

# AI-supported Study Planning and Cohort Monitoring

## A perspective on Learning Analytics and Collaboration

René Röpke



AI-supported study planning and cohort monitoring

## The Project: **AIStudyBuddy**

# The (large) project team



## **RWTH Aachen University:**

- ▶ Prof. Dr.-Ing. Ulrik Schroeder, René Röpke, Sergej Görzen, Sven Judel and Tobias Johnen
  - ▶ Competencies: Learning Analytics and Application Development
- ▶ Prof. Dr. Gerhard Lakemeyer and Hayyan Helal
  - ▶ Competencies: Rule-based AI and Planning
- ▶ Prof. Dr. Wil van der Aalst, Miriam Wagner und Pouya Soudmand
  - ▶ Competencies: Process Mining and Data Science
- ▶ Dr. Malte Persike and Kevin Esser
  - ▶ Competencies: Project management



## **University Wuppertal (BUW):**

- ▶ Prof. Dr. Kerstin Schneider, Dr. Monika Piegeler, Leandro Henao, Luis Rumert
  - ▶ Competencies: Economics of Education
- ▶ Dr. Simon Görtz, Joel Fuchs and Karin Brieger
  - ▶ Competencies: Data Clearing and Project management



## **Ruhr University Bochum (RUB):**

- ▶ Prof. Dr. Maren Scheffel, Rike Carpentier and Johannes Wagner-Schiermeister
  - ▶ Competencies: Educational Data Science and Didactics
- ▶ Prof. Dr. Sebastian Weydner-Volkmann and Dominik Bär;
  - ▶ Competencies: Ethics
- ▶ Dr. Peter Salden, Jonas Leschke and Katharina Batz
  - ▶ Competencies: Project management

- ▶ What is a study plan?
  - ▶ **Depiction of planned modules** in study program
  - ▶ Contains information about workload, credits, whether modules are mandatory or electives
- ▶ Supports students in planning their studies
  - ▶ How is the study program structured?
  - ▶ **When to take which module?**
  - ▶ How much work is a specific module?
  - ▶ What is mandatory? What choices do students have?
  - ▶ Which dependencies are to consider between modules?
- ▶ Planning on the **Macro level**
  - ▶ Alternatively: Timetable planning, exam planning (Micro)

# Example plans

## Bachelor Mechanical Engineering (RUB)

Modul	Modulbezeichnung	SWS	LP	1. Sem V U	2. Sem V U	3. Sem V U	4. Sem V U	5. Sem V U	6. Sem V U	7. Sem V U
<b>Mathematisch/Naturwissenschaftliche Grundlagen</b>										
1	Höhere Mathematik A	6	8	4 2						
2	Höhere Mathematik B	6	8		4 2					
3	Höhere Mathematik C	4	5			2 2				
4	Numerische Mathematik	4	5			2 2				
5	Naturwissenschaftliche Grundlagen (Physik, Chemie)	4	5	2 2						
		24	31							
<b>Ingenieurwissenschaftliche Grundlagen</b>										
6	Maschinenbau in der Praxis (Ringvorlesung)	4	2	2 0	2 0					
7	Mechanik A	7	9	3 4						
8	Mechanik B	6	8		3 3					
9	Mechanik C	4	5			2 2				
10	Werkstoffe - Grundlagen und Anwendungen mit Praktikum	8	8	3 1	3 1					
11	Konstruktionstechnik A	4	5	2 2						
12	Konstruktionstechnik B	4	5		2 2					
13	Konstruktionstechnik C	4	5			2 2				
14	Fertigungsverfahren	4	5		2 2					
15	Grundlagen der Thermodynamik	4	5			2 2				
16	Grundlagen der Informatik und Programmierung	8	10			2 2	2 2			
17	Grundlagen der Strömungsmechanik	4	5			2 2	2 2			
18	Elektrotechnik	6	7			4 2	4 2			
19	Grundlagen der Regelungstechnik	4	5			2 2	2 2			
20	Grundlagen der Messtechnik mit Praktikum	4	5			1 3				
21	Wärme- und Stoffübertragung	4	5					2 2		
		79	94							
<b>Ingenieurwissenschaftliche Anwendungen</b>										
22	Schwerpunktmodule im Umfang von mindestens 35 Leistungspunkten. Die Wahl muss aus den	28	35							

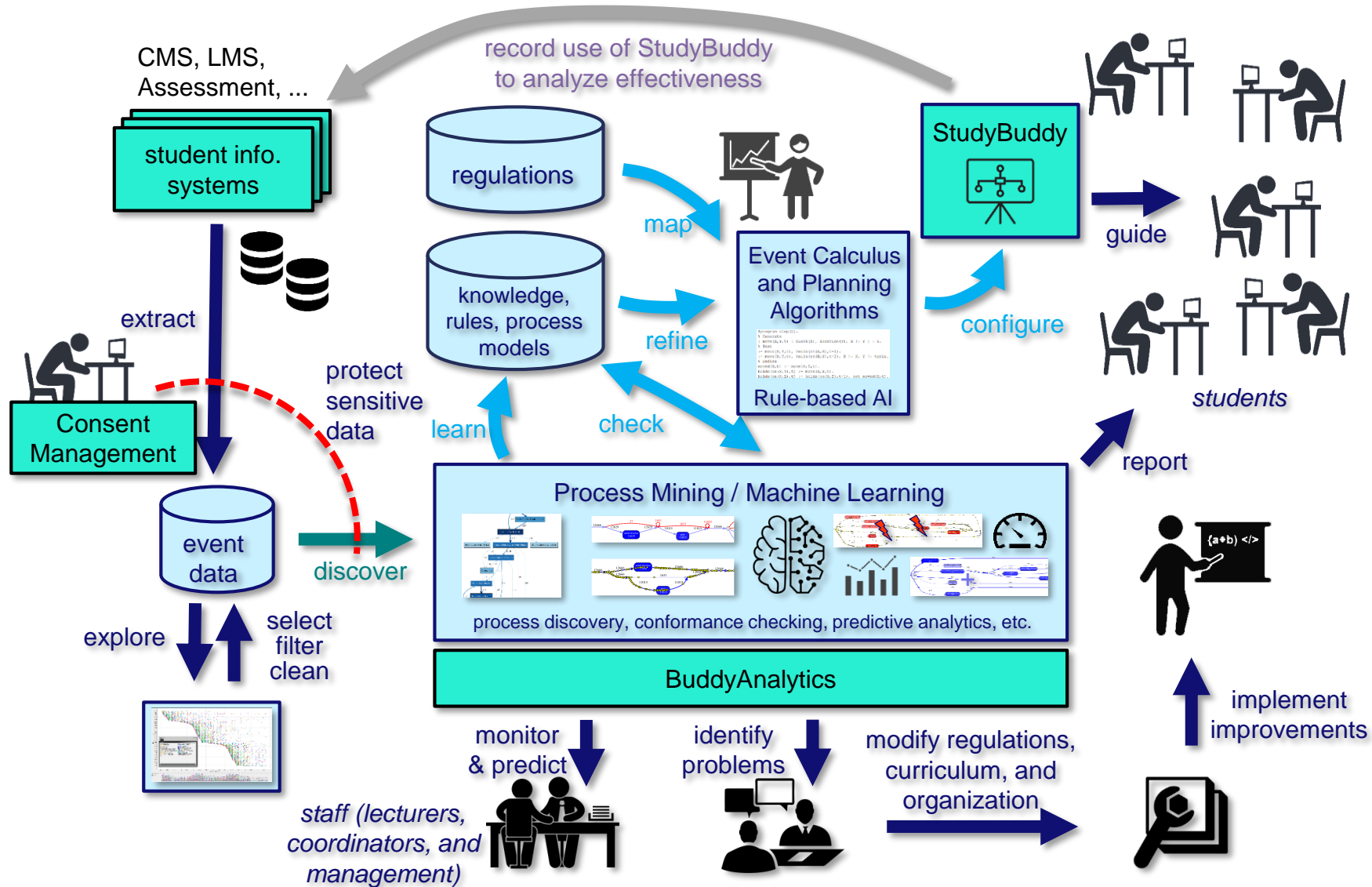
## Bachelor Computer Science (BUW)

Semester					
1	Grundlagen aus der Informatik und Programmierung	Elektrotechnische Grundlagen der Informatik	Mathematik A	Anwendungsfach 1	
2	Algorithmen und Datenstrukturen	Grundzüge der technischen Informatik	Mathematik B	Mathematik für Informatik I	
3	Objektorientierte Programmierung	Betriebssysteme	Einführung in Datenbanken	Mathematik für Informatik II	WP-Bereich Informatik 1
4	Softwaretechnologie	Grundlagen der Rechnerarchitektur	Rechnernetze	Automaten, Sprachen und Berechenbarkeit	Seminar zur Informatik
5	Praktikum zur Softwaretechnologie	Grundlagen der IT-Sicherheit	Anwendungsfach 2	Anwendungsfach 3	WP-Bereich Informatik 2
6	Abschlussprojekt Bachelor Informatik			Anwendungsfach 4	Professionalisierung

## Bachelor Computer Science (RWTH)

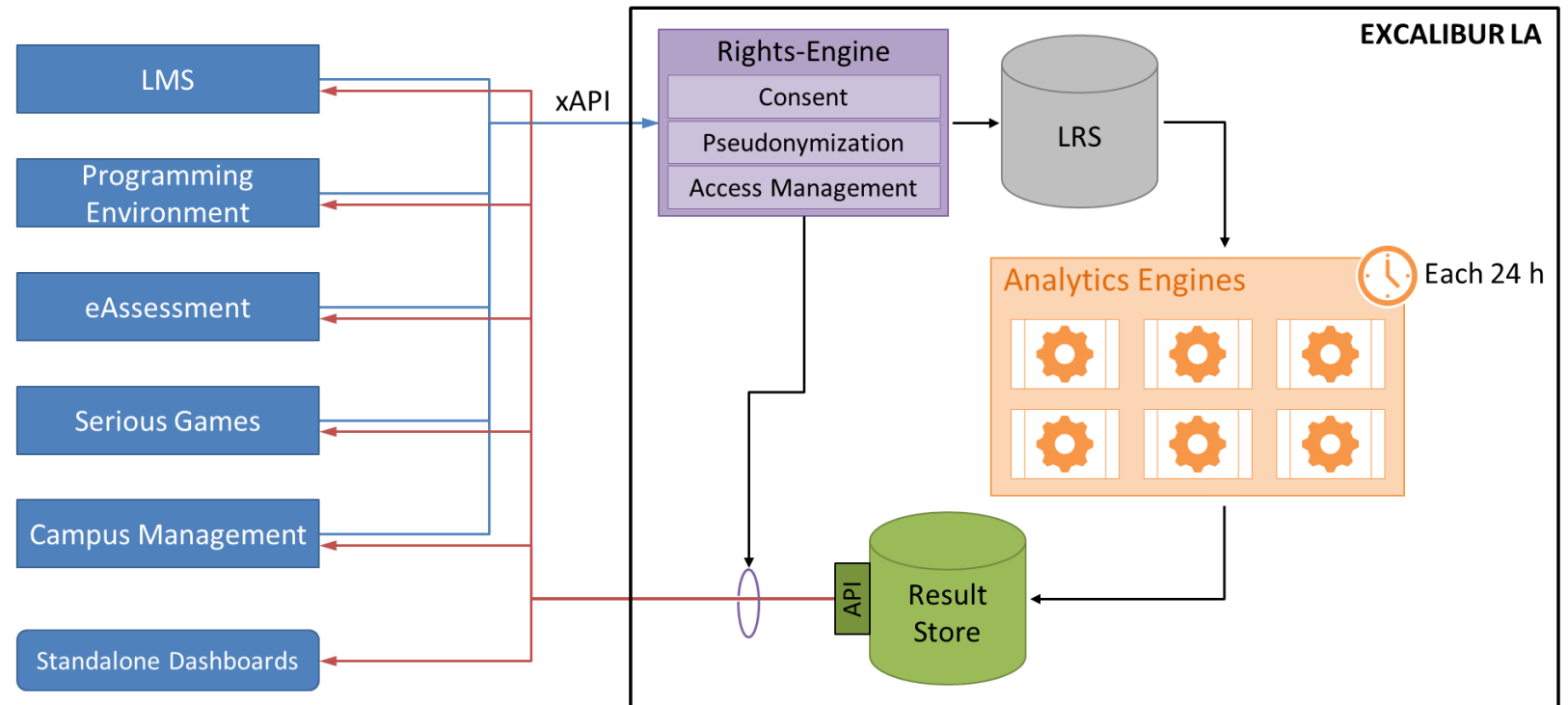
Semester:	1. (WS)	C	2. (SS)	C	3. (WS)	C	4. (SS)	C	5. (WS)	C	6. (SS)	C	Summe Credits
Praktische Informatik	Programmierung Teil 1 und 2 (V4+U2)	8	Datenstrukturen und Algorithmen (V4+U2)	8	Einführung in die Softwaretechnik (V3+U2)	6	Datenbanken und Informationssysteme (V3+U2)	6					28
Technische Informatik	Technische Informatik (V4+U2)	6	Betriebssysteme und Systemsoftware (V3+U2)	6	Praktikum System-Programmierung (PSP) (P3)	8	PSP im 4. Sem. dann DaKoM ODER DB ins 6. (blaue Pfeile)						26
							Datenkommunikation und Sicherheit (V3+U2)	6					
Theoretische Informatik			Formale Systeme, Automaten, Prozesse (V3+U2)	6	Berechenbarkeit und Komplexität (V3+U2)	7	Mathematische Logik (V3+U2)	7					20
Mathematik	Diskrete Strukturen (V3+U1)	6	Lineare Algebra für Informatiker (V3+U2)	6									26
	Analysis für Informatiker (V4+U2)	8					Einführung in die angewandte Stochastik (V3+U2)	6					
Sonstige Studienleistungen			Einführung in das wissenschaftliche Arbeiten (Proseminar) (V1+U2)	3					Software-Projektpraktikum (P3)	6	Bachelorarbeit und Kolloquium	15	34
	Mentoring	1			Nicht-technisches Wahlfach	4			Seminar (S2)	5			
Wahlpflicht									Wahlpflichtmodul (V3+U2)	6	Wahlpflichtmodul (V3+U2)	6	24
									Wahlpflicht Theorie (V3+U2)	6	Wahlpflichtmodul (V3+U2)	6	
Summe Credits (ohne Anwendungsfach, ohne Verschiebungen im Studienplan)		29		29		25		25		23		27	158

# Approach



# Under the hood: EXCALIBUR LA

- ▶ Extendable and Scalable Infrastructure build for Learning Analytics
- ▶ Will be extended:
  - ▶ Process Mining-based Engines
  - ▶ Rule recommendations for AI



# Two applications for the stakeholders

## ► StudyBuddy

### ► Planning applications for students

RWTH Curriculum Planner

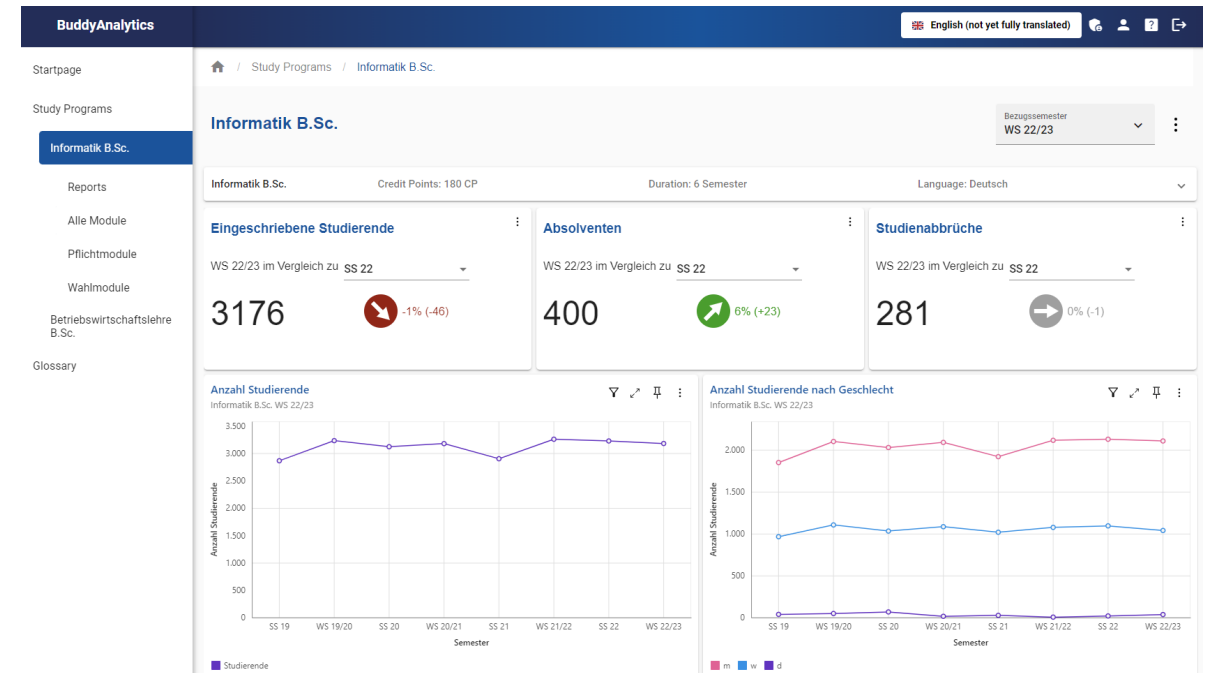
Computer Science B.Sc.

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	1st Semester WS 2021/22	2nd Semester SS 2022	3rd Semester WS 2022/23	4th Semester SS 2023	5th Semester WS 2023/24	6th Semester SS 2024	7th Semester WS 2024/25	8th Semester SS 2025
Applied Computer Science Computer Science B.Sc.	Programming 6 SWS 4V 2E 8 CP	Data Structures and Algorithms 6 SWS 4V 2E 8 CP	Databases and Information Systems 5 SWS 3V 2E 6 CP	Introduction to Software Engineering 5 SWS 3V 2E 6 CP				
Computer Engineering Computer Science B.Sc.	Introduction to Computer Engineering 6 SWS 4V 2E 6 CP	Data Communication and Security 5 SWS 3V 2E 6 CP	System Programming 3 SWS 3P 8 CP	Operating Systems and System Software 5 SWS 3V 2E 6 CP				
Theoretical Computer Science Computer Science B.Sc.		Formal Systems, Automata, Processes 6 SWS 2V 4E 6 CP	Computability and Complexity 5 SWS 3V 2E 7 CP	Mathematical Logic 5 SWS 3V 2E 7 CP				
Mathematics Computer Science B.Sc.	Calculus for Computer Science 6 SWS 4V 2E 8 CP	Linear Algebra 5 SWS 3V 2E 6 CP	Discrete Structures 4 SWS 3V 1E 6 CP	Introduction to Applied Stochastics 5 SWS 3V 2E 6 CP				
Other Achievements Computer Science B.Sc.	Mentoring 2 SWS 1 CP	Introduction to Scientific Working 3 SWS 1V 2S 3 CP	Non-Technical Elective Module 4 CP		Software Project Lab 3 SWS 3P 6 CP	Seminar 2 SWS 2S 5 CP	Bachelor Thesis 0 SWS 15 CP	
Elective Modules Computer Science B.Sc.					Elective Module 3V 2E 6 CP	Elective Module 3V 2E 6 CP		
					Theoretical Elective Module 3V 2E 6 CP	Elective Module 3V 2E 6 CP		
Application Subject Computer Science B.Sc.			Einführung in die Betriebswirtschaftslehre V2 + U2 6 CP	Quantitative Methoden V2 + U2 6 CP	Entscheidungslehre V2 + U2 6 CP			
				Rechnungswesen A V2 + U1 4 CP				

## ► BuddyAnalytics

### ► Monitoring applications for study program designers





# Two applications for the stakeholders

## ► StudyBuddy

RWTH Curriculum Planner   ↺ ↻ Computer Science B.Sc. + ❌ x1 ! x1 ? x2									
	1 <sup>st</sup> Semester WS 2021/22 23 CP	2 <sup>nd</sup> Semester SS 2022 29 CP	3 <sup>rd</sup> Semester WS 2022/23 31 CP	4 <sup>th</sup> Semester SS 2023 31 CP	5 <sup>th</sup> Semester WS 2023/24 34 CP	6 <sup>th</sup> Semester SS 2024 17 CP	7 <sup>th</sup> Semester WS 2024/25 15 CP	8 <sup>th</sup> Semester SS 2025 0 CP	+ -
Applied Computer Science Computer Science B.Sc.	Programming 6 SWS 4V 2E 8 CP ✓	Data Structures and Algorithms 6 SWS 4V 2E 8 CP ✓		Databases and Information Systems 5 SWS 3V 2E 6 CP	Introduction to Software Engineering 5 SWS 3V 2E 6 CP				
Computer Engineering Computer Science B.Sc.	Introduction to Computer Engineering 6 SWS 4V 2E 6 CP ✓	Data Communication and Security 5 SWS 3V 2E 6 CP ✓	System Programming 3 SWS 3P 8 CP ❌	Operating Systems and System Software 5 SWS 3V 2E 6 CP					
Theoretical Computer Science Computer Science B.Sc.		Formal Systems, Automata, Processes 6 SWS 2V 4E 6 CP ?	Computability and Complexity 5 SWS 3V 2E 7 CP	Mathematical Logic 5 SWS 3V 2E 7 CP					
Mathematics Computer Science B.Sc.	Calculus for Computer Science 6 SWS 4V 2E 8 CP ✓	Linear Algebra 5 SWS 3V 2E 6 CP ✓	Discrete Structures 4 SWS 3V 1E 6 CP	Introduction to Applied Stochastics 5 SWS 3V 2E 6 CP					
Other Achievements Computer Science B.Sc.	Mentoring 2 SWS 1 CP ✓	Introduction to Scientific Working 3 SWS 1V 2S 3 CP ?	Non-Technical Elective Module 4 CP		Software Project Lab 3 SWS 3P 6 CP !	Seminar 2 SWS 2S 5 CP	Bachelor Thesis 0 SWS 15 CP		
Elective Modules Computer Science B.Sc.					Elective Module 3V 2E 6 CP	Elective Module 3V 2E 6 CP			
					Theoretical Elective Module 3V 2E 6 CP	Elective Module 3V 2E 6 CP			
Application Subject Computer Science B.Sc.			Einführung in die Betriebswirtschaftslehre V2 + Ü2 6 CP	Quantitative Methoden V2 + Ü2 6 CP	Entscheidungslehre V2 + Ü2 6 CP				
					Rechnungswesen A V2 + Ü1 4 CP				

# Two applications for the stakeholders

## ► StudyBuddy

### ► Planning applications for students

RWTH Curriculum Planner

Computer Science B.Sc.

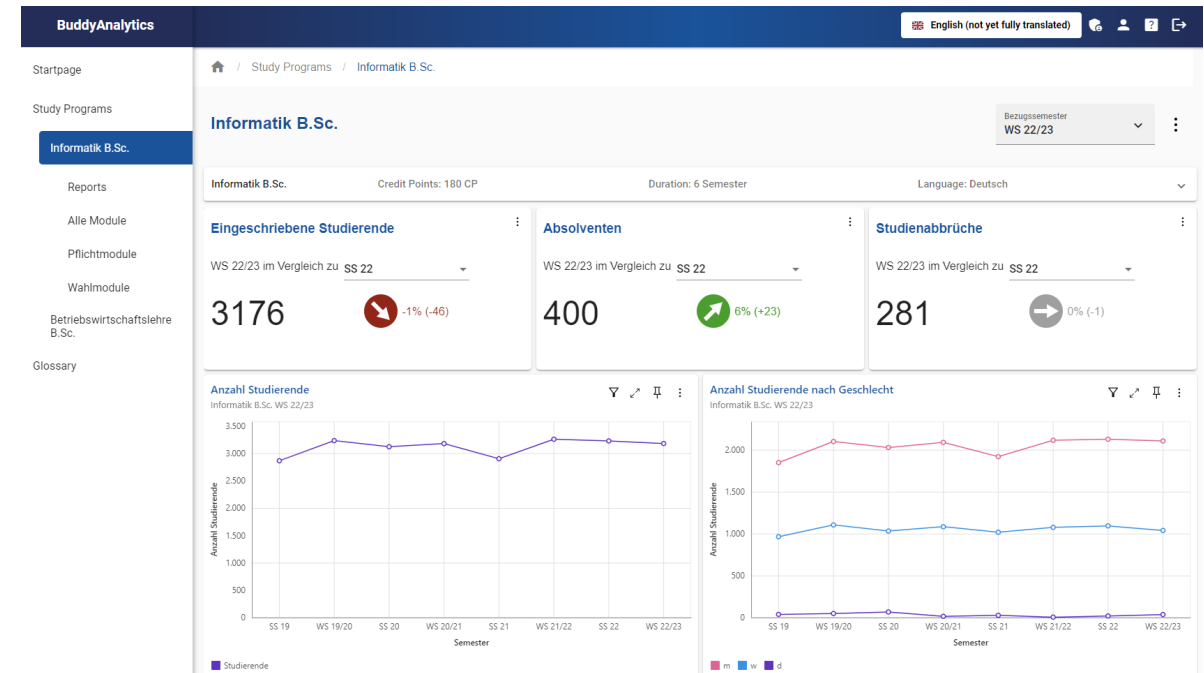
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	1st Semester WS 2021/22	2nd Semester SS 2022	3rd Semester WS 2022/23	4th Semester SS 2023	5th Semester WS 2023/24	6th Semester SS 2024	7th Semester WS 2024/25	8th Semester SS 2025
Applied Computer Science Computer Science B.Sc.	Programming 6 SWS 4V 2E 8 CP	Data Structures and Algorithms 6 SWS 4V 2E 8 CP	Databases and Information Systems 5 SWS 3V 2E 6 CP	Introduction to Software Engineering 5 SWS 3V 2E 6 CP				
Computer Engineering Computer Science B.Sc.	Introduction to Computer Engineering 6 SWS 4V 2E 6 CP	Data Communication and Security 5 SWS 3V 2E 6 CP	System Programming 3 SWS 3P 8 CP	Operating Systems and System Software 5 SWS 3V 2E 6 CP				
Theoretical Computer Science Computer Science B.Sc.		Formal Systems, Automata, Processes 6 SWS 2V 4E 6 CP	Computability and Complexity 5 SWS 3V 2E 7 CP	Mathematical Logic 5 SWS 3V 2E 7 CP				
Mathematics Computer Science B.Sc.	Calculus for Computer Science 6 SWS 4V 2E 8 CP	Linear Algebra 5 SWS 3V 2E 6 CP	Discrete Structures 4 SWS 3V 1E 6 CP	Introduction to Applied Stochastics 5 SWS 3V 2E 6 CP				
Other Achievements Computer Science B.Sc.	Mentoring 2 SWS 1 CP	Introduction to Scientific Working 3 SWS 1V 2S 3 CP	Non-Technical Elective Module 4 CP		Software Project Lab 3 SWS 3P 6 CP	Seminar 2 SWS 2S 5 CP	Bachelor Thesis 0 SWS 15 CP	
Elective Modules Computer Science B.Sc.					Elective Module 3V 2E 6 CP	Elective Module 3V 2E 6 CP		
					Theoretical Elective Module 3V 2E 6 CP	Elective Module 3V 2E 6 CP		
Application Subject Computer Science B.Sc.			Einführung in die Betriebswirtschaftslehre V2 + U2 6 CP	Quantitative Methoden V2 + U2 6 CP	Entscheidungslehre V2 + U2 6 CP			
				Rechnungswesen A V2 + U1 4 CP				

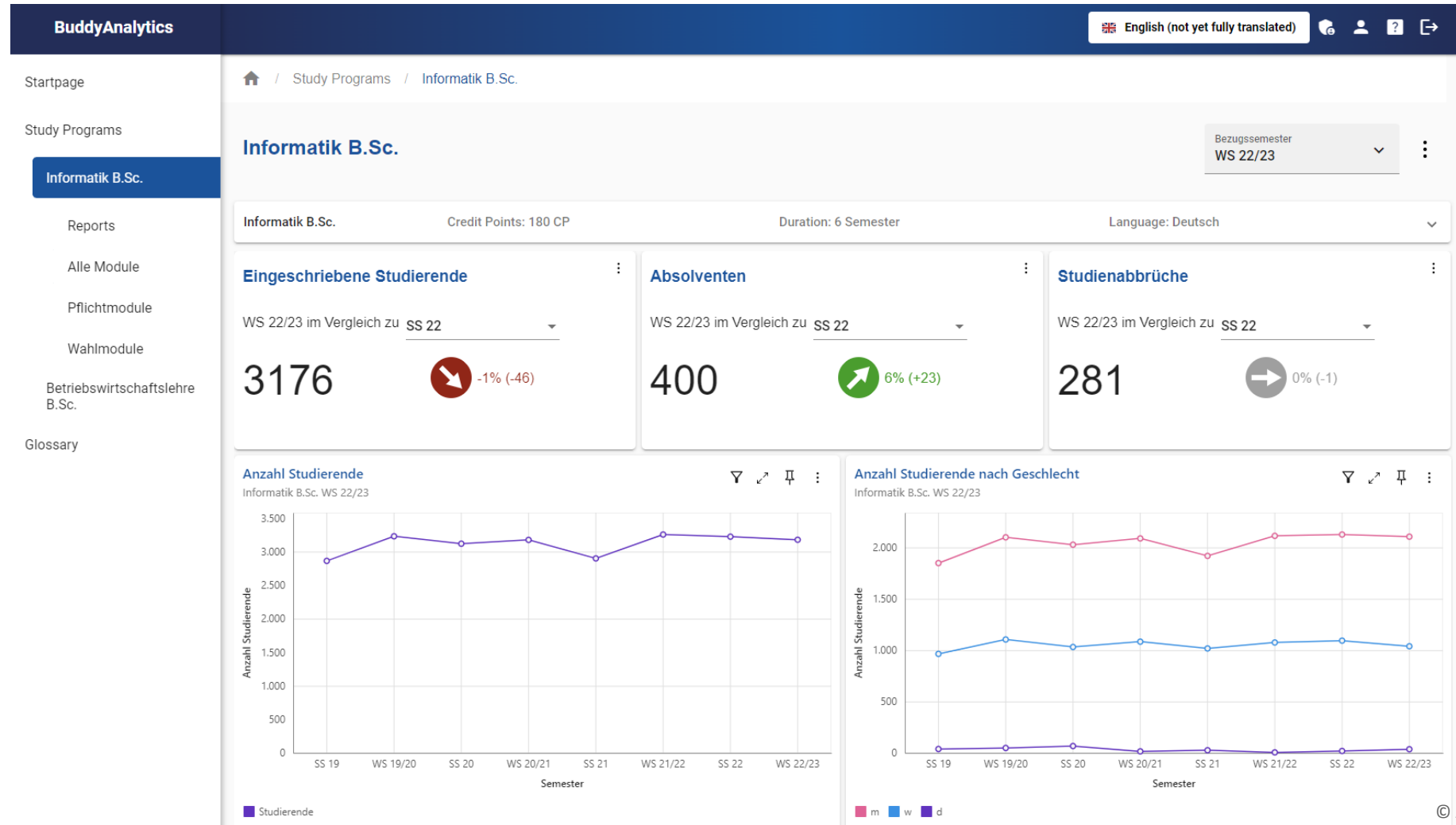
## ► BuddyAnalytics

### ► Monitoring applications for study program designers



# Two applications for the stakeholders

## ► BuddyAnalytics



- ▶ Informed, reflected planning of individual study paths
- ▶ Guidance towards study success – considering individual circumstances
- ▶ Cross-institutional analysis and evaluation – learning from each other and sharing experiences
- ▶ Unleashing the potential of existing data – to understand how students plan and behave



## The Project: **AMIGO**

# The project team



## RWTH Aachen University:

- ▶ René Röpke
- ▶ Prof. Dr.-Ing. Ulrik Schroeder



## Johannes Gutenberg University Mainz:

- ▶ Dr. Henrik Bellhäuser



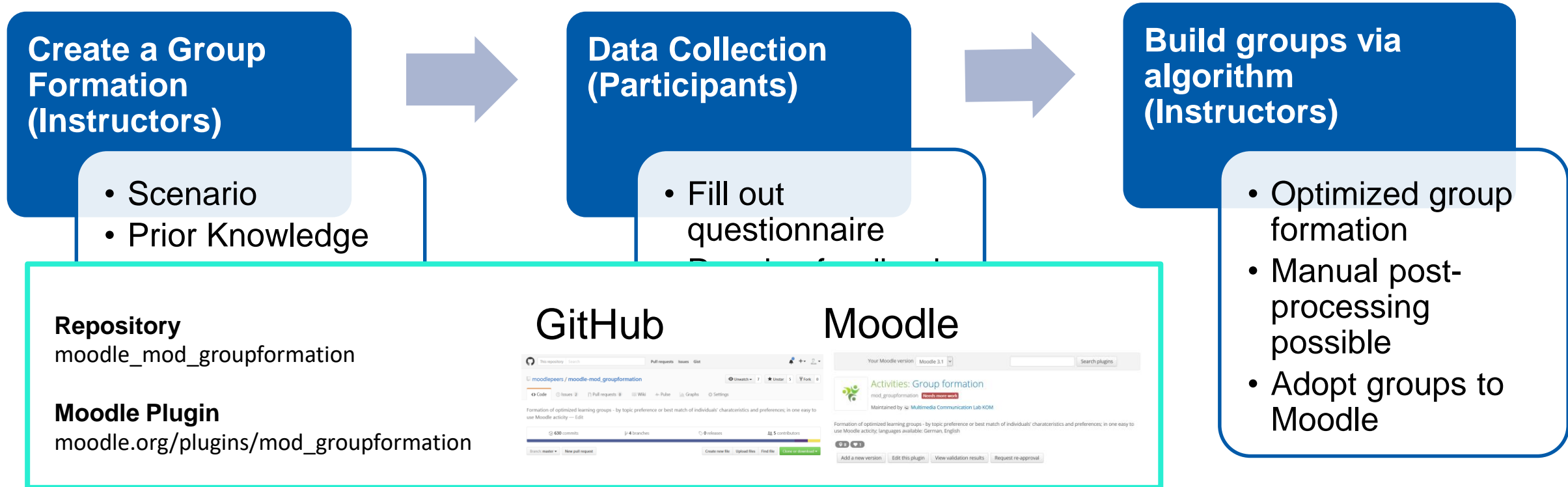
## Associated Partners

- ▶ Prof. Sonia Lippke, Prof. Peter Baumann, Dr. Stanislav Chankov
  - ▶ Instructors at Jacobs University Bremen
- ▶ Prof. Dr.-Ing. Johannes Konert
  - ▶ Original partner from MoodlePeers project



# Learning Group Formation: Who learns well with whom?

- ▶ Interdisciplinary Project (MoodlePeers since 2014, AMIGO since 2019)
  - ▶ Computer Science & Educational Psychology
  - ▶ Testbeds in Darmstadt, Mainz, Aachen, Bremen



- ▶ Various user studies in different courses and universities
  - ▶ Acceptance study using a cross-sectional questionnaire
    - Most named problem: „*Our group was not a good fit in terms of members*“
    - Acceptance: 70% would participate in algorithm. group formation (positive, curious attitude)
  - ▶ Decision study using a quasi-experimental design
    - Who chooses algorithmic vs. manual group formation („friend groups“)?
      - 1/3 chose algorithm
      - Mainly „disadvantaged“ students (significantly older, poorer school grades, less conscientiousness)
  - ▶ Intervention studies to identify which traits influence group performance, satisfaction, time spent etc.

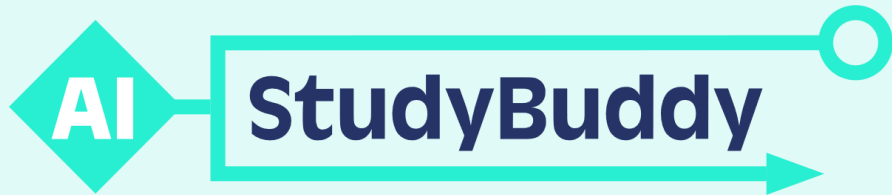
**WORK IN PROGRESS**



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## A perspective on collaboration

# Identifying connections



Matching groups and  
course choices

Detecting  
collaboration across  
the students'  
lifecycles

Issues with missing  
collaboration data

# Matching groups and course choices

## ► Two perspectives

### **Finding groups in similar courses**

- Shared interest, similar schedules
- Consideration during group formation
  - Currently selected courses as constraints
  - Inclusion of past courses and students' competencies

### **Finding courses in similar groups**

- Shared interests, shared positive experiences in collaborating
- Consideration during study planning
  - Collaborative Views/Plan sharing
  - Individual constraints vs. group constraints

# Detecting collaboration across the students' lifecycles

- ▶ Cohort monitoring and learning analytics on different levels

**Macro level** „*Study program*“



**Micro level** „*Course*“



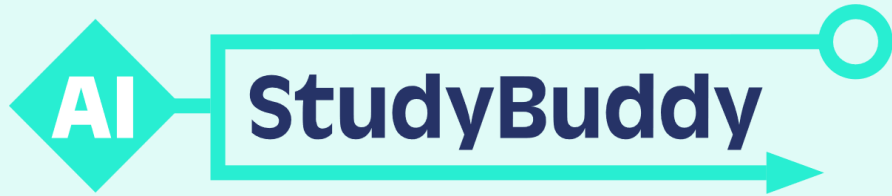
- ▶ **Idea: Linking both levels**

- ▶ Compare students' performance based on collaboration history/experiences
- ▶ Identification of shared paths – before and after collaboration
- ▶ Analysis of collaboration effects of early semesters
- ▶ Detect patterns of collaborating – link them to performance data

- ▶ But: **Longitudinal** research with **high complexity** and **issues of data privacy**

# Conclusion

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- ▶ Learning Analytics with a focus on study planning and cohort monitoring
  - ▶ Macro vs. Micro level
- ▶ Group Formation and Collaborations throughout studies could be investigated
- ▶ Complex research which requires longitudinal studies, lots of data, brings issues of data privacy and anonymity

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# Thank you for your attention!



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