chris Pinkau, MI 03.09.057 ([pinkau@in.tum.de](mailto:pinkau@in.tum.de))  
Office hours: Tue 14:00–15:00
- Secretariat:
  - Mrs. Lissner, MI 03.09.052 ([lissner@in.tum.de](mailto:lissner@in.tum.de))

- Problem sets and final exam:
  - problem sets are made available on Mondays on the course webpage
  - must be turned in a week later before class
  - are discussed in the tutorial
- Exam:
  - final exam: Monday, July 27, 2015, 08:30–11:30, room **MW 0350**
  - the final exam is closed book, no auxiliary means are permitted except for one sheet of DIN-A4 paper, handwritten by yourself
  - to pass the final exam, it is necessary to obtain at least **40%** of the point total
  - probably 10 problem sets

- Prerequisites:
  - Fundamentals of Algorithms and Data Structures (GAD)
  - Discrete Probability Theory (DWT)
  - Efficient Algorithms and Data Structures (EA)
  - Randomized Algorithms
- Supplementary courses:
  - Approximation Algorithms
  - Internet Algorithmics
  - Quantum Algorithms
  - ...
- Webpage:





<http://wwwmayr.in.tum.de/lehre/2015SS/kt/>

# 1. Planned topics for the course


- 1 The computational model
- 2  $\mathcal{NP}$  and  $\mathcal{NP}$ -completeness
- 3 Diagonalization
- 4 Space complexity
- 5 The polynomial hierarchy and alternation
- 6 Boolean circuits
- 7 (Randomized computation)
- 8 Interactive proofs
- 9 (Cryptography)
- 10 ...

## 2. Literature

-  Sanjeev Arora, Boaz Barak:  
*Computational Complexity — A Modern Approach*,  
Cambridge University Press: Cambridge-New York-Melbourne, 2009  
[http://proquest.tech.safaribooksonline.de.eaccess.ub.tum.de/  
9780511530753](http://proquest.tech.safaribooksonline.de.eaccess.ub.tum.de/9780511530753)
-  Giorgio Ausiello, Pierluigi Crescenzi, Giorgio Gambosi, Viggo Kann, Alberto Marchetti-Spaccamela, Marco Protasi:  
*Complexity and approximation — Combinatorial optimization problems and their approximability properties*,  
Springer-Verlag: Berlin-Heidelberg, 1999
-  José L. Balcázar, Josep Díaz, Joaquim Gabarró:  
*Structural Complexity I (and II)*,  
EATCS Monographs on Theoretical Computer Science, Springer-Verlag:  
Berlin-Heidelberg, 1995

-  Christos H. Papadimitriou:  
*Computational Complexity*,  
Addison-Wesley Publishing Company: London-Amsterdam-New York, 1994
-  Christos H. Papadimitriou, Kenneth Steiglitz:  
*Combinatorial optimization: Algorithms and complexity*,  
Prentice-Hall, Englewood Cliffs, NJ, 1982
-  Karl Rüdiger Reischuk:  
*Komplexitätstheorie — Band I: Grundlagen*,  
B.G. Teubner: Stuttgart-Leipzig, 1999  
[http://link.springer.com.eaccess.ub.tum.de/book/10.1007%  
2F978-3-322-80139-5](http://link.springer.com.eaccess.ub.tum.de/book/10.1007%2F978-3-322-80139-5)
-  Michael Sipser:  
*Introduction to the Theory of Computation*,  
International Edition, Thomson Course Technology:  
Australia-Canada-Mexico-Singapore-Spain-United Kingdom-United States, 2006



 Ingo Wegener:  
*The complexity of Boolean functions*,  
Wiley-Teubner Series in Computer Science: Stuttgart-Chichester-New York, 1987,  
[http://eccc.hpi-web.de/static/books/The\\_Complexity\\_of\\_Boolean\\_Functions/](http://eccc.hpi-web.de/static/books/The_Complexity_of_Boolean_Functions/)

Further relevant research papers will be made available during the course.

### 3. Notational conventions

We use standard notation and basic concepts, as detailed e.g., in the introductory course on

Discrete Structures, IN0015

<http://wwwmayr.in.tum.de/lehre/2012WS/ds/index.html.en>

# Chapter I The Computational Model

## 1. Some basic concepts

See



Sanjeev Arora, Boaz Barak:

*Computational Complexity — A Modern Approach*,

p. 9–12, Cambridge University Press: Cambridge-New York-Melbourne, 2009

## 2. Turing Machines

### 2.1 The Model

### 2.2 Robustness

### 2.3 Gödel Numbers and Universal TMs

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 13–23, Cambridge University Press: Cambridge–New York–Melbourne, 2009

## 2.4 Universal Simulation

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 33–36, Cambridge University Press: Cambridge-New York-Melbourne, 2009

## 2.5 Noncomputable Functions, the Halting Problem

## 2.6 Deterministic Time and the Class $\mathcal{P}$

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 23–29, Cambridge University Press: Cambridge-New York-Melbourne, 2009

# Chapter II $\mathcal{NP}$ and $\mathcal{NP}$ -completeness

## 1. The class $\mathcal{NP}$

 Sanjeev Arora, Boaz Barak:  
*Computational Complexity — A Modern Approach*,  
p. 37–39, Cambridge University Press: Cambridge–New York–Melbourne, 2009

### 1.1 Relation between $\mathcal{P}$ and $\mathcal{NP}$

### 1.2 Non-deterministic Turing Machines

 Sanjeev Arora, Boaz Barak:  
*Computational Complexity — A Modern Approach*,  
p. 39–41, Cambridge University Press: Cambridge–New York–Melbourne, 2009

## 2. Reducibility and $\mathcal{NP}$ -completeness

### 3. Cook-Levin theorem

#### 3.1 Boolean formulae and CNF

 Sanjeev Arora, Boaz Barak:  
*Computational Complexity — A Modern Approach*,  
p. 41–44, Cambridge University Press: Cambridge-New York-Melbourne, 2009

## 3.2 The Cook-Levin theorem

## 4. The web of reductions

-  Sanjeev Arora, Boaz Barak:  
*Computational Complexity — A Modern Approach*,  
p. 44–50, Cambridge University Press: Cambridge–New York–Melbourne, 2009



More on “The Web of Reductions”.

## 5. Decision versus search

## 6. $\text{co}\mathcal{NP}$ , EXP, and NEXP

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach,*  
p. 50–54, Cambridge University Press: Cambridge–New York–Melbourne, 2009

## 7. Some implications

See




Sanjeev Arora, Boaz Barak:

*Computational Complexity — A Modern Approach*,

p. 55–59, Cambridge University Press: Cambridge–New York–Melbourne, 2009

Also see

 [Michael R. Garey, David S. Johnson:](#)  
*Computers and Intractability: A Guide to the Theory of  $\mathcal{NP}$ -completeness*,  
[W.H. Freeman and Company: New York-San Francisco, 1979](#)

and the websites (among many others)

[List of Complexity Classes \(Wikipedia\)](#)  
[Complexity Zoo](#)  
 [\$\mathcal{NP}\$ -complete Problems \(Wikipedia\)](#)  
 [\$\mathcal{NP}\$ -completeness Columns](#)  
[A Compendium of NP Optimization Problems](#)

## 7.1 $\mathcal{NP}$ -complete problems cannot be sparse

See



Holenstein, Thomas

*Complexity Theory*,

p. 4–4, Script, ETH Zürich, 2010



Shustek, Len:

*An Interview with Juris Hartmanis*,


Comm. ACM **58**, 4, p. 33–37, ACM Press: New York, 2015

# Chapter III Diagonalization

## 1. Time and space hierarchy

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 63–64, Cambridge University Press: Cambridge-New York-Melbourne, 2009

 [Holenstein, Thomas](#)  
*Complexity Theory*,  
p. 2–3, Script, ETH Zürich, 2010

## 2. Non-deterministic time hierarchy

## 3. Ladner's theorem

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 65–67, Cambridge University Press: Cambridge–New York–Melbourne, 2009

 [Lance Fortnow, Bill Gasarch:](#)  
[Computational Complexity Blog](#)  
[Two Proofs of Ladner's Theorem](#), 2003

## 4. Oracle machines and limits of diagonalization

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 68–71, Cambridge University Press: Cambridge–New York–Melbourne, 2009

On a less formal side, also see

[Relativization and Multiple Choice Exams](#)

# Chapter IV Space Complexity

## 1. Configuration graphs

## 2. Some space complexity classes

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 75–78, Cambridge University Press: Cambridge–New York–Melbourne, 2009



### 3. PSPACE completeness

See



Sanjeev Arora, Boaz Barak:

*Computational Complexity — A Modern Approach,*

p. 78–82, Cambridge University Press: Cambridge–New York–Melbourne, 2009

### 3.1 Savitch's theorem

### 3.2 PSPACE and strategies for game playing

## 4. $\mathcal{NL}$ -completeness

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 82–88, Cambridge University Press: Cambridge-New York-Melbourne, 2009



## 4.1 Certificate definition of $\mathcal{NL}$ : Read-once certificates

## 4.2 $\mathcal{NL} = \text{co}\mathcal{NL}$


See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 82–88, Cambridge University Press: Cambridge–New York–Melbourne, 2009

Further references:

-  Larry J. Stockmeyer, Albert R. Meyer:  
*Word problems requiring exponential time,*  
Proceedings of the 5th Symposium on Theory of Computing, p. 1–9 (1973)  
This paper contains some important PSPACE-completeness results.
-  Albert R. Meyer, Larry J. Stockmeyer:  
*The equivalence problem for regular expressions with squaring requires exponential space,*  
Proceedings of the 13th Annual Symposium on Switching and Automata Theory,  
p. 125–129 (1972)  
This paper contains an EXPSPACE-completeness result.

And here an  $\mathcal{NL}$ -machine based proof for  $\mathcal{NL} = \text{co}\mathcal{NL}$ :

-  Holenstein, Thomas  
*Complexity Theory,*  
p. 13–14, Script, ETH Zürich, 2010

# Chapter V The Polynomial Hierarchy and Alternation

1. The class  $\Sigma_2^P$

2. The polynomial hierarchy

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 91–96, Cambridge University Press: Cambridge-New York-Melbourne, 2009

### 3. Alternating Turing machines

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 95–96, Cambridge University Press: Cambridge–New York–Melbourne, 2009

## 4. Time versus alternations: Time-space tradeoffs for SAT

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 96–98, Cambridge University Press: Cambridge-New York-Melbourne, 2009

## 5. Defining the hierarchy via oracle machines

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 98–99, Cambridge University Press: Cambridge-New York-Melbourne, 2009

# Chapter VI Boolean Circuits

1. Boolean circuits and  $\mathcal{P}_{/poly}$
2. Uniformly generated circuits
3. Turing machines that take advice

See



Sanjeev Arora, Boaz Barak:

*Computational Complexity — A Modern Approach*,

p. 101–105, Cambridge University Press: Cambridge-New York-Melbourne, 2009



Leighton, F. Thomson:

*Introduction to Parallel Algorithms and Architectures: Arrays, Trees, Hypercubes*,

Morgan Kaufmann: San Mateo, 1992



## 4. $\mathcal{P}/\text{poly}$ and $\mathcal{NP}$ : Karp-Lipton Theorem

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 106–107, Cambridge University Press: Cambridge-New York-Melbourne, 2009

## 5. Circuit lower (and upper) bounds

See



G.S. Frandsen and P. Bro Miltersen:

*Reviewing bounds on the circuit size of the hardest functions,*  
IPL **95** (2005), p. 354–357

## 6. Non-uniform hierarchy theorem

## 7. Finer gradations among circuit classes

## 8. Circuits of exponential size

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 108–113, Cambridge University Press: Cambridge-New York-Melbourne, 2009

# Chapter VII Randomized Computation

## 1. Probabilistic Turing Machines

## 2. Some examples of PTMs

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 115–120, Cambridge University Press: Cambridge-New York-Melbourne, 2009

3. One-sided and zero-sided error:  $\mathcal{RP}$ ,  $\text{co}\mathcal{RP}$ ,  $\mathcal{ZPP}$

4. The robustness of our definitions

5.  $\text{BPP} \subseteq \mathcal{P}_{/\text{poly}}$

6.  $\text{BPP}$  is in  $\mathcal{PH}$

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 121–128, Cambridge University Press: Cambridge-New York-Melbourne, 2009

## 7. Randomized reductions

## 8. Randomized space-bounded computation

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 129–146, Cambridge University Press: Cambridge-New York-Melbourne, 2009

# Chapter VIII Interactive Proofs

## 1. Interactive proofs: Some variations

### 1.1 Interactive proofs with deterministic verifier and prover

## 2. The class IP: Probabilistic verifier

## 3. Interactive proof for graph nonisomorphism

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 147–151, Cambridge University Press: Cambridge-New York-Melbourne, 2009

## 4. Public coins and AM

### 4.1 Simulating private coins

### 4.2 Set lower bound protocol

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 151–155, Cambridge University Press: Cambridge-New York-Melbourne, 2009



### 4.3 Some properties of $IP$ and AM

### 4.4 Can GI be $\mathcal{NP}$ -complete?

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 155–157, Cambridge University Press: Cambridge-New York-Melbourne, 2009


## 5. $IP = PSPACE$

### 5.1 Arithmetization

### 5.2 Interactive protocol for $\#SAT_D$

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach,*  
p. 157–161, Cambridge University Press: Cambridge-New York-Melbourne, 2009

 [Holenstein, Thomas](#)  
*Complexity Theory,*  
p. 64–69, Script, ETH Zürich, 2010

## 5.3 Protocol for TQBF

## 6. The power of the prover

## 7. Multiprover interactive proofs

## 8. Program checking

See

 [Sanjeev Arora, Boaz Barak:](#)  
*Computational Complexity — A Modern Approach*,  
p. 161–170, Cambridge University Press: Cambridge-New York-Melbourne, 2009

## 9. Outlook, More Topics in Complexity Theory

Among numerous other topics, see e.g. this on the GCT program:



Mulmuley, Ketan D.:

*The GCT Program Toward the  $\mathcal{P}$  vs.  $\mathcal{NP}$  Problem,*

Comm. ACM **55**, 6, p. 100–109, ACM Press: New York, 2012

For a blurb on one of the authors of the textbook for this course, see



Hyman, Paul:

*An Influential Theoretician,*

Comm. ACM **55**, 6, p. 24, ACM Press: New York, 2012