Module catalogue

of the module handbook for the Bioinformatics Master's degree programs

for the exam regulations valid as of 1 October 2021



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Computer Science Department



Mathematisch-Naturwissenschaftliche Fakultät

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Notes

This **module catalogue** is an appendix to the module handbook for the Master's degree programs Bioinformatics and Medical Informatics of the Computer Science Department at the Eberhard Karls University Tübingen.

The modules in this catalogue are arranged according to degree program, and within the degree programs according to the topically grouped required elective modules. For details regarding these required elective modules see the module handbook.

The academic council of the Computer Science Department provides an updated version of the module catalogue at the beginning of each semester.

Abbreviations	Meaning
Type	L = Lecture
	S = Seminar
	T = Tutorial
	P = Practical course
	R = Research project
Status	c = compulsory
	o = optional
СН	Credit hours
CP	Credit points (= ECTS points)
Type of exam	wt = written test
	ot $=$ oral test
	tp = term paper
	op = oral presentation
Duration of exam	in minutes
Evaluation	g = graded
	ug = ungraded (pass / fail)
	nt = no test
Calculation of modules	possible percentage weighting of grades

Legend

NOTES

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Required elective modules: INFO-INFO

Computer Science

Module Number:	Module title Lecture types						
INFO-4214	Cognitive Modeling	Lecture, Tutorials					
ECTS	6	6					
Work load							
-Contact time	Work load	Class time	Self-Study				
-Self study	180 h	60 h / 4 CH	120 h				
Duration	1 semester	·					
Frequency of offer	irregularly						
Language of instruction	English						
Type of Exam	Written (oral exam if nu	umber of participants allow	ws)				
Content	Cognitive models covering learning, action and perception are presented and discussed, including descriptive, qualitative, quantitative and neural models. In addition, parameter optimization as well as techniques to compare models and to interpret and evaluate model parameters are introduced. All techniques are shown in the context of concrete models of cognitive processes. Moreover, the necessary statistical methods are introduced in a practical, application-oriented manner.						
Objectives	Students know the most important principles and techniques of cognitive mod- eling. They know how to model cognitive processes, mechanisms, and learning at different levels of complexity. They can apply various cognitive models and modeling approaches in a goal-directed manner. Moreover, they can evaluate, compare, and contrast different modeling approaches as well as modeling re- sults. They are able to judge whether a model is falsifiable and they know how to validate and interpret cognitive models. Finally, they can use statistical methods to quantitatively compare different cognitive models.						

(noch	INFO-4214)	
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Requirement for Credit Points / Grade	Lecture	Type of Class	b J Status	HD 2	c CD	A Type of Exam	06 Duration of Exam	99 Evaluation	 D Calculation of Module (%)
	Tutorial	Т	f	2	3				0
Requirement for participation	÷	Introductory course knowledge about machine learning, artificial neural net- works, robotics, cognitive architectures, or artificial intelligence is required.							
Lecturer	Butz								
Literature	Book: S. Lewandows nition. Additional pa	•			/	-		leling in	Cog-

Module Number:	Module title Lecture types						
INFO-4152	Advanced Statistics	Lecture, Tutorials					
ECTS	3						
Work load							
-Contact time	Work load	Class time	Self-Study				
-Self study	90 h	30 h / 2 CH	60 h				
Duration	1 semester	1					
Frequency of offer	irregularly						
Language of instruction	English						
Type of Exam	Pass/fail depending on performance in homework (every 4. session is a tutorial for which we expect participants to have prepared and handed in homework; typically some implementation in R/SPSS; for each session we expect participants to have read the relevant literature).						
Content	Advances in neuroscientific methodology give rise to the accumulation of huge amounts of data. Analysing these data poses new problems that are typically not covered by the classical introductory statistics courses and also increase the need to master classic statistical topics as, for example, statistical power and required sample sizes, problems of multiple testing, correlational structure of repeated measures, etc. In short, solid statistical knowledge beyond standard tests and ANOVAs are very important for anyone working in the neurosciences today. Moreover, in recent years, alternative approaches to data analysis have re- ceived increasing attention because they can solve specific problems and incon- sistencies of classical statistics. E.g. Bayesian approaches makes use of our previous knowledge about the data, and non-parametric permutation statis- tics/Bootstrap have the advantage of being relatively free of assumptions about the underlying distribution of the data. This course will present these statisti- cal methods in a way that focuses on understanding the guiding principals as well as the practical applications of these methods in real neuroscientific data.						
Objectives	empirical research quest	ions in the life-sciences/ne					
Requirement for participation	Basic/intermediate knowledge of classic statistics. You should feel comfort- able with basic statistical topics as between-groups ANOVA, t-tests, regression analysis, basics of repeated-measures ANOVA, and the rationale/mathematics behind these procedures. You should also feel comfortable (or be willing to learn rapidly) with implementing these basic methods either in the program- ming language R or in the SPSS macro language ('syntax mode').						
Lecturer	Franz and Gaiss (Medic	Franz and Gaiss (Medical Faculty)					
Literature	Literature will be annou	inced during the course.					

Module Number:	Module title					Lecti	are typ	oes	
INFO-4250	Information Processing for Perception and Action						n Seminar		
ECTS	3					,			
Work load									
-Contact time	Work load		ass tir	ne		Self-S	tudy		
-Self study	90 h	30	h / 2	CH		60 h			
Duration	1 semester								
Frequency of offer	irregularly								
Language of instruction	Deutsch, English								
Type of Exam	Wird zu Beginn des ning of semester	Semest	ers bel	canntge	geben /	Will be	annour	nced at	begin-
Content	Humans as well as complex technical systems process sensory information to interact with the environment. These actions have consequences which (again) create sensory events that can be processed and used to improve the interaction with the environment. We will discuss advanced topics of this full 'perception- action' loop; in humans as well as in technical systems. A special focus will be on the experimental literature from the Cognitive- and Neurosciences and on advanced statistical methods.								
Objectives	Students will know of the interaction of hu understand advanced erate this knowledge. interdisciplinary work performance and act	ımans l statist This e king en	with to tical an experti- virone	echnica nd empi se will l ments,	l systen irical me nelp the:	ns. They ethods th m to app	y will a nat were ly their	lso lear e used t knowle	n and o gen- dge in
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Seminar	S	0	2	3	tp	45	g	100
Requirement for participation	-	No formal requirements, but students should have a good background in statis- tics and should have attended introductory/mid–level courses in Cognitive Sci-							
Lecturer	Franz								
Literature	Wird zu Beginn des ning of semester	Semest	ers bel	kanntge	geben /	Will be	annour	nced at	begin-

Module Number:	Module title					Lect	ure ty	pes	
INFO-4173	Massively Parallel (Comput	ing				esung, Ü		1
ECTS	6	*	Ŭ			l			
Work load						~ 14	~ 1		
-Contact time	Work load		lass ti				Study		
-Self study	180 h	6	0 h / 4	CH		120	h		
Duration	1 semester								
Frequency of offer	every summer seme	ester							
Language of instruction	Englisch								
Type of Exam	Mündliche Prüfung Übungen kann ein N						r), duro	ch erfol	greiche
Content	gibt einen Überblich werden grundlegend Branching, aber au Simulationen etc. h	Die Vorlesung führt die nötigen Konzepte der parallelen Verarbeitung ein, und gibt einen Überblick über die augenblicklich verfügbare Hardware. Weiterhin werden grundlegende parallele Algorithmen, z.B. Map, Reduce, Prefix-Sum, Branching, aber auch parallele Anwendungen wie FFT, Partikelsysteme und Simulationen etc. behandelt. Um für neue Probleme effiziente, parallele Lö- sungen zu entwickeln, werden entsprechende Herangehensweisen und Komplex- itätsanalysen vermittelt							
Objectives	auf einem Chip zu ir Grafikkarte. Um die gorithmen gewählt u miert werden. (1) Z setzen, ein gegeben durch Parallelisieru entwickeln, um ein u arbeiten. (3) Sie sin	Ein aktueller Trend aller Chip-Hersteller ist es, mehr und mehr Recheneinheiten auf einem Chip zu integrieren, z.B. mit mehreren hundert Prozessoren auf einer Grafikkarte. Um diese Architekturen effizient zu nutzen, müssen geeignete Al- gorithmen gewählt und die Probleme hinsichtlich der Speicherbandbreite opti- miert werden. (1) Ziel der Vorlesung ist es, die Studenten in die Lage zu ver- setzen, ein gegebenes Problem hinsichtlich der möglichen Effizienzsteigerung durch Parallelisierung zu analysieren. (2) Sie können geignete Algorithmen entwickeln, um ein möglichst schnelle massiv-parallele Implementierung zu er- arbeiten. (3) Sie sind in der Lage, durch Profiling ihre Programme hinsichtlich der Speicherbandbreite, der Auslastung der GPU und der Register zu opti-							
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Vorlesung	V	0	2	3	MP	25	b	100
	Übung	Ü	0	2	3				
Requirement for participation	-		<u> </u>						
Lecturer	Lensch								
Literature	Hubert Nguyen: Gl Massingill: Pattern - General-Purpose	Hubert Nguyen: GPU Gems 3, Addison Wesley; T. Mattson, B. Sanders, B. Massingill: Patterns for Parallel Programming, Addison Wesley; gpgpu.org - General-Purpose Computation Using Graphics Hardware; NVIDIA CUDA page; NVIDIA CUDA Programming Guide; Vorlesungsfolien werden bereit-							

Module Number:	Module title Lecture types								
INFO-4174	Massively Parallel Computing				Prakt				
ECTS	6	6							
Work load									
-Contact time	Work load		lass tir	ne		Self-S	Study		
-Self study	180 h	60	h / 4	CH		120 h	L		
Duration	1 semester								
Frequency of offer	jährlich								
Language of instruction	Englisch								
Type of Exam	Präsentation und Au	sarbeit	ung de	es Proj∉	ektes				
Content	aus den unterschiedl bereiche auf massiv- Programmierung von verbundenen Heraust nisation behandelt.	Es werden die effiziente Implementierung und die Umsetzung von Algorithmen aus den unterschiedlichen Bereichen der Informatik oder angrenzender Fach- bereiche auf massiv-parallelen Architekturen vermittelt. Weiterhin wird die Programmierung von massiv-parallelen Rechnersystemen GPU, und die damit verbundenen Herausforderungen wie Speicherverwaltung, Branching, Synchro- nisation behandelt. Neben der Programmierung von GPUs steht auch das Messen und Vergleichen der Performanz paralleler Anwendungen im Fokus.							
Objectives	Die Studierenden kör rechenintensiver Auf tieren und durchführ wendungen zu messe	gaben a ren. Sie	auf ma e sind	assiv-pa in der l	rallelen Lage, di	Rechner	rn plan	en, imp	lemen-
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Praktikum	Р	0	3	6	Н		b	100
Requirement for participation	INFO-4173 Massively	INFO-4173 Massively Parallel Computing (auch parallel)							
Lecturer	Lensch								
Literature	Entwicklungsumgebu	ung wir	d zur '	Verfügu	ng gest	ellt, NVI	IDIA C	UDA pa	age

Module Number:	Module title Lecture types						
INFO-4241	Programming Language	Lecture, Tutorials					
ECTS	6	6					
Work load							
-Contact time	Work load	Class time	Self-Study				
-Self study	180 h	90 h / 4 CH	90 h				
Duration	1 semester	•					
Frequency of offer	about every two years	about every two years					
Language of instruction	English or German, dependent on participants						
Type of Exam	Written or oral examin participation.	Written or oral examination. Participation in exercises is required for exam participation.					
Content	languages. We discuss t semantics (such as smal	he foundations of program l-step operational semantic ferent variants of typed la	ems of modern programming ming languages using formal cs), formal type systems and mbda calculi that constitute				
Objectives	Students will be able to discuss and analyze modern programming languages in terms of the properties of their theoretical foundations. They will understand the design space and tradeoffs of type systems for these languages.						
Requirement for participation	Programming Languages I is helpful, but not required.						
Lecturer	Ostermann						
Literature	Benjamin C. Pierce. Types and Programming Languages. MIT Press, 2003.						

Module Number:	Module title		Lecture types				
INFO-4246	Programming with	h Dependent Types	Practical Course				
ECTS	6	6					
Work load							
-Contact time	Work load	Class time	Self-Study				
-Self study	120 h	30 h / 4 CH	90 h				
Duration	1 semester						
Frequency of offer	irregularly						
Language of instruction	English or Germa	English or German, depends on participants					
Type of Exam	Project 50 %, Pre	Project 50 %, Presentation and Documentation 50 $\%$					
Content	Dependent types are types that can depend on values: arrays of length 25, 20- by-20 matrices, or integers larger than -3. Agda and Idris are two dependently typed languages. Dependent types are good for many things -— from elim- inating ArrayIndexOutOfBoundsException to mechanically verified programs and proving mathematical theorems -— yet the idea itself originates from the foundational crisis of mathematics at the turn of the 19th century. Dependent types carry their own coding patterns and caveats. In this seminar, we learn to program effectively with dependent types: How to make hard things possible, how to not make simple things hard, and a bit of how things work under the hood.						
Objectives		- 00-	anguage such as Agda or Coq and on-trivial program properties.				
Requirement for participation	Participation in P	rogramming Languages I, I	I or III is helpful but not required.				
Lecturer	Ostermann						
Literature	will be announced	at beginning of course					

Module Number:	Module title Lecture types						
INFO-4248	Interactive Theorem Pre	oving	Lecture, Tutorials				
ECTS	9						
Work load							
-Contact time	Work load	Class time	Self-Study				
-Self study	270 h	135 h / 6 CH	135 h				
Duration	1 semester						
Frequency of offer	about every two years						
Language of instruction	Englisch, if all participa	nts agree, else German					
Type of Exam	Written or oral examination participation.	ation. Participation in e	xercises is required for exam				
Content	 vanced functional progra This course is for studen 1. The foundational to logic 2. Practical interaction 3. Advanced function structive mathematical 	amming, mostly using the nts interested in: theories of mathematics, n we theorem proving in a s nal programming languag atics via the "Curry-Howa on and "certified program	nost notably type theory and tate-of-the-art proof assistant ges and their relation to con- ard Isomorphism"				
Objectives Requirement for	Students will be able to write programs and prove theorems in the Coq proof assistant. Students understand the theoretical underpinnings of interactive theorem provers and get basic insights into the semantics and formal properties of programming languages.A background in functional programming is helpful. Experience with mathe-						
participation	matical proofs is helpful						
Lecturer	Ostermann						
Literature	softwarefoundations.		series available at https:// lent Types, MIT Press				

Module Number: MEDZ-4310	Module title Selected Topics in Medie	cal Informatics	Lecture types Lecture, Tutorials					
ECTS	6							
Work load								
-Contact time	Work load	Class time	Self-Study					
-Self study	180 h	60 h / 4 CH	120 h					
Duration	1 semester							
Frequency of offer	once a year	once a year						
Language of instruction	English							
Type of Exam	Oral or written test							
Content		-	between Medical Informatics for the research-oriented MSc					
Objectives	~	earch fields, students learn atics and Bioinformatics.	to perceive the relationship					
Requirementforparticipation	_							
Lecturer	Academic staff of Medic	al Informatics						
Literature	none							

Module Number:	Module title Lecture types								
MEDZ-4320	Selected Topics in Medi	cal Informatics	Lecture, Tutorials						
ECTS	9								
Work load									
-Contact time	Work load	Class time	Self-Study						
-Self study	270 h	90 h / 6 CH	180 h						
Duration	1 semester	·							
Frequency	ondo a voar								
of offer	once a year	once a year							
Language of	English								
instruction									
Type of Exam	Oral test								
Content		-	between Medical Informatics or the research-oriented MSc						
Objectives	Ű	earch fields, students learn atics and Bioinformatics.	to perceive the relationship						
Requirement for participation	MEDZ-RES MEDZ-BIOMED								
Lecturer	Academic staff of Medic	al Informatics							
Literature	none								

Module Number: MEDZ-4410	Module title	in Medical Information	Lecture types Seminar					
ECTS	Seminar Selected Topics	m medical mormatics	Semmar					
Work load	5							
-Contact time	Work load	Class time	Self-Study					
-Self study	90 h	30 h / 2 CH	60 h					
Duration	1 semester	, , , , , , , , , , , , , , , , , , ,						
Frequency of offer	once a year							
Language of instruction	English							
Type of Exam	Oral presentation (30 minutes), written elaboration (8-10 pages)							
Content	Students learn to work	-	ields of Medical Informatics. imary literature sources and student colleagues.					
Objectives	for complex research top vide a summary of the having extended and de	Students will be able to work with and use scientific primary literature sources for complex research topics in Medical Informatics. They have learned to pro- vide a summary of the content both in written and oral form. In addition to having extended and deepened their knowledge, students have also improved social skills such as communication capabilities, moderation skills, rhetorical						
Requirement for participation	_							
Lecturer	Academic staff of Medic	Academic staff of Medical Informatics						
Literature	Current research articles	s related to the research to	opic					

Technical Computer Science

Module Number:	Module title					Lectu	ıre typ	oes		
INFO-4313	Embedded Systems					Semin				
ECTS	3									
Work load										
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy			
-Self study	90 h	30	h / 2	CH		60 h				
Duration	1 semester	1 semester								
Frequency of offer	regularly in the sum	regularly in the summer term								
Language of instruction	English									
Type of Exam	Oral presentation an	d writt	en rep	ort						
Content Objectives	and are already integ medical technology, cles as well as in indu fold dependencies be require a holistic app tems. This seminar for distributed embed puter architecture at future embedded sys topic list, examine th by an oral seminar p Students are able to	Embedded systems have become a fundamental part of many technical systems and are already integral part of everyday life, e.g. in mobile communications, medical technology, consumer electronics, smart homes and autonomous vehi- cles as well as in industrial automation and Internet of Things (IoT). The mani- fold dependencies between software and the underlying hardware architecture require a holistic approach in design, analysis, and verification of embedded sys- tems. This seminar examines modelling, analysis and verification approaches for distributed embedded systems, highlights the latest research trends in com- puter architecture and machine learning, and discusses their applicability in future embedded systems. The students choose a seminar topic from the given topic list, examine the topic in substance, and present the elaborated content by an oral seminar presentation and a written report.								
	current research pap assess the contributi- to other students an can summarize and presentation and a w	ons of a nd resea evaluat	a pape archers e the	r. They s and c results	r can pr an lead	esent cui research	rrent re h discu	search 1 ssions.	results They	
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)	
	Seminar	Seminar S c 2 3 $tp+op$ 30 g 100						100		
Requirement for participation	none					·			·	
Lecturer	Bringmann									
Literature	Will be announced in	n the p	re-lect	ure mee	eting.					

Module Number:	Module title					Lect	ure ty	pes			
INFO-4315	Advanced Topics in	Embed	ded Sy	stems		Lect		-			
ECTS	6					ļ					
Work load											
-Contact time	Work load	CI	lass tir	ne		Self-	Study				
-Self study	180 h	45	h / 2	CH		135 l	h				
Duration	1 semester	1 semester									
Frequency of offer	regularly in the sum	regularly in the summer term (block course)									
Language of instruction	English	English									
Type of Exam	Oral exam (written e	exam ir	a case	of a lar	ge num	per of pa	articipa	nts)			
Content	with special focus on Systems-on-Chip (So ded systems architect developments in and sipation, and energy addresses cyber-phys- tion of machine-lear advanced hardware a ing approaches in ha of programming assi	This lecture discusses current topics and trends in embedded system research with special focus on design, analysis and verification of embedded systems and Systems-on-Chip (SoCs). The lecture starts with an introduction into embed- ded systems architectures and electronic system level design. Then, the latest developments in analysis of non-functional properties like timing, power dis- sipation, and energy consumption are discussed. The lectures on verification addresses cyber-physical systems, safety verification, and robustness optimiza- tion of machine-learning based embedded systems. The lecture finally covers advanced hardware architectures for low-power implementation of deep learn- ing approaches in hardware. Between the lectures, practical exercises in form of programming assignments will take place. The lecturers will present the relevant basics as well as recent research results in each topic.									
Objectives	Participants will acq systems as well as t ded systems under s embedded system de get a deeper practica assignments.	he nece afety co sign in	essary onstra order	skills t ints. T to avoi	o desigr hey wil d comm	n, analys l gain ha non pitfa	se, and ands-on alls. The	verify experi- e studer	embed- ence in nts will		
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)		
	Lecture	L	с	2	3	ot	30	g	100		
									100		
	Tutorial	Т	c	2	2						
Requirement for participation	Prerequisites are the or "Modellierung un						ingebett	eter Sy	steme"		
Lecturer	Bringmann				-						
Literature	Will be announced d	luring t	he firs	t lectur	e.						

Module Number:	Module title					Lectu	ıre typ	es	
INFO-4349	Communication Netw	vorks (S	Semina	ar)		Semin	ar		
ECTS	3								
Work load									
-Contact time	Work load	Work load Class time Self-Study							
-Self study	90 h	30	h / 2	CH		60 h			
Duration	one semester								
Frequency of offer	irregularly								
Language of instruction	English	English							
Type of Exam	Oral presentation and	d writte	en rep	ort					
Content	This seminar covers current and varying topics from research and application in the field of communication networks.								
Objectives	current research pap critically assess the co- results to other stud	Students are able to read, reflect, and examine the topic in substance upon current research papers in the area of communication networks. They can critically assess the contributions of a paper. They can present current research results to other students and researchers, and can lead research discussions. They can summarize and evaluate the results of research papers in form of a areal presentation and a written present							
Requirement for Credit Points / Grade	<u> </u>	² Type of Class	Status	e CH	e CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Seminar	S	с	2	3	tp+op	30	g	100
Requirementforparticipation	INF4348 Communication Technologies or another Communication Networks master lecture								
Lecturer	Menth								
Literature	none								

Machine Learning

Module Number:	Module title					Lectu	ıre typ	es		
ML-4503	Explainable Machine I	Learnii	ng			Semin				
ECTS	3									
Work load										
-Contact time	Work load	Cla	ass tin	ne		Self-S	tudy			
-Self study	90 h	30	h / 2	CH		60 h				
Duration	1 semester	1 semester								
Frequency	1 1 • 11 • 1									
of offer	regularly in the winter	semes	ster							
Language of instruction	English									
Type of Exam	Oral Presentation (ab pages), leading the dis				nd writt	ten elab	oration	(approx	x. 10	
	 In this seminar, we will discuss research papers related to explainable machine learning focusing on generating visual and textual explanations for classification decision of machine learning models. From a methodological perspective, we will discuss about popular perceptual modules of machine learning models, integrated attention mechanisms as well as memory based natural language processing methods tailored towards explanation generation. General knowledge on Statistical Machine Learning General knowledge on Deep Learning General knowledge on Deep Learning General knowledge on Deep Learning 									
Objectives	Students are able to research area. They of They can present curr and can lead research intended to help the st ability to criticise and	can cri rent re discuss tudents	itically esearch sions. s to de	y assess h result The for evelop s	s the co s to oth rm of le elf-confi	ntributio ner stude arning u dence (p	ons of s ents an sed in t oresenta iscussion	such a p d reseau he semi tion) ar	oaper. rchers nar is	
Requirement for Credit Points / Grade		Type of Class	Status	CH	cP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)	
	Seminar	S	0	2	3	wt,ot	30	g	100	
Requirementforparticipation										
Lecturer	Akata									
Literature	Will be announced in [•]	the fire	st mee	eting						

Module Number:	Module title					Lectu	ıre typ	es	
ML-4505	Learning with Limite	d Labe	eled Da	ata		Semin			
ECTS	3					,			
Work load									
-Contact time	Work load	Cl	ass tin	ne		Self-St	tudy		
-Self study	90 h	30	h / 2	CH		60 h			
Duration	1 semester					- I			
Frequency	regularly in the winte	r somo	stor						
of offer	regularly in the white	, senie	5001						
Language of instruction	English								
Type of Exam	Two oral presentation search papers (approx				selected	d from a	set of	suggest	ed re-
Objectives	 In this seminar, we will discuss research papers related to visual learning with limited labeled data, including deep learning methods for zeroshot and few-shot learning, semi-supervised learning, unsupervised pretraining, and self-supervised learning. From a methodological perspective, we will discuss popular zero-shot learning and few-shot learning methods and applications, as well as different families of semi-supervised and unsupervised learning models, such as consistency regularization, self-training, and deep generative models. General knowledge on Statistical Learning General knowledge on Deep Vision 								
	search area. They can can present current re participate to research is intended to help th the ability to criticise	esearch h discu ne stud	result issions ents t	ts to oth s. The f o develo	ner stud form of op self-c	ents and learning onfidenc	researd used in e (present discu	chers an the se entation	d can minar
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	SeminarSo23 $tp+op$ 30g100								
Requirementforparticipation	none								
Lecturer	Akata	Akata							
Literature	Will be announced in	the fir	st me	eting					

Module Number:	Module title					Lect	ure typ	oes	
ML-4309	Data Compression weeks	ith Dee	ep Pro	babilist	ic Mod-		re with		ls
ECTS	6								
Work load									
-Contact time	Work load	C	lass tir	ne		Self-S	Study		
-Self study	180 h	60)h/4	CH		120 h	-		
Duration	1 semester								
Frequency	Regularly once a yea	r							
of offer	negularly once a yea	1 							
Language of instruction	English								
Type of Exam	In addition to solvin on individual course by the lecturer or an a writeup and a pres	project assign	s in sn ed Phl	nall gro D stude	ups and ent. Stuc	under o lents wil	ccasion ll be gra	al super aded ba	rvision sed on
Content	theory, and source co effective compression for images and video employ probabilistic information theoretic learn some basic know	This course unites concepts from probabilistic machine learning, information theory, and source coding theory into practical methods for developing highly effective compression codecs. Recently, established compression codecs (e.g., for images and videos) have been outperformed by a new class of codecs that employ probabilistic machine learning models. This course will introduce the information theoretical foundations of data compression. Students will then learn some basic knowledge of deep probabilistic models, various entropy coding algorithms, and how the two can be combined to develop and evaluate novel							
Objectives	From the theory side, compression and the sion. They learn the entropy coding algori In order to apply thes of (deep) probabilisti practical side, studer sion codecs and obta evaluating a new and	concep e gener ithms, a se conc c mode nts lear ain ha	ot of ra al con- and th epts in els and rn abounds-on	ate-dist cept of eir resp praction (appro- ut exist experi	ortion p entropy bective ad ce, stude ximate) ing mach ence in	erforman coding, dvantage nts learn Bayesian hine lean	nce in le specifies and de some le n inferen rning ba	ossy con c instar lisadvar basic co nce. Fro ased con	mpres- nces of ntages. ncepts om the mpres-
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Lecture	L	0	3	4.5			g	
Doguinement f	Tutorial Students should have	Т	0	1	1.5	·		olemi	
Requirement for participation	Students should have a sound understanding of multivariate calculus, some practical experience with the training of machine learning models, and proficiency with Python and at least one compiled language (e.g., Rust, C, C++). Parallel attendance of the course "Probabilistic Machine Learning" is encouraged but not strictly required.								
Lecturer	Bamler								
Literature	Literature will be list	ted at t	the beg	ginning	of the s	emester.			

Module Number:	Module title					Lectu	ıre typ	es	
ML-4506	Machine Learning for	r Medio	cal Ima	age Ana	lysis	Semin	.ar		
ECTS	3								
Work load									
-Contact time	Work load	Cl	ass tin	ne		Self-St	tudy		
-Self study	90 h	30	h / 2	CH		$60 \ h$			
Duration	1 semester					·			
Frequency of offer	Offered at irregular i	nterval	s						
Language of instruction	English								
Type of Exam	Oral presentation and	d grade	ed part	icipatio	on in pa	per discu	ssion		
Content	The seminar starts with an introductory lecture to provide a compact overview of the research field (machine learning for medical image analysis), as well as a tutorial on critical analysis and presentation of research papers. Throughout the remainder of the course, each student presents a paper from a collection of seminal work in the field. To foster engaging scientific exchange, each presented paper will have designated critics who are also tasked with studying the paper and preparing questions for its discussion.								
Objectives	The learning objective will gain a solid unce learning for medical is analyse original resear- will improve their scie- participation in discu	lerstan mage a arch pa entific o	ding o nalysis pers a commu	f key cos, (2) the nd judg unication	ontribut e studer je their	tions to nts learn impact,	the fiel to critic and (3)	d of ma cally rea the stu	achine d and idents
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Seminar	S	0	2	3	tp+op	30	g	100
Requirement for participation									
Lecturer	Baumgartner,Koch								
Literature	Will be provided in t	he cou	rse						

Module Number:	Module title Lecture types							
ML-4420	Efficient Machine Learn	ing in Hardware	Lecture					
ECTS	6							
Work load								
-Contact time	Work load	Class time	Self-Study					
-Self study	180 h	60 h / 4 CH	120 h					
Duration	1 semester							
Frequency								
of offer	regularly in the summer	r, every two years						
Language of	English							
instruction								
Type of Exam	Oral exam							
Content	 machine learning application of high performance condition however, high performance higher energy demands. human brain is comparation human brain is comparation intelligence often resorts energy demand. This lead how to build energy and in hardware. In this condition Hardware archited chitectures, doma memory computing Energy-efficient mathematication Optimized mapping techniques Word length optime Scalable application 	ations have been strongly nputing platforms. In com- nce of artificial neural network. While the average energy able to that of a laptop co- sector at the several exture will discuss this pro- d resource efficient archite- ntext, the following topics ctures for machine learning in-specific architectures, of ag, training vs. inference a machine learning ing of deep neural networks inization (binary, ternary, for pro-specific architectures pro-specific architectures in specific architectures	ng: GPU, FPGA, SIMD ar- custom accelerators, in/near rchitectures s to hardware and pipelining					
Objectives	The students gain in-depth knowledge about the challenges associated with energy-efficient machine learning hardware and respective state-of-the-art solu- tions. They can compare different hardware architectures regarding the trade- off between energy consumption, complexity, computational speed and the specificity of their applicability. The students learn what kinds of hardware architectures are used for machine learning, understand the reasons why a par- ticular architecture is suitable for a particular application, and can efficiently implement machine learning algorithms in hardware.							
Requirement for participation	Knowledge about found	ations in machine learning	5					
Lecturer	Bringmann							
Literature	Will be announced in the	ne first lecture						

Module Number:	Module title					Lect	ure typ	oes				
INFO-4194	Behavior and Learnin	ıg				Lectu	re, Tut	orials				
ECTS	6											
Work load												
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy					
-Self study	180 h	60	h / 4	CH		120 h						
Duration	1 semester											
Frequency of offer	irregularly											
Language of instruction	English											
Type of Exam	Written (oral exam if	numb	er of p	articipa	ants allo	ws)						
Content	adapt their behavior behavioral decision m ticular, the lecture in forward-inverse contro- and models. Also the and motor complexes cial systems are consi-	decide on, and control their behavior and how they progressively optimize and adapt their behavior over time. Accordingly, algorithms are introduced for behavioral decision making, control, optimization, and adaptation. In par- ticular, the lecture introduces spatial representations for behavioral control, forward-inverse control models, including the learning of such representations and models. Also the encoding and the learning of motor control primitives and motor complexes is considered. Last but not least, self-motivated artifi- cial systems are considered that strive to maintain internal homeostasis and to maximize information gain.										
Objectives	Students know how in cial systems. They ca cal RL, factored RL, Moreover, they are av RL approaches. They to optimize them. M cluding how to learn gain driven and self- exploitation dilemma. options to learn suital abstract such structu tiotemporal represent and can be abstracted	n apply and ac ware of y know oreover and o -motiva . More- ble moo res. Fi cations	y reinf tor-cri the co abou r, they ptimiz ated b over, t del-pre inally, can b	forcement tic appropriate appropriate t dynamic know who was them ehavior hey are edictive they know e learned	nt learni roaches between nic moti about G . They and ar aware o structur now how ed, store	ing (RL) to the a model- ion prim laussian can imple aware f model- res, and y sensori ed as ep	, includ ppropri free and itives a Mixtur plement of the predict of optic motor-g isodic r	ling hie ate pro l model nd kno re Mode inform e exploi ive com ms to su grounde aemory	rarchi- blems. -based w how els, in- nation- ration- trol, of nitably ed spa-			
Requirement for Credit Points / Grade	Lecture	г Type of Class	4 Status	HO 2	dD 3	A Type of Exam	06 Duration of Exam	o Evaluation	001 Calculation of Module (%)			
	Tutorial	Т	f	2	3				0			
Requirement for participation	Introductory course robotics, or artificial					artifici	al neu	ral net	works,			
Lecturer	Butz	0	,	.1								
Literature	Will be supplied (boo	ok char	oters a	nd pape	ers in Er	nglish)						

Module Number: INFO-4210	Module title Recurrent and Gene works	rative A	Artifici	al Neu	al Net-		ure ty re, Tut				
ECTS	6										
Work load											
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy				
-Self study	180 h	60	h / 4	CH		120 h					
Duration	1 semester										
Frequency of offer	irregularly	irregularly									
Language of instruction	English	English									
Type of Exam	Written (oral exam i	f numb	er of p	articipa	ants allo	ows)					
Content	tion through time; th Very Deep Learning a ral Convolution; Rese Networks; Autoencoo	Advanced ANN topics. First, revisiting backpropagation and backpropaga- tion through time; then: Advanced Recurrent Neural Networks (LSTM, GRU); Very Deep Learning and Generative Adversarial Networks; Spatial and Tempo- ral Convolution; Reservoir Computing; Neuroevolution; Attention and Routing Networks; Autoencoders and Restricted Boltzmann Machines; Gain Fields and Switching Networks; Latent Space Visualization techniques; Generative Infer- ence									
Objectives	tificial neural networ recognition, language formations, and spat cial neural networks how to optimize weig as well as by alterna structures to selectiv generative networks	Students know about and how to apply generative and typically recurrent ar- tificial neural networks in various domains including data classification, image recognition, language processing, spatially-invariant recognition, spatial trans- formations, and spatial mappings. They can apply complex, generative artifi- cial neural networks from scratch as well as with available tools. They know how to optimize weights and network structures by means of gradient descent as well as by alternative methods. They can use complex recurrent network structures to selectively process aspects of the data. They know how to apply generative networks as model-predictive neural controllers and as well as long- range temporal predictors. They can combine retrospective latent state and									
Requirement for Credit Points / Grade	Lecture	T Type of Class	J Status	HO 2	CP 3	₫ Type of Exam	6 Duration of Exam	os Evaluation	01 Calculation of Module (%)		
	Tutorial	Т	f	2	3				0		
Requirement for participation	Knowledge about ma or artificial intelligen			0,	icial ne	ural netv	vorks, o	leep lea	rning,		
Lecturer	Butz										
Literature	Will be supplied (bo	ok chap	oters a	nd pap	ers in E	nglish)					

Module Number:	Module title					Lect	ure ty	pes			
INFO-4211	Avatars in Virtual Re	alities				Pract	ical Co	urse			
ECTS	6										
Work load											
-Contact time	Work load		lass tin	ne		Self-S	Study				
-Self study	180 h	180 h 60 h / 4 CH 120 h									
Duration	1 semester										
Frequency of offer	irregularly										
Language of instruction	English	nglish									
Type of Exam	Final Project Present	inal Project Presentation and Report									
Content	tic, interesting, behav in developing user in and acting upon object imental setups will be	In this project-oriented practical course, students learn how to design realis- tic, interesting, behaving avatars in virtual realities. Typically the focus lies in developing user interfaces, and new options for interacting with the VR and acting upon objects or other entities within the VR. Alternatively, exper- imental setups will be programmed and optimized in order to run real-world psychological and evaluative experiments in which users control avatars in VR.									
Objectives	Students know how t animated, autonomou and use suitable inter- control avatars within	is avat faces t	ars in	these e	nvironm	ents. TÌ	ney are	able to	create		
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)		
	Practical	Р	f	4	6	tp		g	100		
Requirementforparticipation	Solid Knowledge in P ware.	rograr	nming	. Gene	ral knov	vledge a	bout si	mulatio	n soft-		
Lecturer	Butz										
Literature	none										

Module Number:	Module title					Lect	ure typ	oes		
INFO-4212	Artificial Neural Net	works				Pract	ical Co	urse		
ECTS	6									
Work load										
-Contact time	Work load	C	lass tir	ne		Self-S	Study			
-Self study	180 h	60 h / 4 CH 120 h								
Duration	1 semester	1 semester								
Frequency of offer	irregularly	rregularly								
Language of instruction	English	nglish								
Type of Exam	Final Project Presen	Final Project Presentation and Report								
Content		Programming enhanced functionalities in ANN Software, evaluating perfor- mance, analyzing the system.								
Objectives	Know how to work networks	Know how to work with, implement, and enhance complex artificial neural networks.								
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)	
	Practical	Р	f	2	3	tp		g	100	
Requirement for participation	Solid Knowledge in I or machine learning.	Program	nming.	Know	ledge a	bout arti	ficial ne	ural ne	tworks	
Lecturer	Butz									
Literature	none									

Module Number:	Module title					Lectu	ure typ	es			
INFO-4213	Advanced Artificial I	Advanced Artificial Neural Networks Project Practical Course									
ECTS	3	·									
Work load											
-Contact time	Work load	C	lass tir	ne		Self-S	tudy				
-Self study	90 h	30	0 h / 2	CH		60 h					
Duration	1 semester										
Frequency of offer	irregularly	regularly									
Language of instruction	English	nglish									
Type of Exam	Final Project Presen	Final Project Presentation and Report									
Content	Working with ANN S	Working with ANN Software, evaluating performance, & analyzing the system.									
Objectives	Know how to evaluat	te, prog	gram, a	and ana	alyze art	ificial ne	ural net	tworks.			
Requirement for Credit Points / Grade		Type of Class	Status	СН	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)		
	Practical	Р	f	2	3	tp		g	100		
Requirement for participation	Solid Knowledge in F or machine learning.	Program	nming.	Know	ledge ab	out arti	ficial ne	ural net	works		
Lecturer	Butz										
Literature	none										

Module Number:	Module title					Lectu	ıre typ	oes					
ML-4103	Deep Learning					Lectu	re with	tutoria	ls				
ECTS	6												
Work load													
-Contact time	Work load	C	lass tir	ne		Self-S	tudy						
-Self study	180 h	60) h / 4	CH		120 h							
Duration	1 semester	1 semester											
Frequency	Domilarly on on a rea												
of offer	Regularly once a yea	ιſ											
Language of instruction	English	English											
Type of Exam	Written exam (in cas	se of a	small i	number	of part	icipants:	oral ex	am)					
	course will introduce networks and give an ization techniques. To variants, including co- recurrent neural networks, skip conne- tation invariant networks, skip conne- tation invariant networks, ship conne- ship conne-tation invariant networks, ship conne-tation i	graphics, natural language processing, speech recognition and robotics. This course will introduce the (practical and theoretical) principles of deep neural networks and give an overview over the most established training and regular- ization techniques. The lecture will further discuss the most important network variants, including convolutional neural networks, generative neural networks, recurrent neural networks and deep reinforcement learning. Furthermore, the course will give an overview over the most important architectures (hourglass networks, skip connections, dense connections, dilated convolutions, permu- tation invariant networks, siamese networks, etc.). In addition, applications from various fields will be presented throughout the course. The tutorials will deepen the understanding of deep neural networks by implementing, training											
Objectives	Students gain an un deep neural network plications. After this neural networks, rep this area.	nderstan s inclue s course	nding ling oj , stude	of the ptimiza ents sho	theoreti tion, inf ould be a	cal and j ference, a able to de	practica architec evelop a	tures a and trai	nd ap- n deep				
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)				
	Lecture	L	0	2	3	wt/ot	90	g	100				
	Tutorial	Т	0	2	3								
Requirement for participation	Basic math (linear al coding knowledge (va in Python is recomm	ariables		· · •	•				• /				
Lecturer	Geiger, Zell												
Literature	Related literature wi	ill be lis	sted th	rougho	ut the l	ecture.							

Module Number:	Module title					Lectu	are ty	pes					
ML-4340	Self-Driving Cars					Lectu	re with	tutori	als				
ECTS	6												
Work load													
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy						
-Self study	180 h	60	h / 4	CH		120 h							
Duration	1 semester	semester											
Frequency	Demilerle en er e	Regularly once a vear											
of offer	Regularly once a year	Regularly once a year											
Language of instruction	English												
Type of Exam	Written exam (in case	Written exam (in case of a small number of participants: oral exam)											
	workhorses in the fie traffic fatalities, the well as the increasing promise a solution to of mobility. However, environments requires thus rendering the ta paradigms of self-driv deep-learning based e dar and radar-based p modeling/control, imi will deepen the acquir learning based approx text of autonomous of simulation environme	limited proble one of , makin s a set sk very ving ca end-to-e percept itation red kno aches te driving nts and	d mob em of our sc ng a ca of alg y hard drs: m end dr ion, lo learni wledgo o perc c. Tow d estal	ility of traffic j poieties ar drive gorithm . This odular iving to calization g and e throug eption a vards th poished	elderly ams and most im e on its ic skills course pipeline echnique on, navi reinfoce gh the in and sens us goal, deep lea	and hat aportant own in l that riv will cove -based a es. Topic gation, p ement lea nplemen sori-moto we will arning fra	ndicapp tion, se probles argely val hun r the n pproac cs inclu oath pla arming. tation of pr cont: build	ped ped lf-drivit ms: the uncons han cog- nost do hes as de cam unning, The tu of sever rol in the upon ϵ rks.	ople as ng cars future trained gnition, minant well as hera, li- vehicle itorials al deep he con- existing				
Objectives	Students develop an u of-the-art autonomou the entire system con dition, they are able control.	s drivi nprisin	ng sol g perc	utions. eption,	They g learnin	gain a ba g and ve	asic uno chicle c	derstan ontrol.	ding of In ad-				
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)				
	Lecture	L	0	2	3	wt/ot	90	g	100				
	Tutorial	Т	0	2	3								
Requirement for participation	Basic math (linear alg ence with deep learnin is recommended.	- ·	-			~ 、 *			-				
Lecturer	Andreas Geiger												
Literature	Related literature will	l be lis	ted th	rougho	ut the l	ecture.							

Module Number:	Module title					Lectu	ıre typ	es					
ML-4360	Computer Vision							tutorial	ls				
ECTS	6												
Work load													
-Contact time	Work load	Cl	ass tin	ne		Self-S	tudy						
-Self study	180 h	60	h / 4	CH		120 h							
Duration	1 semester												
Frequency of offer	Regularly once a yea	Regularly once a year											
Language of instruction	English												
Type of Exam	Written exam (in cas	se of a s	small 1	number	of parti	icipants:	oral ex	am)					
Content	reconstructing the 3I and recognizing object computer vision, with era calibration, featur reconstruction, object plications include but organizing photo coll self-driving cars, rob imaging, and mobile on machine learning course therefore assur- lecture) and introduct prediction where nee	the three-dimensional world from digital images. Problems in this field include reconstructing the 3D shape of an object, determining how things are moving and recognizing objects or scenes. This course will provide an introduction to computer vision, with topics including image formation, camera models, cam- era calibration, feature detection and matching, motion estimation, geometry reconstruction, object detection and tracking, and scene understanding. Ap- plications include building 3D maps, creating virtual avatars, image search, organizing photo collections, human computer interaction, video surveillance, self-driving cars, robotics, virtual and augmented reality, simulation, medical imaging, and mobile computer vision. Modern computer vision relies heavily on machine learning in particular deep learning and graphical models. This course therefore assumes prior knowledge of deep learning (e.g., deep learning lecture) and introduces the basic concepts of graphical models and structured prediction where needed											
Objectives	Students gain an un computer vision inclu- multiple view geomet tion, scene understan and graphical models and apply the basic of computer vision mod- search in this area.	uding ir cry, 3D ding an c. After concept	nage f recons d stru this co s of co	ormation struction ctured pourse, s mputer	on, came n, motic oredictic tudents vision	era mode on estima on using should b in practic	els, feat ation, o deep ne be able t ce, deve	ure dete bject re ural net to under elop and	ection, cogni- works rstand train				
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)				
	Lecture	L	0	2	3	wt/ot	90	g	100				
	Tutorial	Т	0	2	3								
Requirement for participation	Basic math (linear al ence with deep learni is recommended.	- ·	-			~			-				
Lecturer	Andreas Geiger												
Literature	Related literature wi	ll be lis	ted th	roughou	ut the le	ecture.							

Module Number:	Module title Lecture types								
ML-4101	Mathematics of Machine	e Learning	Lecture with tutorials						
ECTS	9		,						
Work load									
-Contact time	Work load	Class time	Self-Study						
-Self study	270 h	90 h / 6 CH	180 h						
Duration	1 semester								
Frequency	every year								
of offer	every year								
Language of instruction	English								
Type of Exam	Written exam (in case o	f a small number of partic	pants: oral exams)						
Content	· · · · ·	-	ons of mathematics used in						
	• Calculus: multiv sion etc.	ariate calculus (gradient a	and Hessian), Taylor expan-						
	 Linear Algebra: eigenvectors, eigenvalues (including variational characterization), singular value decomposition and best low rank approximation, inverse and pseudo-inverse, norms, basic algorithms and their complexity (solving linear equations, matrix inversion, eigenvectors (power method)) etc. Probability: discrete and continuous probability measures (and mixed ones), basic notions, generation of random variables, conditional expectation and independence, law of large numbers and concentration inequalities for rates of convergence, central limit theorem etc. 								
	• Statistics: param	etric and non-parametric	tests						
	_	agrangian and dual optimi ues and their properties	ization problem, popular op-						
	• Optional: basic f dimensionality	unctional analysis and ap	proximation theory, curse of						
Objectives	Students learn the math courses. In particular,	nematical foundations for	the latter machine learning						
	• they know multiva learning lectures	riate calculus and linear a	lgebra as needed in machine						
	• they can apply properties	n apply probability and statistics and are able to prove basic ies							
	÷	view of existing optimizat ivalent constrained optime	ion techniques and are able ization problems						

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(noch ML-4101)
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Requirement for Credit Points / Grade	Lecture Tutorial	н г Type of Class	o o Status	HO 2 2	dD 3 3	≰ Type of Exam	06 Duration of Exam	99 Evaluation	01 Calculation of Module (%)
Requirement for participation	Students need to have level of the bachelor			-				-	on the
Lecturer	von Luxburg, Hein	zon Luxburg, Hein							
Literature	The literature for this	s lectur	e will l	be provi	ided at 1	the begin	ning of	the sem	nester.

Module Number:	Module title					Lectu	ıre typ	es	
ML-4201	Statistical Machine Learning Lecture with tutorials							ls	
ECTS	9								
Work load									
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy		
-Self study	270 h	90	h / 6	CH		180 h			
Duration	1 semester								
Frequency	Regularly once a year								
of offer	Regularly once a year	L							
Language of instruction	English	English							
Type of Exam	Written test (in case	of a sn	nall nu	umber o	f partici	ipants: o	ral test	s)	
Objectives	The focus of this lect machine learning. We the general principles alyze their theoretica covered: Supervised n tion; SVMs; kernel m Unsupervised learning multi-dimensional sca graph theory. Introduction to statist tion bounds; VC dim Evaluation and comp Advanced topics in sta compressed sensing, n Students get to know ing algorithms. They don't. They can eva rithms. They can m common pitfalls. The ical point of view.	e will cost for built and some some some some some some some some	over m iilding statisti e learn a. Baye ems, fo nanifo g unive of mac of mac l learn g, onlir nost im stand con achine	any of good r ical pro ing, for esian de or exam ld meth g theory chine le ing, for he learn why cer mpare t e learning	the star nachine perties. examp cision the ple dime ods; spe v: no fre arning a example ing. t classes tain alg the resu- ng appli	adard alg learning The fol le linear heory, los ension re ectral clu ee lunch y; algorithm e low ran s of statis orithms lts of diffections	orithms algorit lowing method ss funct duction istering theorer is. k matri stical m work w ferent 1 and get	s, learn hms, ar topics w ls; regul ions, , kernel ; and sp n; gener x compl nachine ell and o learning a feelin	about an- vill be ariza- PCA, ectral caliza- etion, learn- others algo- ng for
Requirement for Credit Points / Grade	TectmaoTTType of ClassPCHPCHCHCHDuration of ExamBEvaluationModule (%)								
	Tutorial T o 2 3								
Requirement for participation	Students need to known linear algebra and pro-				he basi	c math	classes,	in part	icular
Lecturer	Hein, von Luxburg								
Literature	The literature for this	s lectur	e will	be prov	ided at t	the begin	ning of	the sem	ester.

Module Number:	Module title					Lectu	are typ	oes	
ML-4303	Convex and Nonconv	Convex and Nonconvex Optimization Lecture with tutorials							
ECTS	9								
Work load									
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy		
-Self study	270 h	90	h / 6	CH		180 h			
Duration	1 semester								
Frequency	overy two years								
of offer	every two years								
Language of instruction	English								
Type of Exam	Written test (in case	of a sn	nall nu	umber o	f partic	ipants: c	ral test	s)	
	networks and finance The course will give a optimization such as tion problems such a general nonlinear un in non-smooth conve problems such as d.c tion problems and ha vex problems. While foundations, several timization problems The course requires a culus, but no prior k	an intro dualit as inter constra ex opti . (differ ard com e the er exampl will be a good	y theo vior po ined n mizati- rence o binato nphasi e appl discus backgi	ry, algo int met ninimiza on. Wo of conve- orial pro- is is giv ications sed. cound in	prithms thods b ation, a e will a ex) prog bblems a en on n s togeth n linear	for solvi ut also t and recen lso cover ramming and their hathemater with t algebra	ing com the basis t first-o r relate g, bicon relaxat tical an their mo and mu	vex opt c meth rder me d non-o vex opt ions int d algor odeling	imiza- ods in ethods convex imiza- o con- ithmic as op-
Objectives	Students learn the fe transform optimizati methods for solving guidelines which met	oundati ion pro convex	ions of blems. and r	convex After non-con	analys the leaver opt	is and h ture the imization	ow to f ey know	z a vari	ety of
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Lecture	L	0	4	6	wt	90	g	100
	Tutorial	Т	0	2	3				
Requirement for participation	Students need to kn linear algebra and m is required.								
Lecturer	Hein								
Literature		The lecture does not follow a specific book. The literature for this lecture will be provided at the beginning of the semester.							

Module Number:	Module title					Lectu	ıre typ	oes		
ML-4102	Data Literacy							tutoria	ls	
ECTS	6					,				
Work load										
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy			
-Self study	180 h	80 h 60 h / 4 CH 120 h								
Duration	1 semester					·				
Frequency of offer	Regularly once a year	r								
Language of instruction	English	English								
Type of Exam	Written test (in case	of a sn	nall nu	umber o	f partici	pants: c	oral test	s)		
Content	This course equips sta anyone working with ples, frequently encour practices. We encourn and experimental desi tical data analysis are discuss best practices to make expressive fig and explore ethical and transparency. Apart from mathmat programming. In part the lectures.	(large) intered iter bas ign. Fo e emplo for sci- gures a nd tech tical de ticular) data. pitfal sic stat undat: oyed to entific nd tab mical erivati , they	Based ls and p tistical f ional me o employ data pr oles and consider ons, the contain	on prac problems notions ethods o y these i cesentat: perform rations i e exerci i implen	ctical exp s are disc and prob f machin deas in p ion and o n reprod in the cc ses put nentation	perimer cussed a blems o he learni practice docume ucible e ontext o a focus ns of so	ats and alongsid f bias, t ing and . We with matation- experime f fairnes s on pra me cont	exam- e best esting statis- ill also —how ents— ss and actical cent of	
Objectives	Students develop a s empirical work with a cal, ethical, technical know best practices t ware tools to collect, structured, large, sma	data. ' l and s to addr docum	They pocial of ess the ent, end	understa challeng em. The xplore,	and the es surro ey also o visualiz	mathen ounding collect a e, and d	natical, the use concret	epistem of data te box o	nologi- a, and of soft-	
Requirement for Credit Points / Grade		Type of Class	Status	CH	cP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)	
	Lecture	L	0	2	3	wt	90	g	100	
	Tutorial	T	0	2	3					
Requirementforparticipation	only basic math and coding skills as provided by the BSc Computer Science.									
Lecturer	Hennig									
Literature	Literature will be list	ted at t	he beg	ginning	of the s	emester.				

Module Number:	Module title					Lecti	ıre typ	oes	
ML-4202		Probabilistic Inference and Learning Lecture with tutorials							ls
ECTS	9	9							
Work load									
-Contact time	Work load	Work load Class time Self-Study							
-Self study	270 h	90) h / 6	CH		180 h			
Duration	1 semester								
Frequency of offer	Regularly once a yea	r							
Language of instruction	English								
Type of Exam	Written test (in case	of a sr	nall nu	umber o	f partic	ipants: o	ral test	s)	
	machine learning. The basic principles (rule probabilistic view or classification, and un parallel thread through lar algorithms for in in Gaussian models, connections and different from mathema programming. In parallel thread thread through the lectures.	s of pro n many nsuperv igh the ference sampl erences attical d	babili stand ised d lectur in pro ing, an to non erivati	ty theorem and set imensio e, we we obabilis and free- a-probal ons, th	ry, grapl tings, li nality r ill also tic mod energy bilistic f e exerci	hical mod ike super eduction encounte els, inclu methods Tramewor ises put	dels), the vised r and che er a nur iding en . At sp ks will a focus	nen cove egressio ustering nber of xact info pecific p be mad s on pra	ers the n and . In a popu- erence points, e. actical
Objectives	Students gain an int standing of probabili bilistic models for va for their concrete im become proficient in sophical challenges a build, analyse, and u	istic rea rious p plemer the fu and pit	asoning roblem ntation indame falls a	g. They n classes a. Over ental co ssociate	y acquir s, along the co encept c ed with	e a ment with the urse of t of uncerta it. The	tal tool e algorit he lectu ainty, a ey are e	box of p thms re- ure, the and the empower	proba- quired y also philo- red to
Requirement for Credit Points / Grade		Type of Class Status Status CH CP CP CP Duration of Exam Evaluation Evaluation Calculation of Module (%)							
	Lecture	L	0	4	6	wt	90	g	100
	Tutorial	Tutorial T o 2 3							
Requirement for participation		Standard undergraduate knowledge of mathematics is required, to the extent that is provided, for example, by the course on <i>Mathematics for Machine Learn-</i> <i>ing</i> (ML 4101).							
Lecturer	Hennig, Macke								
Literature	Literature will be lis	ted at t	the beg	ginning	of the s	semester.			

Module Number:	Module title					Lect	ure tyj	oes	
ML-4301	Numerical Algorithm	ns of M	achine	Learni	ng			tutoria	ls
ECTS	6								
Work load									
-Contact time	Work load	C	lass tir	ne		Self-S	Study		
-Self study	180 h	60) h / 4	CH		120 h	Ĺ		
Duration	1 semester		,			I			
Frequency									
of offer	irregularly								
Language of instruction	English								
Type of Exam	Written test (in case	of a sr	nall nu	mber o	f partic	ipants: d	oral test	cs)	
	<i>ulation</i> , i.e. the solut and <i>linear algebra</i> as solved with "black-bo scalable, professional them to the specific t the aforementioned t context of, and withi from classic concepts Apart from mathma	<i>integration</i> for marginalization and conditioning in probabilistic models; <i>simulation</i> , i.e. the solution of differential equations for predictions of the future, and <i>linear algebra</i> as the base case of all of the above. These tasks are often solved with "black-box" tools, but those who want to build highly performant, scalable, professional solutions need to know how these tools worn and adapt them to the specific task. This course introduces basic and advanced tools for the aforementioned tasks. It develops a holistic view of computation in the context of, and within the conceptual framework of machine learning, moving from classic concepts to recent developments. Apart from mathmatical derivations, the exercises put a focus on practical programming. In particular, they contain implementations of some content of							
Objectives	Students develop bot ical methods for opti differential equation. the task at hand, su numerical stability, r and uncertainty calib- sign and use of nume distinguishes the exp	imization They the as front as the second seco	on, int know high d nvexity for im cools is	egration how to imensio , efficient precise a high	n, linea: adapt nality, nt tunin compu ly soug	r algebra the tools stochast ng of alg tation. I ht-after	a, and t s to the icity in corithmi Experie	he solu challen compu c parar nce in t	tion of nges of tation, neters, he de-
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Lecture	L	0	2	3	wt	90	g	100
	Tutorial	Т	0	2	3				
Requirement for participation	Linear algebra is a c is valuable for this co	Linear algebra is a core theme. Knowledge of probabilistic machine learning is valuable for this course. Prior experience with numerical analysis is helpful but not required. The practical parts use python and various recent python							
Lecturer	Hennig								
	Literature will be list								

Module Number:	Module title					Lectu	ıre typ	es	
ML-4320	Time Series					Lectur	re with	tutorial	ls
ECTS	6								
Work load									
-Contact time	Work load	Cl	ass tin	ne		Self-St	tudy		
-Self study	180 h	60	h / 4	CH		120 h			
Duration	1 semester	1				- I			
Frequency of offer	irregularly								
Language of instruction	English								
Type of Exam	Written test (in case	of a sn	nall nu	mber o	f partici	pants: o	ral tests	s)	
Content	A time series is an etially multivariate) see ordered index space- sports statistics, sens and many more. Tim tially be infinitely lon property of the mode the model necessary size. This course intre- flexible inference in the eas of signal processin models for structured Alongside data and m a core focus. Apart from mathmar programming. In par- the lectures.	et of ob- —time. sor reace e series ng. Bu el: Mar for info oduces zime se ng and l, high- nodels, tical de	Exan dings i s often t their kovian erence a rang ries. S contro -dimen efficie erivatie , they	ions that nples in n scient require univar <i>vity</i> , the in a ti ge of mo Starting ol, we w usional, ent algor ons, the	at evolve clude s cific equ real-tin iate dor ability me-loca odels an from fa ill move non-line rithms f	es over a tock pric ipment, ne proces nain also to locall l memor d algorit amous co e to recer ear and i or appro ses put	univar ces, inve cars an ssing, an o allows y store y of fix hms for oncepts at and c irregula ximate a focus as of sor	iate and entory i d mach nd can p for a c all aspe ed and efficient from ti contemp r time s inference on pra	l thus levels, inery, poten- rrucial ects of finite at and he ar- porary series. ce are actical ent of
Objectives	Students develop an lenges in the analysis and data. They can such data, including eas demanding high of mathmatical derivation In particular, they co	s of, an imple for pro quality ons, th	nd prace ement oduction predic e exerci	ctical ir and de on-level, tions, su cises pu	nference bug bas large-se uch as se t a focu	with tin sic and a cale appl cientific a us on pra	ne-orde dvance lications analysis analysis analysis ent of th	red pro d mode s, and f . Apart program	cesses els for or ar- t from ming.
Requirement for Credit Points / Grade	T	Type of Class	Status	e CH	cP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Lecture L o 2 3 $tp+op$ 90 g 100								
	Tutorial	Т	0	2	3	D · · · ·			
Requirement for	ů -								
participation	ing (ML-4202) is required.								
Lecturer	Hennig, Tronarp Literature will be listed at the beginning of the semester.								
Literature	Literature will be list	ed at t	ne beg	ginning	of the s	emester.			

Module Number:	Module title					Lect	ure typ	oes	
ML-4310	Data Mining and Pro	r		re with		ls			
ECTS	3					J			
Work load									
-Contact time	Work load	Work load Class time Self-Study							
-Self study	90 h	45	5 h / 2	CH		$45 \mathrm{h}$			
Duration	1 semester								
Frequency of offer	regularly in the wint	er term	1						
Language of instruction	English								
Type of Exam	Written test (in case	of a sr	nall nu	umber o	of partic	ipants: o	oral test	s)	
Content	The lecture gives an tics, information theorem representations and probabilistic inference	ory, da link ar	ta (pre alysis,	-)proce classif	essing an ication,	nd index	ing tech	niques,	graph
Objectives	 The students ac methods from the fie The students acq ing, problem formaliz The students are of data science. 	ld of d uire va zation	ata sci rious c and pr	ence. lata sci oblem s	ence teo solving.	chniques	for cone	ceptual	think-
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Lecture	L	0	1	2	wt	90	g	100
	Tutorial	Т	0	1	1				
Requirement for participation			·			•			·
Lecturer	Gjergji Kasneci								
Literature	Will be supplied (bo	ok chaj	pters a	nd pap	ers in E	nglish)			

Module Number:	Module title					Lectu	ıre typ	es		
ML-4302	Statistical Learning Th	heory						Tutoria	ls	
ECTS	6									
Work load										
-Contact time	Work load	Class	s time			Self-St	tudy			
-Self study	180 h	60 h 60 h / 4 CH 120 h								
Duration	1 semester					1				
Frequency										
of offer	irregularly									
Language of instruction	English	nglish								
Type of Exam	Written exam (in case	of a sm	all nur	nhor	of parti	inante	oral ov	ame)		
Content	Part 1: basic results in				-	-	orar ex	ams)		
Content	• Statistical setup,			~	•		or, cons	istency		
	• Negative results:	No free	e lunch	theo	rem, slo	w rates	of conv	ergence		
	• Consistency of k	nearest	neighb	or alg	gorithms	s and par	rtitionii	ng algor	ithms	
	• Concentration in	equalitie	es							
	- 0	• Simple generalization bounds, for example with shattering coefficients and VC dimension						cients		
	• Advanced general plexities, algorith					-	g Rade	macher	com-	
	• Regularization ar Part 2: advanced result changes, depending on the art in the field and could cover topics like of deep learning, etc.	ts in sta the int covers :	atistica terests some o	l lear of th of the	e audie recent	nce and results o	the cuin learn	rrent st ing theo	ate of ory. It	
Objectives	Students get to know t theory. They understa particular what are the properties are importan	and posi e fundam	itive a nental l	nd ne limita	egative 1 tions of	esults ir machine	n learni e learnii	ng theo ng, and	ry, in	
Requirement for Credit Points / Grade	Ę	Type of Class	Status	CII	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)	
	Lecture I	L c	o 2	2	3	wt	90	g	100	
	Tutorial	т с	o 2	2	3					
Requirement for	Students need to know the contents of the basic math classes, in particular									
participation	linear algebra and probability theory.									
Lecturer	Ulrike von Luxburg									
Literature	The literature for this l	lecture w	will be	provi	ded at t	he begin	ning of	the sem	lester.	

Module Number:	Module title					Lectu	ıre typ	es	
ML-4502	Machine learning met	Machine learning methods for scientific discovery							
ECTS	3					,			
Work load									
-Contact time	Work load	Work load Class time Self-Study							
-Self study	90 h	30	h / 2	CH		60 h			
Duration	1 semester								
Frequency of offer	irregularly								
Language of instruction	English								
Type of Exam	Oral presentation, we	ritten r	eport						
Content	describe machine lea From a methodologic based inference appr machine learning me	In this seminar, we will discuss current and classical research papers which describe machine learning methods for applications in the natural sciences. From a methodological perspective, a particular focus will be on 'simulation- based inference approaches', as these provide a bridge between data-driven machine learning methods, and theory-driven scientific modelling, as well as on latent-variable models for inferring dynamical systems from data.							
Objectives	Students are able to research area. They They can present curr can lead research disc a paper in form of a	can cr rent res cussion	riticall _j search s. The	y assess results t y can s	s the co to other ummari	ntributic students	ons of s and re	such a j searche	paper. rs and
Requirement for Credit Points / Grade	Type of Class Status Status CH CP CP CP Type of Exam Duration of Exam Evaluation Evaluation of Module (%)							.	
	SeminarSo23wp+tp30g100								
Requirementforparticipation	Basic knowledge probabilistic machine learning								
Lecturer	Macke								
Literature	Will be announced in	the fir	rst me	eting					

Module Number: ML-4601	Module title Introduction to Game ' to Multi-Agent Systems	Theory with Application	Lecture types Lecture			
ECTS	6					
Work load						
-Contact time	Work load	Class time	Self-Study			
-Self study	180 h	60 h / 4 CH	120 h			
Duration	1 semester					
Frequency of offer	regularly in the winter s	emester				
Language of instruction	English					
Type of Exam	Written Exam					
Content	applications in different game theory such as equ Besides, they learn abou librium in repeated gam Also, they obtain knowl ing solution, auctions, a In brief, the students ob theory such as competiti tion to studying detailed uniqueness of equilibrium tions, the students beco and distributed control, ferent applied problems	domains. The students st uilibrium, belief, best-resp at strategic- and extensive edge regarding other topic and computational models tain broad knowledge abou- ve-, cooperative-, and beh mathematical results, e.g. n in well-known scenarios, me familiar with the conn- and they gain experience using game theory.	design, with an emphasis on udy the essential concepts in onse dynamics, and the like. form games, achieving equi- e and imperfect information. cs such as the Nash bargain- s of human decision-making. It different branches of game avioral game theory, in addi- , regarding the existence and . Besides theoretical founda- tection between game theory in modeling and solving dif-			
Objectives	After the lectures, the students have a broad and profound knowledge of es- sential concepts of game theory. Therefore, they can identify the problems in the applied domains that can be modeled based on game theory. The students possess the ability to solve such problems by using the mathematical tools that they have learned in this module. Besides, they have a high level of proficiency in selecting, reading, analyzing, and criticizing scientific results, preparing tech- nical presentations, holding talks, and participating in discussions. Finally, the students are independent learners and can expand their knowledge to advanced levels in various topics of game theory.					
Requirement for						
participation Lecturer	Maghsudi					
Lotter	magnouu					

(noch ML-4601)	
Literature	
	 Mas-Colell and M.D. Whinston, and J.R. Green, Microeconomic Theory, Oxford University Press, 1995
	 Ozduglar, Game Theory with Engineering Application, MIT Open- CourseWare, 2009
	 Fudenberg and D. Levine, The Theory of Learning in Games, MIT Press, 1998
	• Fudenberg and J. Tirole, Game Theory, MIT Press, 1991
	• Vijay, Auction Theory, Harvard University Press, 2008
	-

Module Number:	Module title		Lecture types						
MEDZ-4110	Advanced Medical Infor	matics	Lecture, Tutorial						
ECTS	9								
Work load									
-Contact time	Work load	Class time	Self-Study						
-Self study	270 h	70 h 90 h / 6 CH 180 h							
Duration	1 semester								
Frequency	once per year								
of offer	once per year								
Language of instruction	English								
Type of Exam	Oral Exam								
Content		lifferent areas of Medical	Informatics. The focus is on						
	data integration, medica	al data privacy, artificial	intelligence and data mining systems. Specific topics are:						
	• statistical machine	e learning basics							
	• state-of-the-art in	decision support systems	and beyond						
	• differential privacy	7							
	• k-anonymity								
	• privacy-preserving	record linkage							
		approaches and GO-FAI	R						
	• genome privacy								
	• FHIR								
	• openEHR								
	-	nd no-SQL data bases							
	 data watenouses a map reduce	nd no-5 gr data bases							
	• map reduce								
Objectives	The students are capable of explaining the most important terms, methods and theories of clinical decision support systems, medical data privacy, and data integration and analysis. They are enabled to decide which type of methods fit to which kind of data sets. The students can critically reflect on shortcomings of state-of-the-art methods to potentially come up with ideas for extending or improving the methods.								
Requirement for participation	recommended: Grundlagen der Medizininformatik								
Lecturer	Pfeifer								
Literature	Eta S. Berner: Clinical Decision Support Systems - Theory and Practice, A. Gkoulalas-Divanis and G. Loukides: Medical Data Privacy Handbook, P. Lake and P. Crowther: Concise guide to databases								

Module Number:	Module title					Lect	ure typ	oes		
INFO-4492	Special Topics in Learning Theory						re, Tute	orials		
ECTS	6					,				
Work load										
-Contact time	Work load		lass tin	ne		Self-S	tudy			
-Self study	180 h	60)h/4	CH		120 h				
Duration	1 semester									
Frequency of offer	irregularly	irregularly								
Language of instruction	English or German, o	lepend	ing on	the pa	rticipan	ts				
Type of Exam	Written exam (in cas	se of a	small r	number	of part	icipants:	oral ex	ams)		
Content	In this module we discuss advanced results and approaches in learning theory and current research results in the area of machine learning in general.									
Objectives	Students get to know judge whether an alg statistical point of vi of machine learning. module they are well theory.	gorithn ew. Tl They	n is we ney un can re	ell desi derstar eflect c	gned, b 1d abou ⁻ urrent r	oth from t the fun esearch o	an alg dament questior	gorithm al limit ns. Afte	ic and ations er this	
Requirement for Credit Points / Grade	T	Type of Class	Status	cH	cP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)	
	Lecture	L	c	2	3	wt	90	g	100	
	Tutorial	T	c	2	3			<u> </u>		
Requirementforparticipation	Solid knowledge in m in machine learning	aths (l	inear a	lgebra,	probab	ility theo	ory); Ba	sic know	wiedge	
Lecturer	von Luxburg									
Literature	will be announced in	the lea	cture							

Module Number:	Module title Lecture types						es		
INFO-4493	Learning Theory					Semin	ar		
ECTS	3								
Work load									
-Contact time	Work load	Cl	ass tin	ne		Self-S	tudy		
-Self study	90 h 30 h / 2 CH 60 h								
Duration	one semester								
Frequency of offer	irregularly								
Language of instruction	English or German, d	lependi	ing on	the par	rticipan	ts			
Type of Exam	Oral presentation, wr	itten r	eport.						
Content	In this seminar we discuss current research papers in the area of machine learn- ing theory, in the form of student's presentations and guided discussions.								
Objectives	Students are able to a of learning theory. The They can present curr can lead research disc a paper in form of a s	ney car cent res cussion	a critic search s. The	ally ass results y can s	ess the to other ummari	contribut • students	tions of s and re	such a searche	paper. rs and
Requirement for Credit Points / Grade	Seminar	co Type of Class	o Status	HO 2	dD 3	g Type of Exam	27 Duration of Exam	B Evaluation	001 Calculation of Module (%)
Requirement for			-	_	0	op	40	В	100
Requirementforparticipation	Basic knowledge in m	lachine	e iearni	ng.					
Lecturer	von Luxburg								
Literature	will be announced in	the lec	ture						

Module Number:	Module title	Module title					ıre typ	es	
INFO-4381	Advanced Topics in Human-Computer Interaction					Semin	ar		
ECTS	3								
Work load									
-Contact time	Work load Class time Self-Study								
-Self study	90 h	30	h / 2	CH		60 h			
Duration	one semester								
Frequency of offer	irregularly								
Language of instruction	English								
Type of Exam	Oral presentation of at least 30 minutes and written report (essay at least 8 pages)								
Content	This seminar covers current and varying topics from research and application in the field of (multimodal) human-machine interaction.								
Objectives	Students will read and computer interaction. dents and researchers and evaluate the resu	They as well	can p l as lea	resent o id resea	current 1 rch discu	research issions.	results They ca	to othe an sumr	er stu- narize
Requirement for Credit Points / Grade		Type of Class	Status	• CH	cP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Seminar	S	0	2	3	tp	30	g	100
Requirementforparticipation	none								
Lecturer	Kasneci								
Literature	none								

Module Number:	Module title Lecture types								
ML-4501	Machine Learning Se	minar				Semin	ar		
ECTS	3								
Work load									
-Contact time	Work load	Cl	ass tin	ne		Self-St	tudy		
-Self study	90 h	30	h / 2	CH		60 h			
Duration	1 semester								
Frequency of offer	regularly in the winter/summer								
Language of instruction	English								
Type of Exam	Oral presentation and	d writte	en rep	ort					
Content		In this module we discuss advanced results and approaches in machine learning theory and application and current research results in the area of machine learning in general.							
Objectives	Students get to know applications. They of signed, both from an stand about the fund current research ques current findings throu importance of current that there are still ma their study and readin working independent the students' confider cation skills and enable their presentation. A thesis in the area of r	can jud a algori amenta stions. ugh con t topics any ope ing skil ly. The nce (or aling the fter thi	ge for thmic il limit Stude: nprehe in the en ques ls, but teach al pres em to s mod	example and stations of nts will ensive life e area of stions. St t will al ing met accept of ule they	le whet atistical of machi- be able iterature f machin Student so have hod in t n), and criticism	her an a point of ne learni to acque e search. ne learnin s will not enhance this semi- at enhan (discuss	lgorith view. ing. Th ire kno They ng, and c only h d their nar aim acing th sion ses	They under the second s	ell de- inder- reflect about ow the aware proved lity of osting muni- owing
Requirement for Credit Points / Grade		Type of Class Type of Class Status Status CH CH CP CP Duration of Exam Calculation Module (%) (%)							Calc Mod
	Seminar	\mathbf{S}	0	2	3	$_{\rm tp+op}$	30	g	100
Requirementforparticipation									
Lecturer	All lecturers in the co			nce depa	artment				
Literature	Will be handed out in	n the c	ourse						

Required elective modules: BIO-BIO

Module Number:	Module title Lecture types								
BIO-4103	Group Project Bioinform	matics	Small Team project						
ECTS	3								
Work load									
-Contact time	Work load	Class time	Self-Study						
-Self study	90 h	15 h / 1 CH	75 h						
Duration	1 semester	1 semester							
Frequency of offer	each Semester	each Semester							
Language of instruction	English	English							
Type of Exam	Written Report								
Content	matics that have been in formatics" (BIO-4110) 4120). Students work with the thematic focus algorithmic problems, li ical data. The idea is to	The group project serves to deepen the knowledge in a specific area of bioinfor- matics that have been introduced in either of the two lectures "Sequence Bioin- formatics" (BIO-4110) oder "Structure and Systems Bioinformatics" (BIO- 4120). Students work in small groups (4 students) and work on a project with the thematic focus of either of the lectures. The project topics encompass algorithmic problems, literature investigations, or application of tools to biolog- ical data. The idea is to apply gained knowledge to real biological data/tasks. Student have the opportunity to suggest a topic.							
Objectives	The students gain insight into s 	cientific work,							
	• learn how to indep	pendently pursue a rese	arch question,						
	• learn to independ research question		pile scientific literature for the						
	• are able to work it	n a team,							
	• deepen their prob	lem-solving skills.							
Requirement for participation	BIO-4110 or BIO-4120								
Lecturer	The lecturers of either l	BIO-4110 or BIO-4120							
Literature	Scientific literature/pub	blications relevant for th	e topic to be worked on						

Module Number:	Module title					Lectu	ıre typ	oes			
BIO-4998	Research Project Bio	Research Project Bioinformatics Research Project									
ECTS	9										
Work load											
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy				
-Self study	270 h	270 h 90 h / 2 CH 180 h									
Duration	1 semester	1 semester									
Frequency of offer	each semester										
Language of instruction	English	English									
Type of Exam	Presentation and wr (15-20 pages))	ritten r	eport	(either	as a sc	ientific p	oaper o	r as a	report		
Content	specific area of bioin	The research project aims to deepen theoretical and practical knowledge in a specific area of bioinformatics. Students participate in a research project with the thematic focus of the research group.									
Objectives	The students										
	• gain insight into scientific work,										
						1 (
	• learn how to in	• learn how to independently pursue a research question,									
	• learn to indeper research questi				l compi	le scienti	ific lite	rature f	or the		
	• are able to wor	rk in a t	team i	n a scie	ntific in	ternatior	nal envi	ronmen	t,		
	• deepen their p	roblem-	solving	g skills.							
		SS				m	Duration of Exam		of		
Requirement forCreditPoints		Type of Class				Type of Exam	n of	ion	Calculation of Module (%)		
Grade		e of	sn			e of	atio	uat	ulai lule		
		[yp	Status	CH	GP	[yp	Dura	Evaluation	Calc		
	Research Project	R	01	2	9	tp,op		g	100		
Requirement for			-		Ŭ		ics. T	-			
participation	a few research proje	-									
	including a letter of							hould b	e sent		
	to the research group						et.				
Lecturer	All lecturers in bioin										
Literature	Scientific literature/I	publicat	ions re	elevant	to the re	esearch to	opic bei	ing addi	ressed.		

Module Number:	Module title Lecture types							
BIO-4382	Machine Learning for Si	ngle Cell Biology	Lecture, Tutorial					
ECTS	6							
Work load								
-Contact time	Work load	Class time Self-Study 60 h / 4 CH 120 h						
-Self study	180 h	60 h / 4 CH 120 h						
Duration	1 semester							
Frequency of offer	every year							
Language of instruction	English							
Type of Exam	Oral test							
Content	Single-cell technologies in conjunction with machine learning approaches are transforming the life sciences and the understanding of complex diseases like cancer. This lecture provides an introduction into (1) the biological and medical questions that can be uniquely addressed by such single-cell approaches, (2) state-of-the-art single-cell technologies such as high dimensional mass-/flow cytometry, multi-omic and/or spatial single-cell sequencing/imaging, and (3) (un-)supervised machine learning and dynamic modeling approaches to address afore questions on the basis of high dimensional single-cell data.							
Objectives	 Translation of bio ing problems Unsupervised/Sup 	ervised/Weakly-supervise n of cellular composition disease states	ogies uestions into machine learn- d machine learning models of tissues and their associ-					
Requirement for participation	Programming skills in F	lython						
Lecturer	Claassen							
Literature	TBD							

Module Number: BIO-4383	Module title Advanced Topics in Ma Cell Biology	Lecture types Seminar							
ECTS	3								
Work load									
-Contact time	Work load Class time Self-Study oo l oo l co l								
-Self study	90 h	90 h 30 h / 2 CH 60 h							
Duration	1 semester								
Frequency of offer	every year								
Language of instruction	English								
Type of Exam	Presentation (about 30 minutes) and written elaboration (approx. 10 pages), leading the discussion once								
Content	(BIO-4382) and discuss	es current scientific public	ning for Single Cell Biology' cations on machine learning ence and translational single-						
Objectives	Machine LearningPresentation of puDiscussion of studDeepening of Unsu	for Single Cell Biology ablications y results	art publications in the field kly-supervised and dynamic ll biology						
Requirementforparticipation	BIO-4382 or equivalent	course							
Lecturer	Claassen								
Literature	Articles / scientific publ	lications for each individua	al topic						

Module Number:	Module title					Lect	ure tyj	pes		
BIO-4242	Advanced Java in B	Advanced Java in Bioinformatics Lecture and tutorials								
ECTS	6					1				
Work load										
-Contact time	Work load	C	lass tir	ne		Self-S	Study			
-Self study	180 h	60	0 h / 4	CH		120 h	_			
Duration	1 semester									
Frequency of offer	every two years	every two years								
Language of instruction	English	English								
Type of Exam	Programming project	:t								
Content	gramming problems dimensional graphics	In this course, we study the latest features of Java to address challenging pro- gramming problems in bioinformatics. Topics include JavaFx, two- and third- dimensional graphics, properties and bindings, animation, concurrent program- ming and webprogramming. We will build a full-featured, interactive bioinfor- matics program.								
Objectives	The students are abl program. They are an appropriate solu limitations of the ap able to analyse prob In particular, a high is encouraged.	able to tion. ' plicationed to the second s the second sec	analy They a on of J n a scie	ze a co are awa ava to entific l	mputat are of b solve co evel and	ional pro oth the omputati d summa	blem a possibi onal ta tise the	nd to d lities an sks. Th em in w	evelop nd the ey are riting.	
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)	
	Lecture	L	0	4	6	wt	90	g	100	
Requirement for participation	BIOINF4110 Sequen	ice Bioi	informa	atics						
Lecturer	Huson	Huson								
Literature	Programming and b	ioinforr	natics	literatu	re					

Module Number:	Module title	Module title Lecture types										
BIO-4311	Microbiome analysis					Lectu	re, Tuto	orials				
ECTS	6											
Work load												
-Contact time	Work load	Cl	ass tin	ne		Self-S	tudy					
-Self study	180 h	60	h / 4	CH		120 h						
Duration	1 semester	1 semester										
Frequency of offer	every two years	every two years										
Language of instruction	English	English										
Type of Exam	Written or oral exam	L										
Content	include: Sequencing gene. Community p alignment-based taxo ple comparison and t	This course provides an in-depth introduction to microbiome analysis. Topics include: Sequencing technologies. Community profiling using the SSU rRNA gene. Community profiling using shotgun sequencing. Alignment-free and alignment-based taxonomic profiling. Functional analysis and profiling. Sam- ple comparison and time-series analysis.										
Objectives	The students are familiar with recent bioinformatics findings on microbiome analysis. They can formulate the challenges of microbiome analysis for bioin- formatics. They know algorithms for taxonomic and functional analysis of mi- crobiome sequencing data, statistical methods for comparison and methods for community profiling using 16S sequences. Students can analyse microbiome sequencing data and perform profiling and comparison. They are aware of both the possibilities and the limitations of different methods in this subfield of bioinformatics. They are able to analyse problems on a scientific level and summarise them in writing. In particular, a high degree of intrinsic motivation											
	and personal respons	-	-		a high	degree of	f intrins	sic moti				
Requirement for Credit Points / Grade		-	is enco		a high	Type of Exam	f intrins Duration of Exam	Evaluation				
Credit Points /	and personal respons	Type of Class	-	HO	a high		Duration of Exam	Evaluation	Calculation of Module (%)			
Credit Points /	and personal respons	sibility i	Status	ouraged	a high	Type of Exam			vation			
Credit Points / Grade Requirement for	and personal respons	Type of Class	o Status o o	HO 2 2	a high	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)			
Credit Points / Grade	and personal respons	Type of Class	o Status o o	HO 2 2	a high	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)			

Module Number:	Module title								
BIO-4399	Advanced Topics in I	Advanced Topics in Bioinformatics Lectures and tutorials							
ECTS	6					,			
Work load									
-Contact time	Work load	CI	lass tir	ne		Self-S	Study		
-Self study	180 h	60	h / 4	CH		120 ł	1		
Duration	1 semester								
Frequency of offer	every two years	every two years							
Language of instruction	English	English							
Type of Exam	Written exam or ora	l exam							
Content	In this course, we explore new and important developments in bioinformat- ics. This can be driven by new technologies, new biological questions with a computational angle, or new methodologies. Typically, in the first third of the course we will cover the background and introductory material. We then study the new developments in detail in the second third of the course. In the final third, we discuss open problems and possible solutions.								
Objectives	The students are fan formulate the main of in that topic. They different methods in level and summarise motivation and perso	halleng are awa the topi them i	ges in t are of ic. The n writ	hat top both tl ey are a ing. In	ic. The ne possi ble to a particu	y can an ibilities a nalyse pi ilar, a hi	alyse d and the roblems	ata that limitat s on a sc	arises ions of ientific
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Lecture	L	0	2	4	wt	90	g	100
	Tutorial	Т	0	2	2				
Requirement for participation	BIO-4110 Sequence	Bioinfo	rmatic	5					
Lecturer	Huson								
Literature	Lecture notes and sc	ientific	t publi	cations					

Module Number:	Module title Lecture types								
BIO-4371	Structure-Based Drug I	Design	Lecture, Tutorial, Project						
ECTS	6								
Work load									
-Contact time	Work load	Class time	Self-Study						
-Self study	180 h	60 h / 4 CH	120 h						
Duration	1 semester	1 semester							
Frequency of offer	regularly	regularly							
Language of instruction	English								
Type of Exam	Oral exam or, in case of too many students, written exam. 50% of the achievable points from the assignments and the project, individually, are required for exam admission. Points achieved in excess of 50% serve as a bonus for the final exam.								
Content	process, the lecture condrug design (CADD). R cussed followed by basis proteins). In the second teins and ligands are predict protein-ligand bind docking. Finally, the ch	Starting with a broad introduction of the pharmaceutical drug development brocess, the lecture conveys key concepts of structure-based computer-aided drug design (CADD). Required basics on pharmaceutical key concepts are dis- cussed followed by basic concepts for modeling of 3D structures (ligands and proteins). In the second part key physicochemical interactions between pro- eins and ligands are presented, forming the basis to discuss strategies to pre- lict protein-ligand binding with a strong focus on algorithms for protein-ligand locking. Finally, the challenging task of estimating binding affinities between proteins and ligands <i>in silico</i> is introduced, leading to the discussion of scoring							
Objectives	cess. They are familiar work ods to resolve them expare able to identify relevant have detailed knowledge binding (docking and set to work with protein-li	with protein and ligand str erimentally, with methods want physicochemical inter e of algorithmic technique coring). The students are gand structures and to de ned their ability to work i	maceutical development pro- uctures, with standard meth- to model 3D structures, and factions between them. They ues to predict protein-ligand able to implement methods levelop simple CADD tools. n a team and to write down						
Requirement for participation		. Basic knowledge of prot skills in Python are recor	zein structure, organic chem- nmended.						
Lecturer	Kohlbacher								
Literature	 Konbacher Lecture slides and additional materials will be provided in electronic form, handouts of the slides are provided in the lecture. Recommended textbooks: Leach A. "Molecular Modelling", Prentice Hall 2001 Schlick T. "Molecular Modeling and Simulation", Springer 2010 Klebe G. "Wirkstoffdesign", Springer 2009 								

Module Number:	Module title Lecture types							
BIO-4372	Cheminformatics		Lecture, Tutorial, Project					
ECTS	6							
Work load								
-Contact time	Work load	Class time	Self-Study					
-Self study	180 h	60 h / 4 CH	120 h					
Duration	1 semester							
Frequency	· 11							
of offer	irregularly							
Language of	English							
instruction	Ť							
Type of Exam	able points from the ass	Oral exam or, in case of too many students, written exam. 50% of the achiev- able points from the assignments and the project, individually, are required for exam admission. Points achieved in excess of 50% serve as a bonus for the final exam.						
Content	Starting with an overview of its main application area, namely drug design, the lecture teaches how computer science methods can be used to work with chemical data, strongly focusing on small organic molecules (compounds). Rep- resentation of compounds (graphs, line notations, file formats) is followed by most important ways of topological comparison (identity, substructure, similar- ity). Relevant applications of topological similarity are introduced (searching, clustering, library generation). Quantitative Structure-Activity Relationship (QSAR) is introduced as the cheminformatics branch for predictive modeling of chemical properties. Finally, the prediction of 3D-structures from topology and similarity methods for compounds with 3D coordinates are introduced.							
Objectives	Students know how different kinds of chemical data can be handled with com- puters, how to represent and to analyse that data with methods from com- puter science, and they have an overview of the main application area drug design. Having understood the fundamental "Similar Property Principle" they are able to handle and to analyse experimental screening data and to implement and apply ligand-based screening methods. Students have a solid knowledge on standard tools and software libraries for cheminformatics. Project work strengthened their ability to work in a team and to write down and to present scientific work.							
Requirementforparticipation	-	. Basic knowledge of orga in Python are recommend	nic chemistry, graph theory, led.					
Lecturer	Kohlbacher							
Literature	 Lecture slides and additional materials will be provided in electronic form, handouts of the slides are provided in the lecture. Recommended textbooks: Leach A., Gillet V. "An Introduction To Chemoinformatics", Springer 2007 Faulon JL., Bender A. (Eds.) "Handbook Of Chemoinformatics Algorithms", CRC Press 2010 Engel T., Gasteiger J. (Eds.) "Chemoinformatics", Wiley-VCH 2018 Optional: Klebe G. "Wirkstoffdesign", Springer 2009 							

Module Number:	Module title					Lectu	ure typ	es			
BIO-4364	Visualization of Biole	ogical I	Data				re, Tuto				
ECTS	6					,					
Work load											
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy				
-Self study	180 h	60	h / 4	CH		120 h					
Duration	1 semester	1 semester									
Frequency of offer	Regularly in the wint	Regularly in the winter semester									
Language of instruction	English										
Type of Exam	Oral Exam (or writte	en exan	n if nu	mber of	f partici	pants is	large)				
Content Objectives	and more from an hy As a result, the visual than in the past. The with modern method Information Visualiz abstract data that has data is covered in II how to apply these provides hands-on tra- visualization', 'what data to gain insight if and further targeted a of biology is required.	As biological datasets increase in size and complexity, we are moving more and more from an hypothesis-driven research paradigm to a data-driven one. As a result, the visual exploration of that data has become even more crucial than in the past. The aim of this lecture is to familiarize the participants with modern methodologies of Information Visualization and Visual Analytics. Information Visualization is concerned with methods for the visualization of abstract data that has no inherent spatial structure (the visualization of spatial data is covered in INF3145 - Scientific Visualization). The lecture imparts how to apply these methods to biological data using practical examples and provides hands-on training during the tutorials. Questions such as 'what is data visualization', 'what is visual analytics', and 'how can we visualise (biological) data to gain insight in them, so that hypotheses can be generated or explored and further targeted analyses can be defined' are discussed. No prior knowledge of biology is required, that is, the lecture is also suitable for students from other fields such as computer science or media/medical informatics.									
Objectives	Students understand information visualiza methods to visualize data. They are able and the given analys complex, interactive	tion an divers to chos is task	d the ' e biolo e suita . The	do's' an ogical da able visu student	id 'don' ata like ializatio s will b	ts' of vist genomic ons based be able to	ualizations or transformed to the tensor of tens	on. The anscript e type o n and de	know comics f data		
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)		
	Lecture	L	0	2	4	ot	30	g	100		
	Tutorials	Т	0	2	2						
Requirementforparticipation	-					·					
Lecturer	Krone, Nieselt										
Literature	Lecture slides will be Analysis and Design' izing biological data'	, A K I	Peters,	2014.]	Nature 1	Methods	Supple	ment 'V			

Module Number:	Module title				Lect	ure typ	oes				
BIO-4331	Advances in Computa	tional Trai	scripton	nics		ure, Tute					
ECTS	6										
Work load											
-Contact time	Work load	Class t	ime		Self-S	Study					
-Self study	180 h	60 h /	$4 \mathrm{CH}$		120 ł	1					
Duration	1 semester										
Frequency											
of offer	once a year	once a year									
Language of	English										
instruction											
Type of Exam	Written exam (oral ex	am for sm	all numb	er of par	rticipan	ts)					
Content	Functional genomics, i.e. the interpretation of a genome to determine the bi- ological function of genes and gene interactions, is one of the most important fields in modern biology. Today, "next-generation" sequencing technologies are increasingly being used to measure the expression of thousands of genes simulta- neously. This results in new challenges for bioinformatics, both algorithmically and software-wise. In the lecture the following topics will be discussed among others: NGS technologies, in particular RNA-Seq and ChIP-Seq technologies, fast to ultrafast alignment methods of short reads, mapping-based and de novo 'assembly' of genomes and transcriptomes, peak calling, splicing and gene mod- els, motif search, differential expression, visualization of NGS data and other current topics. In the exercises, especially scientific work and scientific writ- ing is encouraged. The exercises are also supplemented with blended learning methods										
Objectives	The students are fami analysis and the newe lenges of the new tech the quantification of er procedures for the calc as methods for the and can analyse real micro have deepened their R but also the limitation They are able to anal in writing. In particu- responsibility is encou	r sequencin nologies for xpression d culation of c alysis of ex- parray expec- k knowledg as of different lyse proble ular, a high	ng techno or bioinfe ata, stat lifferentia pression riments e. The s ent methors ms on a	blogies. ' ormatics istical m al expres data in as well a tudents ods in th scientifi	They ca s. They nethods a netwo as RNA are awa nis subf c level	n formu know a and ma d classifi ork cont -Seq exp are of th ield of b and sur	late the algorith chine le ication a ext. Str perimen a possil ioinform nmarise	e chal- ms for arning as well udents ts and bilities natics. e them			
Requirement for Credit Points / Grade		T Type of Class Status	HO 2	dD 4	Type of Exam	06 Duration of Exam	Perton	001 Calculation of Module (%)			
		_	$\begin{vmatrix} 2\\2 \end{vmatrix}$	$\begin{vmatrix} 4\\2 \end{vmatrix}$	WU	90	g	100			
Requirement for participation											
	Nieselt										
Lecturer	Nieselt										

Module Number:	Module title Lecture types										
MEDZ-4991	Medical Data Science	e					re, Tuto				
ECTS	6					1					
Work load -Contact time	Work load	C	lass tin	ne		Self-S	tudy				
-Self study	180 h		h / 4			120 h	oudy				
Duration	1 semester					1-0 11					
Frequency of offer	once per year										
Language of instruction	English										
Type of Exam	Written Exam										
Content	 statistical machine leads health care over the or large biological data improve preventive or stored in a way that or and consequently but between variables. The principals, provide emedical professionals Gaining new im Modeling unceret Making medical systems Method-wise, the lect methods for sequence problems" (e.g., dorning), methods for learning models), methods for 	 This lecture comprises different areas of Medical Data Science. Data Science or statistical machine learning methods have the potential to transform personal health care over the coming years. Advances in the technologies have generated large biological data sets. In order to gain insights that can then be used to improve preventive care or treatment of patients, these big data have to be stored in a way that enables fast querying of relevant characteristics of the data and consequently building statistical models that represent the dependencies between variables. These models can then be utilized to derive new biomedical principals, provide evidence for or against certain hypotheses, and to assist medical professionals in their decision process. Specific topics are: Gaining new insights from medical data Modeling uncertainty in medical data science models Making medical findings available through interpretable decision support systems Method-wise, the lecture introduces methods for GWAS analyses (e.g., LMMs), methods for sequence analysis (e.g., kernel methods), methods for data integration (advanced unsupervised learning methods), methods for learning probabilistic Machine Learning models (e.g., graphical models), methods for large data sets (e.g., deep learning models).									
Objectives	The students are cap theories in the data s They are enabled to o The students can cri to potentially come u	science decide v tically 1	area w vhich t reflect	ith focu ype of r on shor	us on th nethods rtcoming	e analysi s fit to wh gs of stat	s of bio nich kind e-of-the	medical d of dat e-art me	a data. a sets. ethods		
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)		
	Lecture	L	c	2	4	wt	90	g	100		
	Tutorial	Т	с	2	2						

(noch MEDZ-4991)

Requirement for participation	recommended: Machine learning: theory and algorithms or Introduction to Statistical Machine Learning for Bioinfos and Medicine Infos
Lecturer	Pfeifer
Literature	Trevor Hastie, Robert Tibshirani, Jerome Friedman: The Elements of Statis- tical Learning, Springer Series in Statistics. Further books will be announced in the first lecture.

Required elective modules: BIO-SEM

Module Number:	Module title		Lecture types				
BIO-4383	Advanced Topics in Ma Cell Biology	chine Learning for Single	Seminar				
ECTS	3						
Work load							
-Contact time	Work load	Class time	Self-Study				
-Self study	90 h	30 h / 2 CH	60 h				
Duration	1 semester						
Frequency of offer	every year						
Language of instruction	English						
Type of Exam	Presentation (about 30 minutes) and written elaboration (approx. 10 pages), leading the discussion once						
Content	This seminar builds on the lecture 'Machine Learning for Single Cell Biology' (BIO-4382) and discusses current scientific publications on machine learning method development and application for basic science and translational single-cell biology studies.						
Objectives	 Reading and comprehension of state-of-the-art publications in the field Machine Learning for Single Cell Biology Presentation of publications Discussion of study results Deepening of Unsupervised/Supervised/Weakly-supervised and dynamic system machine learning models in single-cell biology 						
Requirement for participation	BIO-4382 or equivalent	course					
Lecturer	Claassen						
Literature	Articles / scientific publ	ications for each individua	al topic				

Module Number:	Module title					Lectu	ıre typ	oes	
BIO-4322	Metagenomics					Semin	ar		
ECTS	3					,			
Work load									
-Contact time	Work load	Cl	ass tin	ne		Self-S	tudy		
-Self study	90 h	30	h / 2	CH		60 h			
Duration	1 semester								
Frequency of offer	annually								
Language of instruction	English								
Type of Exam	Presentation (about a leading the discussion		utes) a	and wri	tten ela	boration	(appro	ox. 10 p	ages),
Content	In this seminar, we look at current research topics in the area of microbiome analysis, such as metagenomics, meta-transcriptomics and meta-proteomics. We will focus, to a degree, on the human microbiome. We provide a number of topics and associated publications to choose from and each participant delivers an oral presentation and a writeup of their chosen topic.								
Objectives	The students can ind through systematic re- correctly represent ar biome analysis. On t knowledge in the fiel will know that there studying current arti and learning skills, bu used in the seminar is (presentation) and th sion).	esearch nd pres he one d of m are sti cles, th ut also s inten	. They ent con- hand, nicrobid ill mar- he stud- their p ded to	summa ncepts a studen ome ana ny open dents ha persona help th	arize, as and met ts will o alysis. researce ave not l respon a stude	sess, clas hods in t btain an On the o h questic only im- sibility.	sify and the con- overvie other has ons in the proved The for evelop s	l scienti text of n ew of m and, stu this field their re rm of lea elf-confi	fically micro- odern idents d. By eading arning idence
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Seminar	S	с	2	3	tp+op		g	100
Requirement for participation	BIO-4110 Sequence E	Bioinfor	rmatic	5					
Lecturer	Huson								
Literature	Scientific publications	S							

Module Number:	Module title					Lect	ure typ	oes			
BIO-4362	Algorithms in Bioinf	ormatio	CS			Semir	nar				
ECTS	3										
Work load											
-Contact time	Work load	C	lass tir	ne		Self-S	tudy				
-Self study	90 h	30) h / 2	CH		60 h					
Duration	1 semester	1 semester									
Frequency	annuallu										
of offer	annuany	annually									
Language of instruction	English										
Type of Exam		Presentation (about 30 minutes) and written elaboration (approx. 10 pages), leading the discussion once									
Content	In this seminar we look at current research topics in bioinformatics, for example, fast alignment methods or single sequencing assembly. We provide a number of topics and associated publications to choose from and each participant delivers an oral presentation and a writeup of their chosen topic.										
Objectives	through systematic of presentation and pro- marize, assess, classi and methods of algo will get an overview the other hand, they tions in this field. If improved their readin- ity. The form of lear	The students can independently work with supervision on a challenging topic through systematic research. Students gain experience in giving a technical presentation and producing a technical writeup in bioinformatics. They sum- marize, assess, classify, scientifically correctly represent and present concepts and methods of algorithms in bioinformatics. On the one hand, the students will get an overview of the state of the art of algorithms in bionformatics. On the other hand, they will know that there are still many open research ques- tions in this field. By studying current articles, the students have not only improved their reading and learning skills, but also their personal responsibil- ity. The form of learning used in the seminar is intended to help the students to develop self-confidence (presentation) and the ability to criticise and com-									
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)		
	Seminar	S	с	2	3	op		g	100		
	Seminar	S	c			tp					
Requirement for participation	BIO-4110 Sequence I	Bioinfo	rmatic	5							
T J	Huson										
Lecturer	Scientific publications										

ECTS 3 Work load	RNA Bioinformatics						ire typ		
Work load	3					Semin	ar		
	0					,			
-Contact time	Work load	Cla	ass tin	ne		Self-St	tudy		
-Self study	90 h	30	h / 2	CH		60 h			
Duration 1	1 semester					1			
Frequency of offer	irregularly								
Language of H instruction	English								
	Presentation (about 3 leading the discussion		utes) a	and writ	tten elał	poration	(appro	x. 10 p	ages),
v s t s s t t r i i	In this seminar, current topics related to computer-aided RNA bioinformatics will be discussed. These can be, among others, the following: Folding: RNA structure, thermodynamics, basic folding; RNA Abstract shapes; Compara- tive Structure Prediction: structure comparison, alignment folding, consen- sus shapes; Structure Comparison: structure metrics, tree alignment, multiple structure alignment; RNA gene prediction: prediction from models, predic- tion from folding, prediction from comparisons; miRNAs: miRNA prediction, miRNA target prediction; Stochastic Models: HMMs, SCFGs, model train- ing; 3D-Modelling; Cofolding; RNA Motifs and other topics supplemented by current research.								
t I I I I I I I I I I I I I I I I I I I	The students can independently work with supervision on a challenging topic through systematic research. Students gain experience in giving a technical presentation and producing a technical writeup in bioinformatics. They sum- marize, assess, classify, scientifically correctly represent and present concepts and methods of bioinformatic RNA biology. On the one hand, the students will get an overview of modern knowledge in the field of bioinformatic RNA biology and thus the importance of this subfield of bioinformatics. On the other hand, they will know that there are still many open research questions in this field. By studying current articles, the students have not only improved their reading and learning skills, but also their personal responsibility. The form of learning used in the seminar is intended to help the students to develop self-confidence (presentation) and the ability to criticise and communicate (subsequent discus-								
Requirement for Credit Points / Grade		a Type of Class	Status	HO 2	CP 3	Type of Exam	57 Duration of Exam	Evaluation	001 Calculation of Module (%)
			c	2	3	op tr	40	g	100
Requirementforparticipation	Seminar -	S	с			tp			
	Nieselt								
	Articles / scientific pu	ıblicati	ions fo	r each i	ndividu	al topic			

Module Number:	Module title					Lecti	ure typ	oes			
BIO-4373	Bioinformatics and M	Machine	e Learı	ning		Semir					
ECTS	3										
Work load											
-Contact time	Work load	C	lass tir	ne		Self-S	tudy				
-Self study	90 h	30) h / 2	CH		60 h					
Duration	1 semester										
Frequency of offer	irregularly	irregularly									
Language of instruction	English										
Type of Exam	Presentation (about leading the discussio		utes) a	and wr	itten ela	aboration	ı (appro	ox. 10 p	bages),		
Content Objectives	matics will be discu- vised classification; of for classification; dif- els; applications to t- biology, text mining discussed. The students can ind through systematic correctly represent at are applied to bioinfi- overview of modern portance for various will know that there studying current art	In this seminar, machine learning approaches with applications to bioinfor- matics will be discussed. These can be, among others, the following: super- vised classification; deep learning in bioinformatics, support vector machines for classification; dimension reduction methods; probabilistic graphical mod- els; applications to the fields of genomics, transcriptomics, evolution, systems biology, text mining and other topics supplemented by current research will be discussed. The students can independently work with supervision on a challenging topic through systematic research. They summarize, assess, classify, scientifically correctly represent and present concepts and methods of machine learning that are applied to bioinformatics problems. On the one hand, students will get an overview of modern knowledge in the field of machine learning and their im- portance for various questions in bioinformatics. On the other hand, students will know that there are still many open research questions in this field. By studying current articles, the students have not only improved their reading and learning skills, but also their personal responsibility. The form of learning									
	(presentation) and th sion).			-			e (subse				
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)		
	Seminar	S	с	2	3	ор	45	g	100		
	Seminar	S	c			tp					
Requirement for participation	-				·		·				
Lecturer	Nieselt										
Literature	Articles / scientific p	oublicat	ions fo	or each	individ	ual topic					

Module Number:	Module title	Lecture types						
MEDZ-4520	Biomedical Informatics search	Methods for Infection Re-	Seminar					
ECTS	3							
Work load								
-Contact time	Work load	Class time	Self-Study					
-Self study	90 h	30 h / 2 CH	60 h					
Duration	1 semester							
Frequency of offer	irregularly							
Language of instruction	English							
Type of Exam	Talk (30 minutes) and report (8-10 pages)							
Content	 This seminar covers different aspects of biomedical informatics methods for infection research. This includes computer science methods to support research in the following areas: Pathogen-host interactions Diversity of pathogens and its relevance for human infections Analysis of viral epitopes Support for vaccine development Predicting drug resistance Assessing the efficacy of combination drug therapies 							
Objectives		ctions with computer scie	ms, theories and methods in nce methods and know how					
Requirement for participation		e learning: theory and alg rning for Bioinfos and Me	gorithms or Introduction to dicine Infos					
Lecturer	Pfeifer							
Literature	The papers will be anno	ounced at the first meeting	<u>5</u> .					

Module Number:	Module title	Lecture types					
MEDZ-4522	Machine Learning for H	ealth	Seminar				
ECTS	3						
Work load							
-Contact time	Work load	Class time	Self-Study				
-Self study	90 h	30 h / 2 CH	60 h				
Duration	1 semester						
Frequency of offer	irregularly						
Language of instruction	Englisch						
Type of Exam	Talk (30 minutes) and report (8-10 pages)						
Content	 biomedical data to answ Graphical model s Deep learning app Machine learning s 	ver medical questions of in tructure learning and caus roaches in medicine methods for small sample	sality in medicine sizes				
Objectives		ctions with computer scie	ms, theories and methods in nce methods and know how				
Requirementforparticipation		e learning: theory and alg rning for Bioinfos and Me	gorithms or Introduction to licine Infos				
Lecturer	Pfeifer						
Literature	The papers will be anno	ounced at the first meeting	ç.				

Required elective modules: BIO-PRAK

Module Number:	Module title					Lecti	ıre typ	es	
BIO-4240	Bioinformatics Tools					Practical course			
ECTS	3								
Work load									
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy		
-Self study	90 h	80	h / 3	CH		10 h			
Duration	Two week block course semester								
Frequency of offer	every semester								
Language of instruction	English								
Type of Exam	The final grade is based on performance, a written report on each day of the practical course, and one or two short oral presentations.								
Content	In this practical course, students work on a mini research project in the area of genomics, metagenomics or phylogenetics. Working in teams, the participants use state-of-the-art bioinformatics tools to address a series of typical computational questions. During the course, students read up on different methods and introduce the methods to each other in short presentations.								
Objectives	Students will gain practical experience in application of bioinformatics software for analyzing NGS data in the context of genomics, metagenomics or phylo- genetics. They will be able to use libraries and frameworks, and will acquire knowledge or extend their knowledge of Java and Python. By working to- gether in groups, students obtain teamwork and collaboration skills, and they will learn about project organization and presentation techniques. Students will know about the strengths and weaknesses and about the limitations of various methods for molecular sequence data, and will be able to describe and evaluate these methods.								
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)
	Practical course	Р	с	3	3	tp+op		g	100
Requirementforparticipation	BIO-4110								

(noch BIO-4240)

Lecturer	Huson
Literature	Scientific publications

Module Number:	Module title Lecture types									
BIO-4220	Integrative Bioinformatics					Practical course				
ECTS	3									
Work load										
-Contact time	Work load	Cl	ass tin	ne		Self-St	tudy			
-Self study	90 h	80	h / 3	CH		10 h	0 h			
Duration	two-weeks block course during lecture-free time semester									
Frequency of offer	every semester									
Language of instruction	English									
Type of Exam	A written report is to be submitted after the course. Performance during the course will also be integrated into the final grade.									
Content	The basics of modelling biological data and integration of heterogeneous datasets are conveyed and applied on concrete examples in this practical course. Using the scripting language Python the data is parsed and consolidated in a database. Biologically relevant, demonstrative analyses are performed on this integrated data. Data integration, exploration, visualization, statistical tests and machine learning are applied on a dataset of genomic, transcriptomic, metabolomic and phenomic data from genetically equal samples.									
Objectives	(1)The students learn how to parse and integrate heterogeneous biological data into databases. (2) They learn how to perform statistical analyses on biological data and to summarize and illustrate their results visually. (3) They learn how to interpret the results of integrative analyses and report on these results in a concise manner.									
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)	
	Practical course	Р	с	3	3	tp+op	-	g	100	
Requirement for participation	BIO-4120									
Lecturer	Kohlbacher									
Literature	Will be supplied during the course.									

REQUIRED ELECTIVE MODULES: BIO-PRAK

Module Number:	Module title Lecture types									
BIO-4210	Practical Transcriptomics						Practical course			
ECTS	3									
Work load										
-Contact time	Work load	Cl	ass tir	ne		Self-S	tudy			
-Self study	90 h	80	h / 2	CH		10 h				
Duration	1 semester									
Frequency	Offered at irregular intervals									
of offer										
Language of instruction	English									
Type of Exam	The final grade is based on performance, a written report on each day of the practical course, and one or two short oral presentations.									
Content	The focus is on the practical analysis of so-called next generation sequencing data. Students learn the use of tools for evaluating this data. This practical course uses real-life data; the focus is on the entire process of evaluating experimental data, from quality analyses to in-depth statistical analyses; various methods are compared. Topics include de-novo assembly, expression count calculation, normalization and clustering, machine learning methods and their application to expression data, statistical methods for calculating differential expressions, visualization methods, and enrichment methods.									
Objectives	Students will gain practical experience in designing and programming bioin- formatics software for analyzing NGS data. They will be able to use libraries and frameworks, and will acquire knowledge or extend their knowledge of Java or C++ and R. By working together in groups, students obtain teamwork and collaboration skills, and they will learn about project organization and pre- sentation techniques. Students will know about the strengths and weaknesses and about the limitations of various methods for evaluating high-throughput transcriptomic data, and will be able to describe and evaluate these methods.									
Requirement for Credit Points / Grade		Type of Class	Status	CH	CP	Type of Exam	Duration of Exam	Evaluation	Calculation of Module (%)	
	Practical course	Р	с	3	3	tp,op		g	100	
Requirement for participation	BIOINF4110, BIOINF4120, BIOINF4331 Advances in Computational Tran- scriptomics (recommended), BIOINF3331 Expression Bioinformatik (recom- mended)									
Lecturer	Nieselt									
Literature	Will be provided at the beginning of the course, if necessary.									