

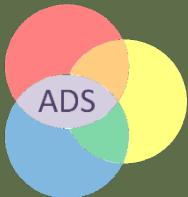
# Data Science & Society

## Lecture 01: *Course introduction*

INFOMDSS 2018

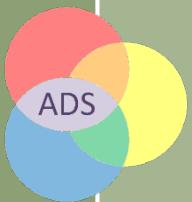
<http://www.cs.uu.nl/education/vak.php?stijl=2&vak=INFOMDSS>

Dr. Marco Spruit & Dr. Matthieu Brinkhuis



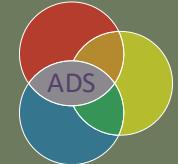
# Agenda

1. About us
2. About this course: Data Science & Society
  - Rationale
  - Learning objectives
  - Assignments & Workshops
  - Lectures, Topics and Guests
  - Your expectations
3. About this scientific field: ADS in context (KDP)
4. About Assignment 1: Book review



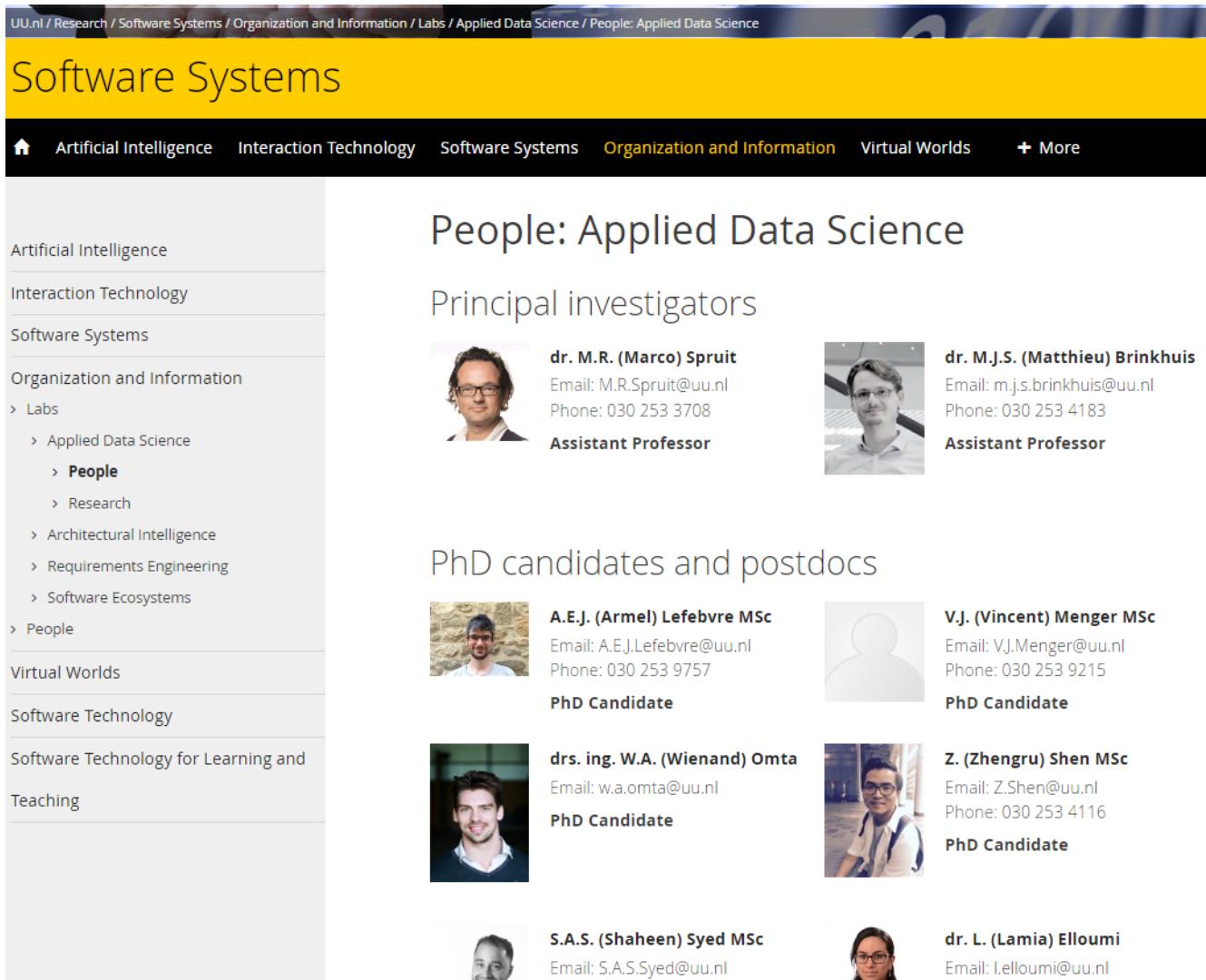
# 1. About us

ADS lab, MS, team, you



# About... Applied Data Science Lab

<https://www.uu.nl/en/research/software-systems/organization-and-information/labs/applied-data-science>



The screenshot shows the website for the Applied Data Science Lab at Utrecht University. The header includes the university logo and navigation links for Research, Software Systems, Organization and Information, and Virtual Worlds. A sidebar on the left lists categories such as Artificial Intelligence, Interaction Technology, Software Systems, Organization and Information (with sub-links for Labs, Applied Data Science, People, Research, Architectural Intelligence, Requirements Engineering, Software Ecosystems), People, Virtual Worlds, Software Technology, and Software Technology for Learning and Teaching. The main content area features sections for 'People: Applied Data Science' (with profiles for dr. M.R. (Marco) Spruit and dr. M.J.S. (Matthieu) Brinkhuis) and 'PhD candidates and postdocs' (with profiles for A.E.J. (Armel) Lefebvre MSc, V.J. (Vincent) Menger MSc, drs. ing. W.A. (Wienand) Ompta MSc, Z. (Zhengru) Shen MSc, S.A.S. (Shaheen) Syed MSc, and dr. L. (Lamia) Elloumi).

UU.nl / Research / Software Systems / Organization and Information / Labs / Applied Data Science / People: Applied Data Science

## Software Systems

Artificial Intelligence   Interaction Technology   Software Systems   Organization and Information   Virtual Worlds   + More

### People: Applied Data Science

#### Principal investigators

 **dr. M.R. (Marco) Spruit**  
Email: M.R.Spruit@uu.nl  
Phone: 030 253 3708  
**Assistant Professor**

 **dr. M.J.S. (Matthieu) Brinkhuis**  
Email: m.j.s.brinkhuis@uu.nl  
Phone: 030 253 4183  
**Assistant Professor**

#### PhD candidates and postdocs

 **A.E.J. (Armel) Lefebvre MSc**  
Email: A.E.J.Lefebvre@uu.nl  
Phone: 030 253 9757  
**PhD Candidate**

 **V.J. (Vincent) Menger MSc**  
Email: V.J.Menger@uu.nl  
Phone: 030 253 9215  
**PhD Candidate**

 **drs. ing. W.A. (Wienand) Ompta**  
Email: w.a.ompta@uu.nl  
**PhD Candidate**

 **Z. (Zhengru) Shen MSc**  
Email: Z.Shen@uu.nl  
Phone: 030 253 4116  
**PhD Candidate**

 **S.A.S. (Shaheen) Syed MSc**  
Email: S.A.S.Syed@uu.nl

 **dr. L. (Lamia) Elloumi**  
Email: l.elloumi@uu.nl

# About... Applied Data Science Lab

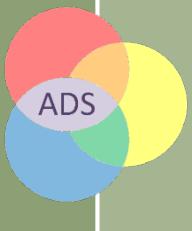
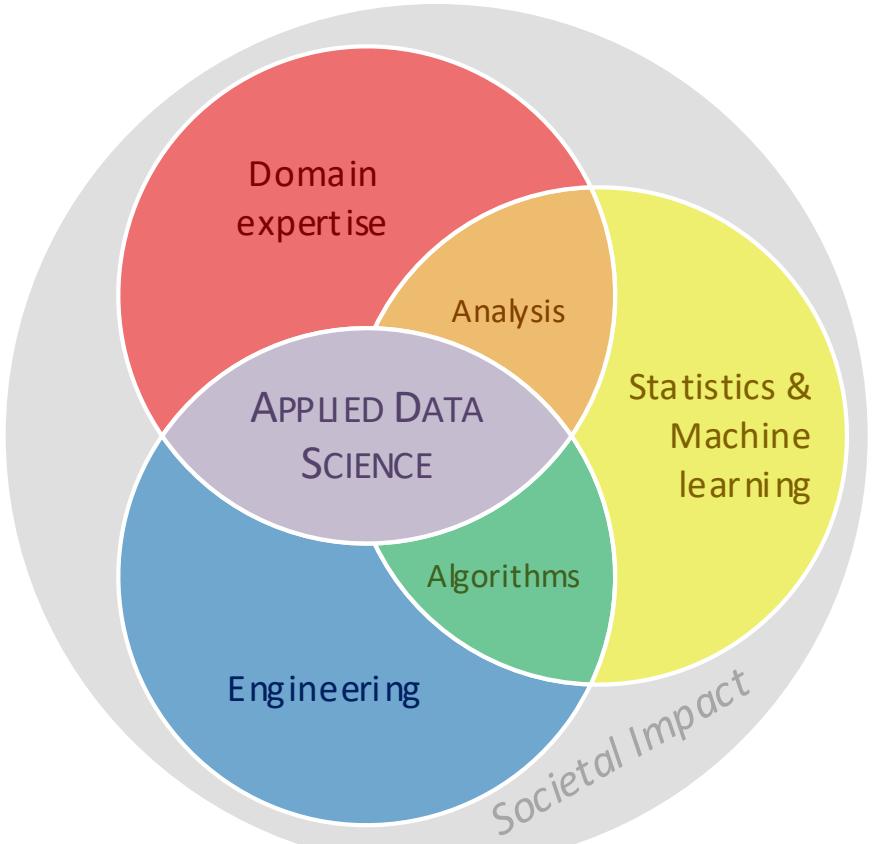
<https://www.uu.nl/en/research/software-systems/organization-and-information/labs/applied-data-science>

## › “Applied Data Science (ADS)

is

1. the knowledge discovery process in which
2. analytical applications are designed and evaluated to
3. improve the daily practices of domain experts.”

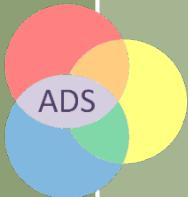
› *Spruit & Jagesar (2016)*  
*Spruit & Lytras (2018)*



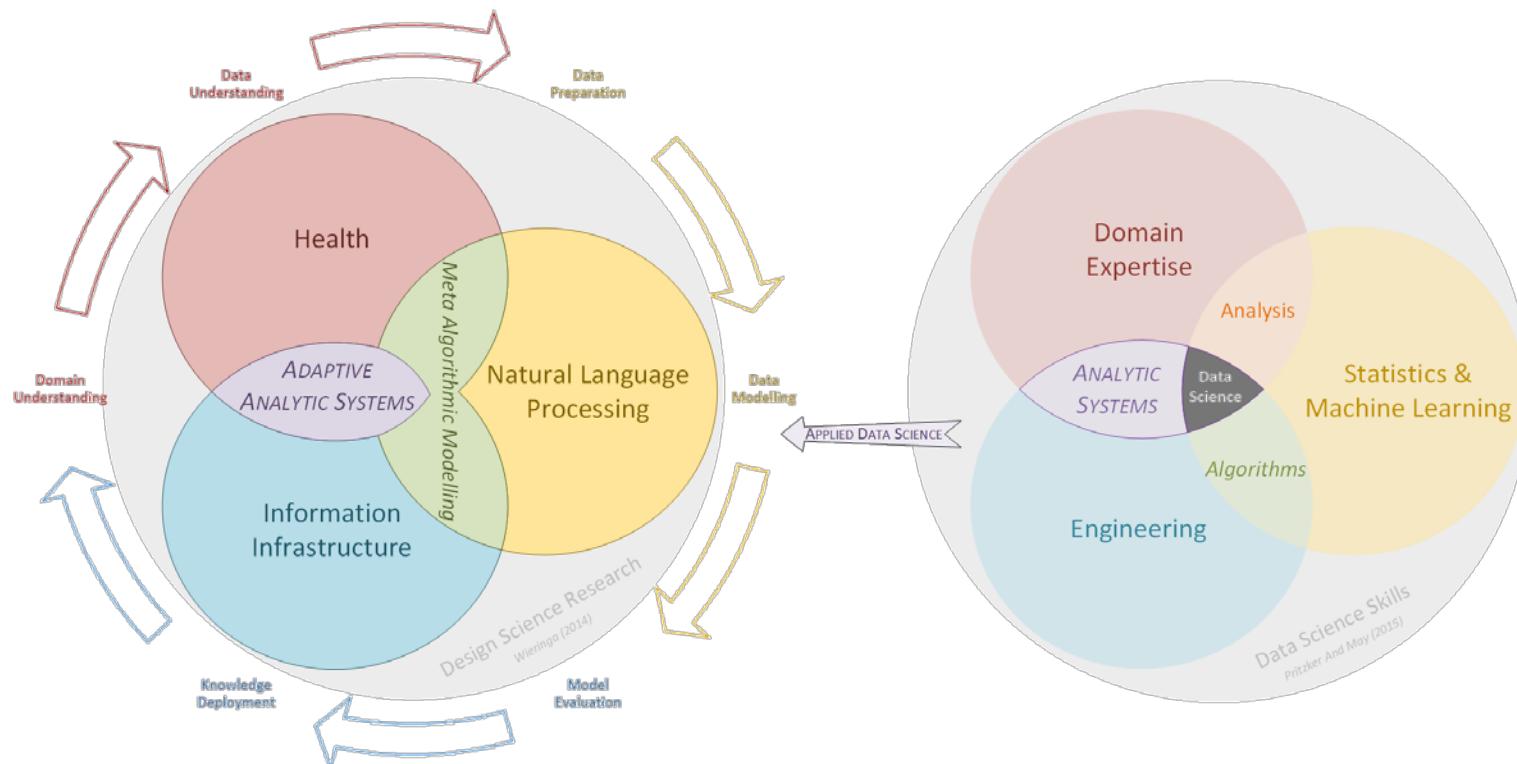
# About... Marco Spruit



- › 1988-1995: Computational linguistics
- › 1993-1997: Business intelligence engineer
- › 1997-2006: Independent software vendor
- › 2003-2015: Applied data scientist
  
- › <http://www.linkedin.com/in/spruit>

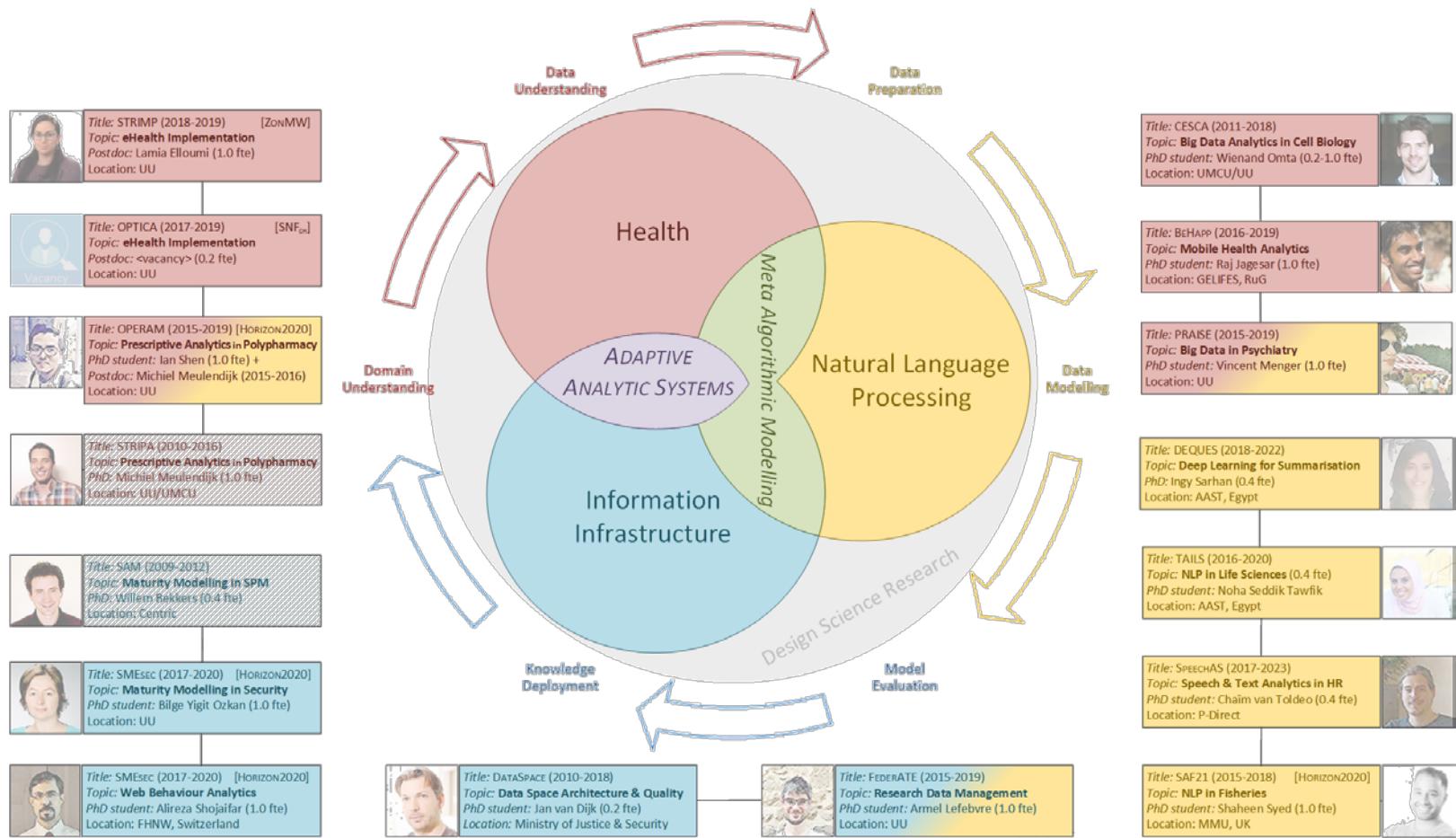


# Research: Adaptive Analytic systems



› <http://m.spru.it/res>

# Projects: Analytic systems



# Course team

› Dr. Marco Spruit



› Dr. Matthieu Brinkhuis



Melchior  
Keijdener



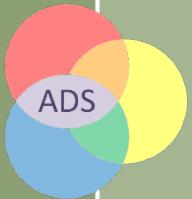
Laurens  
Müter



Vincent  
Menger, MSc

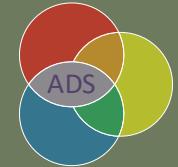
# About you

- › Check your name on the Attendance list
- › MBI?
- › ADS profile?
- › Not ICS dept?
- › GSLS?



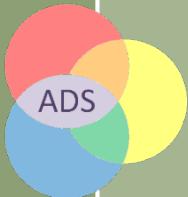
## 2. About this course

A bird's eye view of Data Science & Society



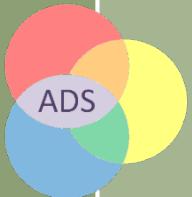
# Big Ideas vs Big Diversity vs Big Numbers

- › Big Ideas
  - Trigger your enthusiasm for applied data science
  - Inspire you to aim for societal impact through data science
- › Feasibility Constraints
  - Provide you with data/information science essentials
  - Account for your diversity
  - Balance classroom scalability limitations
- › Background Diversity
  - Walk the fine line between Big Ideas and their Feasibility
- › “*Third time's the charm*”



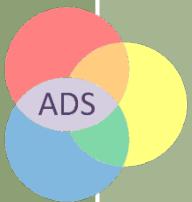
# Learning objectives

1. Understand the role of data science and its societal impact
2. Recognise the knowledge discovery processes in applied data science
3. Identify trends and developments in big data technologies
4. Apply selected big data technologies to solve real-world problems



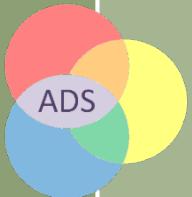
# Learning objectives in course components

	Book review	Assignments	Workshops	Guest talks	Regular lectures
Understand the role of data science and its societal impact	X			X	X
Recognise the knowledge discovery processes in applied data science		X	X		X
Identify trends and developments in big data engineering & analytics	X		X		X
Apply selected big data technologies to solve real-world problems		X	X		



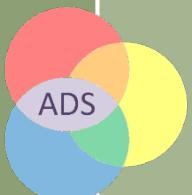
# Types of assignments

1. Explore data science and its societal impact
  - Read, review and (optionally) present book of your own choice
    - › Individual assignment, assessed by staff
2. Study selected scientific literature
  - Read selected scientific papers that are being covered during the course
    - › Individual assignments, assessed in written exam
  - Read parts of the two books that are being discussed during the course
    - › Individual assignment, assessed in written exam
3. Practice with big data tools
  - Perform various tutorials and assignments to familiarize yourself
    - › Individual assignments, assessed in written exam
  - Perform case studies as mid-term and final projects
    - › Individual assignments, assessed in written exam



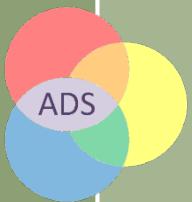
# Grading

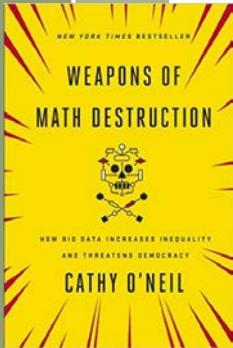
- A. Book review (2-pager + optional pitch)
  - B. Mid-term exam (remindo)
  - C. End-term exam (remindo)
  - D. Optional bonus for extraordinary participation/performance
- 
- › Grade = A\*0.10 + B\*0.40 + C\*0.50 + D
  - › **NB1:** To qualify for the second chance exam, all grading components need to be at least 4.0, and component A needs to have been submitted within the allotted time.
  - › **NB2:** The 2nd chance exam is an extensive market survey report assignment.
  - › **NB3:** You will *not* be graded on your weekly assignments.



# Assignment 1: Book review - Explore data science and its societal impact

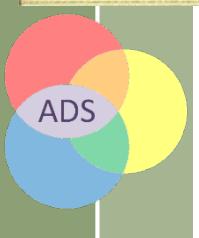
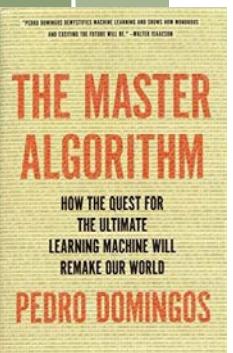
- › Individual assignment
- › Select a popular book from our longlist that may inspire or provoke yourself and us
  - Review the longlist of allowed books: <http://bit.ly/infomdss-books>
  - Submit your Top 3 selection: <http://bit.ly/infomdss-form1>
    - › within 24 hours from now
- › Read the assigned book
  - Order book if necessary, get it from the library, borrow it, etc...
- › Submit the book review form before DEADLINE-02
  - Your structured review and 2-pager pitch:
    - › <http://bit.ly/infomdss-assignment1>
- › For each of the 20 books, the highest graded 2-Pager will be presented as a 3-minute-pitch in the lecture slot on Tue Oct 2





## Here's a random selection of the 20 books...

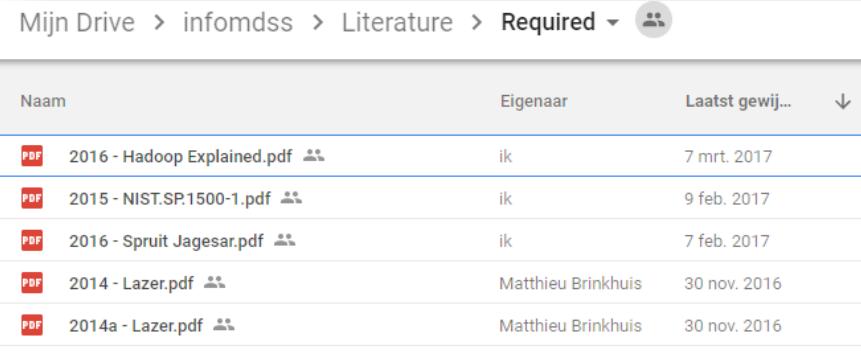
- › Weapons of Math Destruction: How Big Data Increases Inequality and Threatens Democracy [[amazon](#)]
  - “A former Wall Street quant sounds an alarm on the mathematical models that pervade modern life — and threaten to rip apart our social fabric”
- › Life 3.0 Being Human in the Age of Artificial Intelligence [[amazon](#)]
  - “How will Artificial Intelligence affect crime, war, justice, jobs, society and our very sense of being human?”
- › The Master Algorithm: How the Quest for the Ultimate Learning Machine Will Remake Our World [[amazon](#)]
  - “Pedro Domingos lifts the veil to give us a peek inside the learning machines that power Google, Amazon, and your smartphone. He assembles a blueprint for the future universal learner—the Master Algorithm—and discusses what it will mean for business, science, and society. If data-ism is today's philosophy, this book is its bible.”



# Some of the course literature

See <http://www.cs.uu.nl/education/vak.php?stijl=2&vak=INFOMDSS>

- › White, J. (2016). *Hadoop: The Definitive Guide*. Third edition. O'Reilly.
- › Chambers, B., & Zaharia, M. (2018). *Apache Spark - The Definitive Guide*. O'Reilly.
- › Lazer, D., Kennedy, R., King, G., & Vespignani, A. (2014). The parable of Google Flu: traps in big data analysis. *Science*, 343(6176), 1203-1205.
- › *Fundamentals of information systems (IS.pdf)*

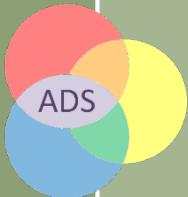


The screenshot shows a Google Drive interface with the path: Mijn Drive > infomdss > Literature > Required. The table lists five files:

Naam	Eigenaar	Laatst gewij...
PDF 2016 - Hadoop Explained.pdf	ik	7 mrt. 2017
PDF 2015 - NIST.SP.1500-1.pdf	ik	9 feb. 2017
PDF 2016 - Spruit Jagesar.pdf	ik	7 feb. 2017
PDF 2014 - Lazer.pdf	Matthieu Brinkhuis	30 nov. 2016
PDF 2014a - Lazer.pdf	Matthieu Brinkhuis	30 nov. 2016

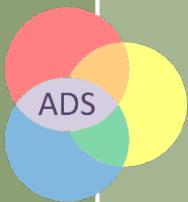
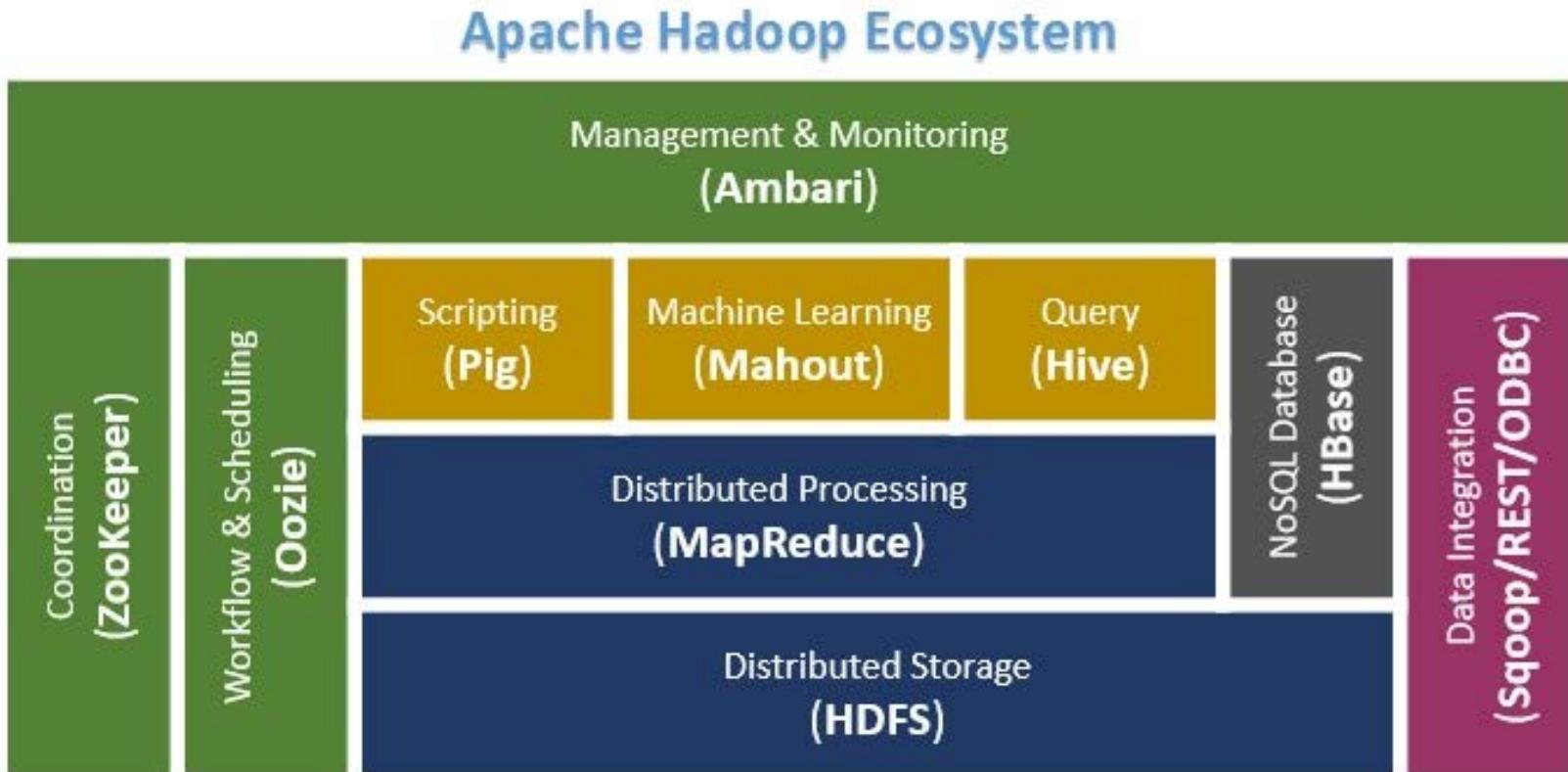
See **Required** folder in:

- › [http://bit.ly/infomdss-lit \(...\)](http://bit.ly/infomdss-lit (...))



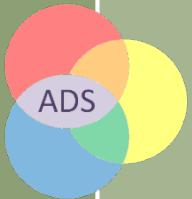
# Assignment(s) : Practice with big data tools

- › Python, R
  - on Azure in Ubuntu VM
- › Hadoop
- › Spark



# Guest lectures (-1)

- › Neonatology (WKZ/UMCU)
  - Prof. Manon Benders MD
  - Dr. Daniel Vijlbrief MD
- › Epidemiology (Julius/UMCU)
  - Dr. Charlotte Onland-Moret MD
- › Big Data in Psychiatry (UMCU)
  - Prof. Floortje Schepers, with Vincent Menger MSc
- › Geospatial information systems
  - ESRI NL
- › Ethics, Privacy, Regulations in Big Data
  - Menno Mostert, MSc (UMCU)



# Course website:

<http://www.cs.uu.nl/education/vak.php?stijl=2&vak=INFOMDSS>



Universiteit Utrecht

Department of Information and Computing Sciences

**Departement Informatica**   **Onderwijs**

**Bachelor**   [Informatica](#)   [Informatiekunde](#)   [Kunstmatige intelligentie](#)

**Master**   [Computing Science](#)   [Game&Media Technology](#)   [Artifical Intelligence](#)   [Business Informatics](#)

## Onderwijs Informatica en Informatiekunde

### Data science and society

*Website:* [website containing additional information](#)

*Course code:* INFOMDSS

*Credits:* 7.5 ECTS

*Period:* period 1 (week 36 through 45, i.e., 3-9-2018 through 9-11-2018; retake week 1)

*Timeslot:* C457

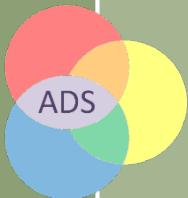
*Participants:* up till now 76 subscriptions

*Schedule:* Official schedule representation can be found in Osiris

time	Mon	Tue	Wed	Thu	Fri
09-13	A1+2	B1+2	A4+5	C6+7	D4+5
13-17	C1+2	C4+5	D1+2	B3+4	D6+7
17-19	C3	A3	D3	B5	

*Teachers:*

	<b>form</b>	<b>group</b>	<b>time</b>	<b>week</b>	<b>room</b>	<b>teacher</b>	
innovatie						Marco Spruit	
lecture			Tue 15.15-17.00	37-44	RUPPERT-PAARS	Marco Spruit	
			Thu 11.00-12.45	36	UNNIK-GROEN	Matthieu Brinkhuis	
tutorial	group 1		Tue 13.15-15.00	37-44	RUPPERT-111	#SSOI	
				37-44	RUPPERT-B	Melchior Keijdener	



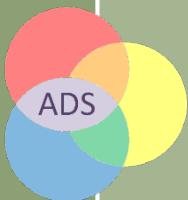
# Course Communication: Teams

- › Join <http://bit.ly/infomdss-teams>
- › ... NOW; with your SolisID/UUemail



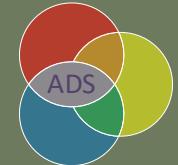
# Putting it together... Course Schema (*subject to updates*)

week 1 (37)	2018-09-03		-	book review	-		course intro
week 2	2018-09-10		INIT VM: Ubuntu	basic Linux commands	Hadoop overview		Hadoop - map reduce
week 3	2018-09-17		wordcount in Hadoop	map reduce	GUEST: Neonatology - dataset I is presented		Hadoop - Advanced HDFS and MR
week 4	2018-09-24		data engineering in Hadoop	neonatology data engineering	t.b.d.		Hadoop vs Other data engineering environments
week 5	2018-10-01	MIDTERM EXAM	NO LAB	exam + optional pitch	Book pitch session (top 20 books)		Matthieu - Statistics in Spark I
week 6 (42)	2018-10-08		Azure Notebook	basic Jupyter notebook	Statistical Methods in Spark II		GUEST: Epidemiology - dataset II is presented
week 7	2018-10-15		INIT VM: DataBricks Azure	GIS pre-lecture assignment	Spark Analytics		GUEST: Geographic IS
week 8	2018-10-22		data engineering in Spark	epidemiology data engineering	t.b.d.		t.b.d.
week 9	2018-10-29		data analytics in Spark	epidemiology data analytics	GUESTS: Big Data in Psychiatry		FINAL LECTURE
week 10	2018-11-05		Big Text in Spark	t.b.d.			ENDTERM EXAM



# 3. About this field

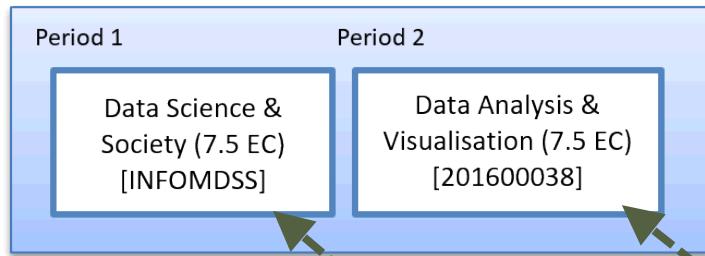
Positioning Data Science & Society



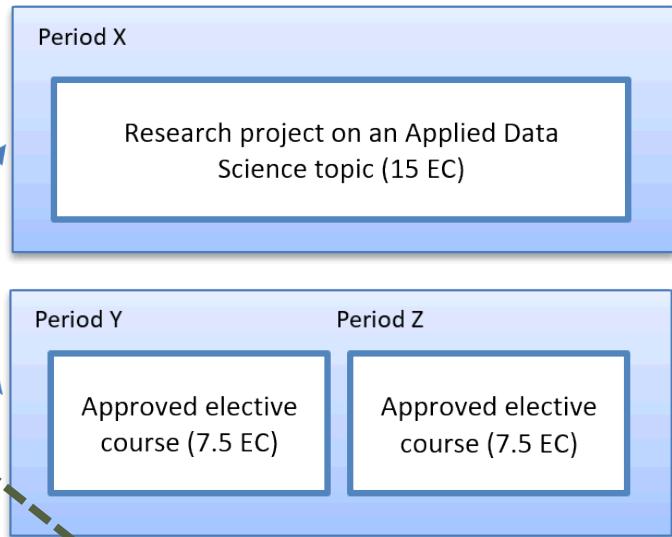
# Applied Data Science @UU

- › Master's profile Applied Data Science
  - At Graduate School level

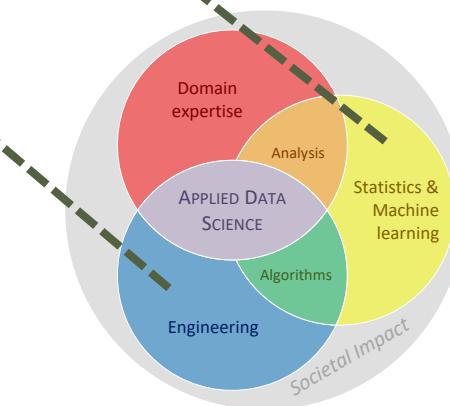
- › Natural Sciences



- › Life Sciences

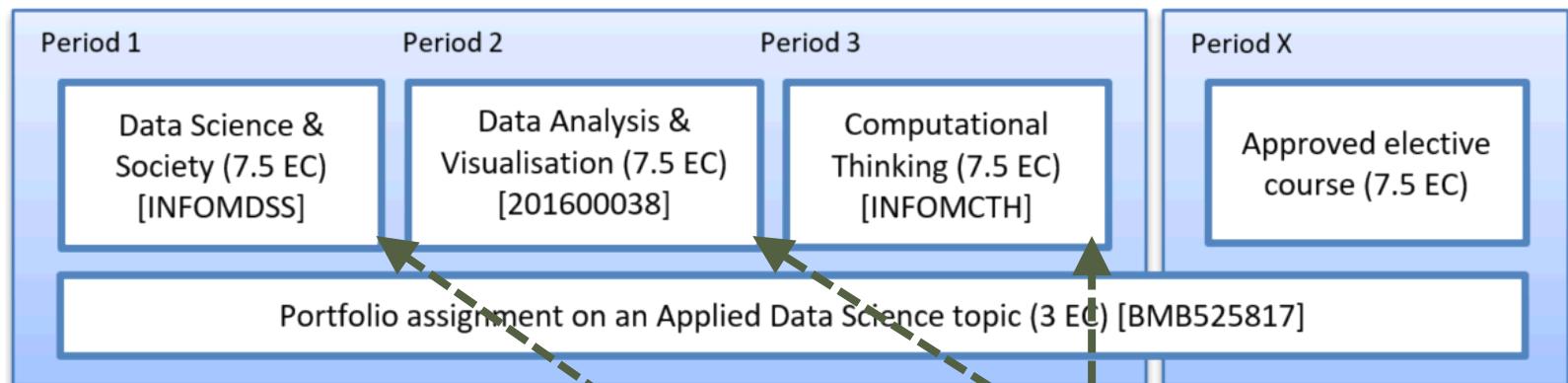


- › Interfaculty-level collaboration

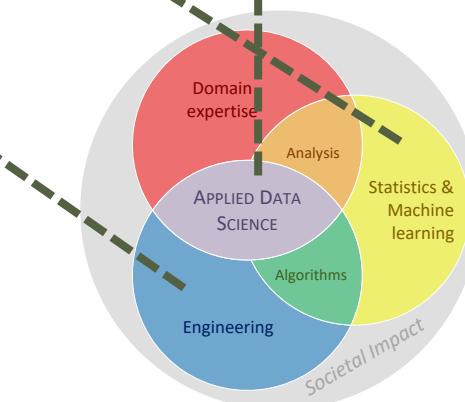


# Applied Data Science @UU

- › Master's profile Applied Data Science
  - At Graduate School level
    - › Natural Sciences
    - › Life Sciences

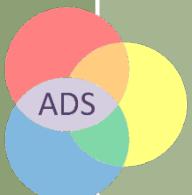


- › Interfaculty-level collaboration



# Positioning DS&S course @UU

Course	Comparison
INFOMDM (Data Mining)	<ul style="list-style-type: none"><li>- Master level</li><li>- Computer science →<ul style="list-style-type: none"><li>- algorithmics, complexity, etc</li></ul></li></ul>
INFOMPR (Pattern Recognition)	<ul style="list-style-type: none"><li>- ditto</li></ul>
Big Data (INFOMBD)	<ul style="list-style-type: none"><li>- COSC Master level course on big data analytics/algorithms</li></ul>
Business Intelligence (INFOMBIN)	<ul style="list-style-type: none"><li>- Business Analytics through Datawarehousing (structure++)</li></ul>



# Applied Data Science @UU

- › Master's profile Applied Data Science: ✓
- › Focus area Applied Data Science: ... ✓
  - <https://www.uu.nl/ads>
- › Postgraduate MSc programme Applied Data Science in Health: ... ✓
- › Community: Applied data science SIGs: ... ✓



SIG Machine Learning Applications



SIG Machine Learning Fundamentals



SIG Sensors

[READ MORE >](#)

[READ MORE >](#)

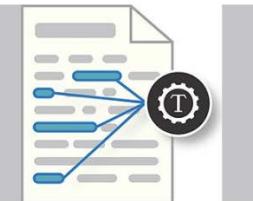
[READ MORE >](#)



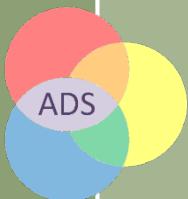
SIG Learning Analytics



SIG Clinical Data Applications

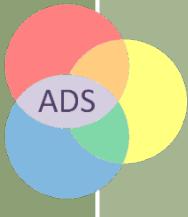


SIG Text Mining

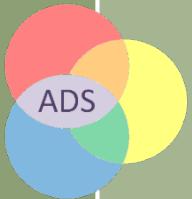
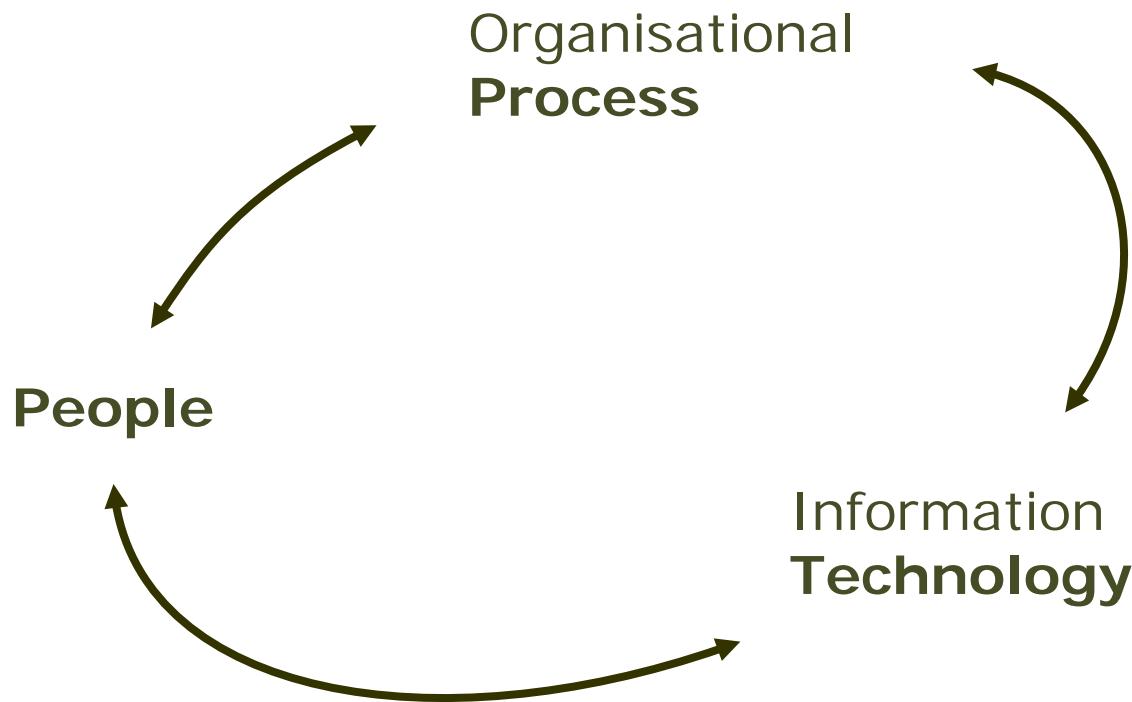


# Builds on topics from bachelor Informatiekunde...

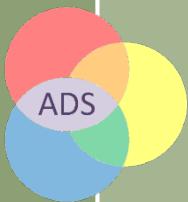
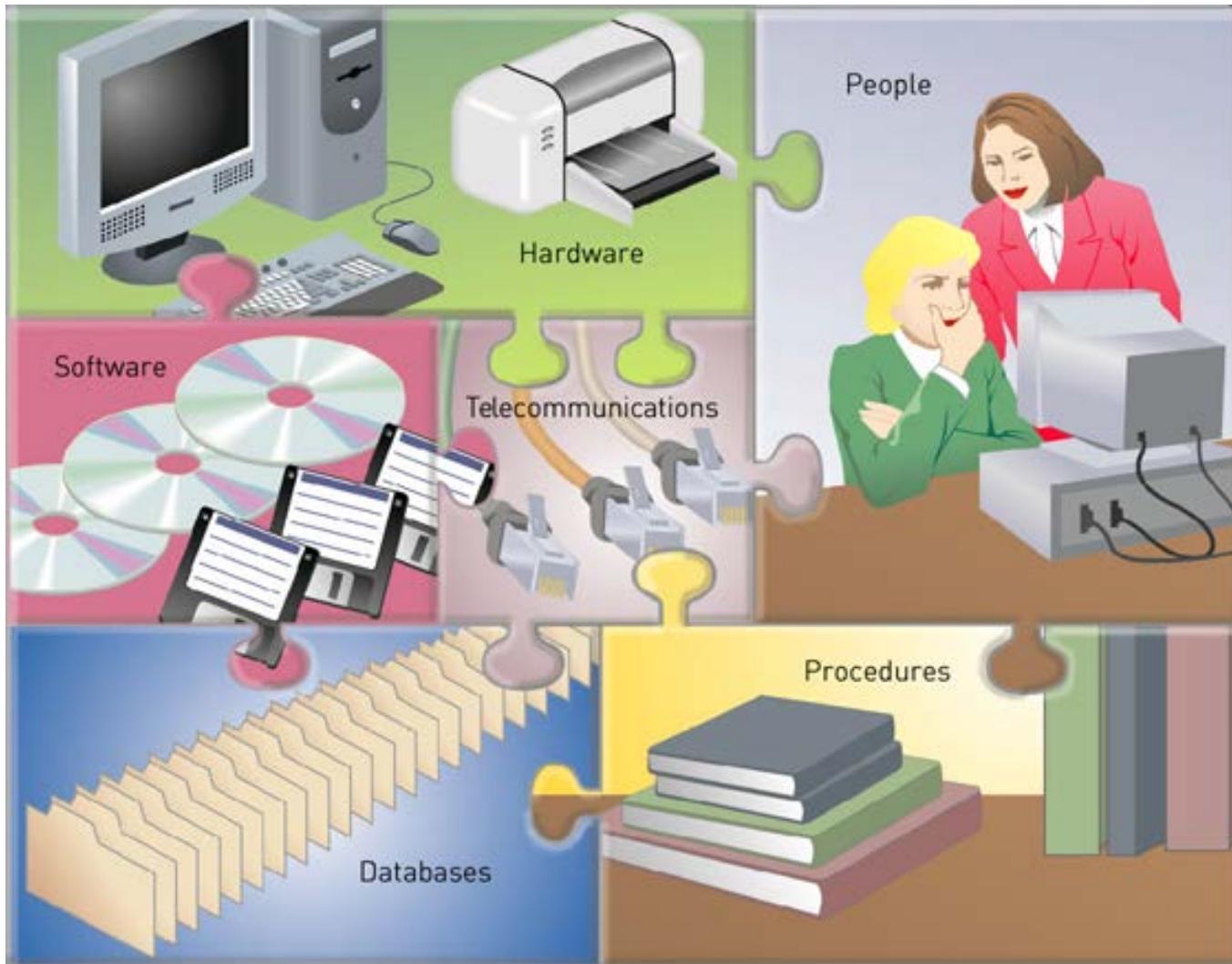
Information Science CORE			
Start:	Data Modelling	Mobile Programming	Information Science Project
Basis:	Scientific Research Methods	Modelling and System Development	
Information Science PATHS			
Study path:	Organisations & Society	Games & Interaction	Life Sciences & Health
Start:	Organisations & ICT	Design of Interactive Systems	People, Society & ICT
	Information Systems	Information Exchange	
Basis:	e-Business	Cognition & Emotion	Data Analytics
	Product Software	Usability Engineering	Knowledge Systems
Deepening:	Information Security	Game Design	Persuasive Technologies
Synthesis:	Strategic Management & ICT	Applied Games	Life Sciences & Health Informatics
Completion:	Research Project		



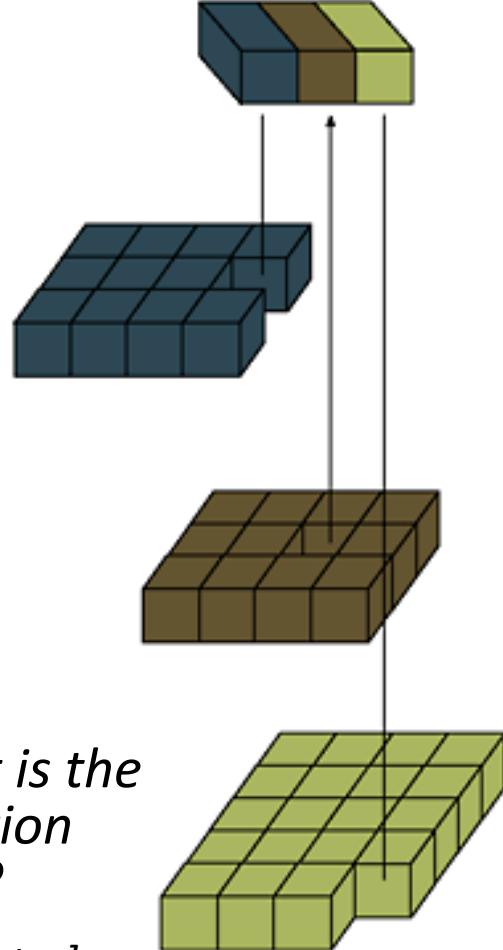
# Applied Data Science vs. Information systems



# CBIS: Computer-Based Information System



# Applied Data Science vs. Databases & SQL, in Jeopardy



Data Table 1: Project Table

Project number	Description	Dept. number
155	Payroll	257
498	Widgets	632
226	Sales manual	598

Data Table 2: Department Table

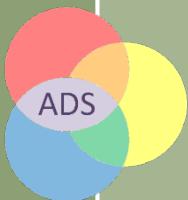
Dept. number	Dept. name	Manager SSN
257	Accounting	005-10-6321
632	Manufacturing	549-77-1001
598	Marketing	098-40-1370

Data Table 3: Manager Table

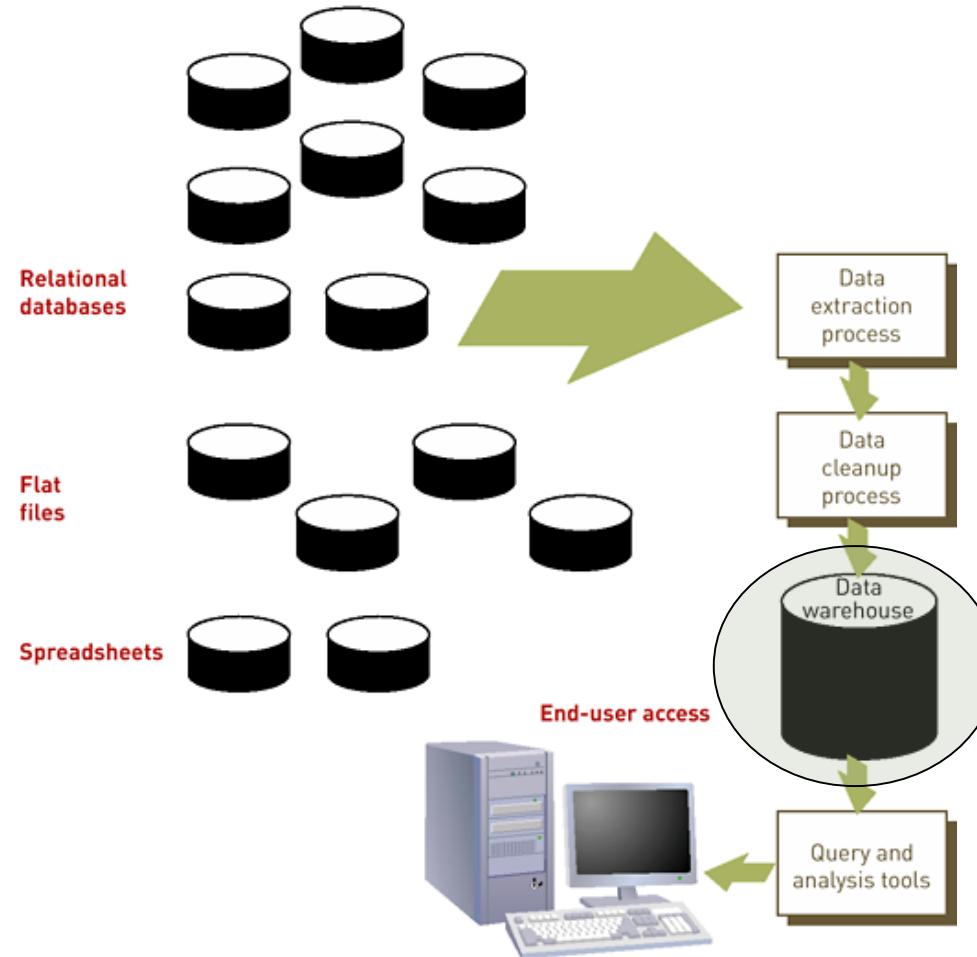
SSN	Last name	First name	Hire date	Dept. number
005-10-6321	Johns	Francine	10-07-1997	257
549-77-1001	Buckley	Bill	02-17-1979	632
098-40-1370	Fiske	Steven	01-05-1985	598

- › *What is the question here?*
- › *[2 minutes]*

**Who is the manager of the Sales Manual and since when is he on the company's payroll?**

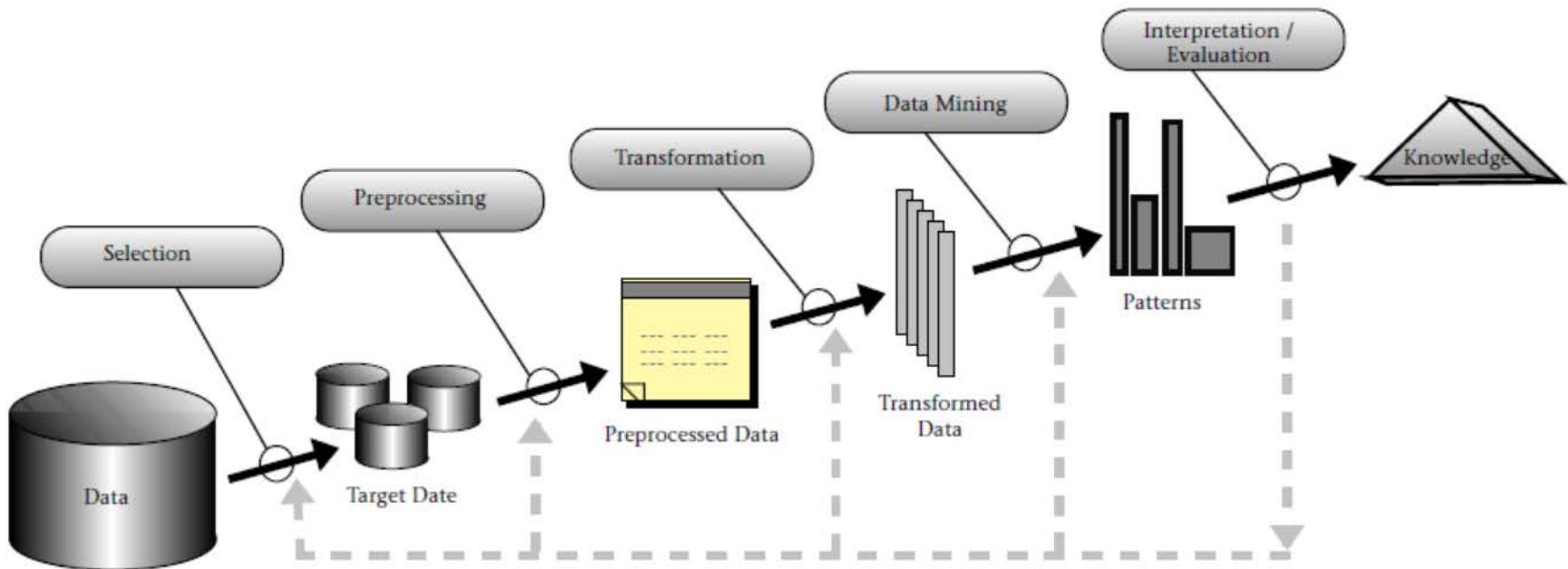


# Big Data vs. Data Warehouses & Data Marts

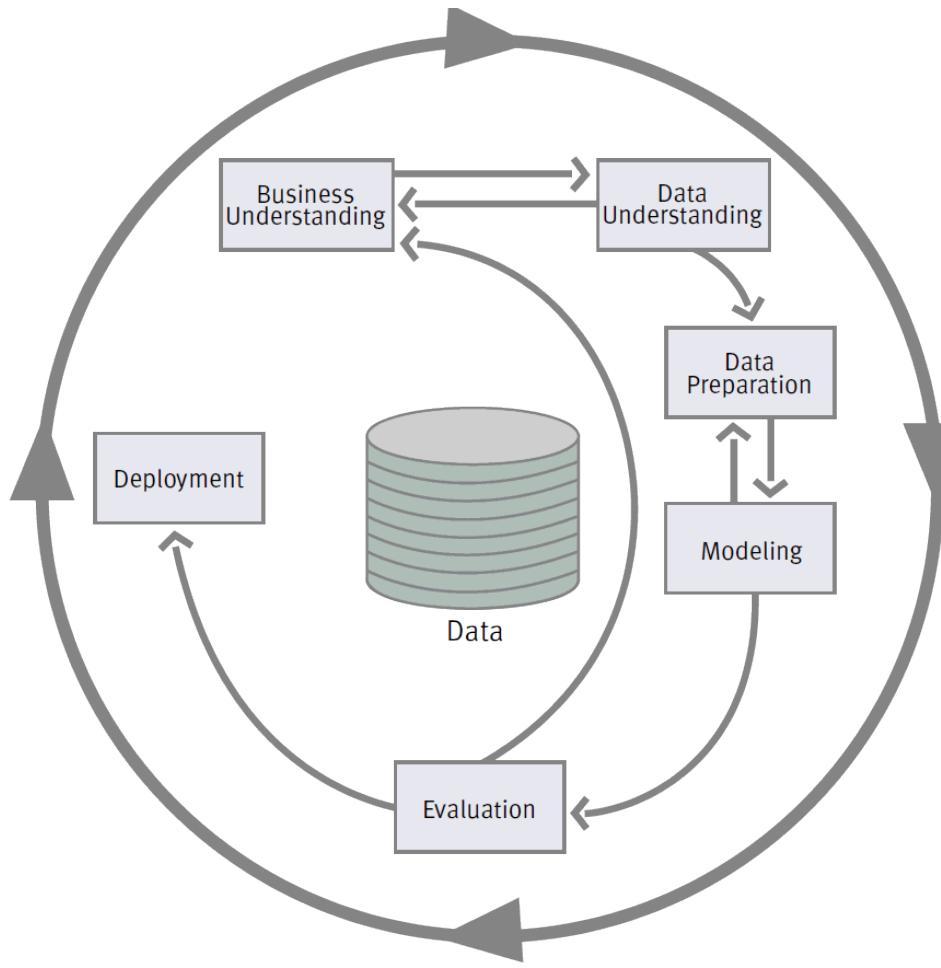


# KDD: Knowledge Discovery in Databases

- › “The KDD process is interactive and iterative, involving numerous steps with many decisions made by the user.”



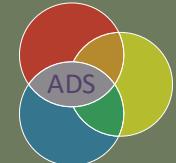
# CRISP-DM: Cross-Industry Standard Process for Data Mining



1. *Pitch-on-paper assignment*
2. *Pitch-in-event assignment*
3. *Tips & tricks*
4. *Example*

## 4. More about Assignment 1

Book review

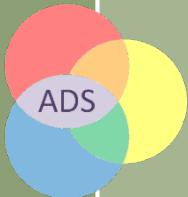


# Assignment 1: Previously selected books...

Student number	Title	Pos-Neg	Why this book?		
3973581	System Upgrade v2.016: Solutions for a failing economy, wealth distribution, declining democracy, climate change, and robots that steal jobs	3	It talks about how rare it. This can also be a paradox.		
3872440	Rise of the Robots: Technology and the Threat of a Jobless Future	4	I think the paradox of technology can contribute to my own memorizing information.		
5951976	The Signal and the Noise: Why So Many Predictions Fail--but Some Don't	5	It is said to be the best book on the topic.		
3664163	No place to hide	3	Engineering the human		
5743788	Big Data: A Revolution That Will Transform How We Think	2	I have a copy of it; it's DS)		
		4	My interest goes out		
Student n	Title	Pos-Neg	Why this book?		
3830810	Nine Algorithms That Will Transform Your Future	4001745	Humans Need Not Apply: A Guide to Wealth and Work in the Age of Artificial Intelligence	3	This book aims to give insight in the possible obstacles to make a future where humans and machine work together. It turns out from this book that it will be a difficult task unless we choose to make some big sacrifices. This dilemma makes it interesting in my opinion
3927792	The Inevitable: Understanding the Forces That Will Shape Our Future	4104641	Winning with Data: Transform Your Culture, Empower Your People, and Shape the Future	3	In a time where Big Data is everywhere around us, it is almost a must to adapt to the circumstances. For me personal, it is interesting to know how I can use this knowledge at the end of my masters and start working in about a year. Hence, it is important to know how my future employer can adapt to the changing business environment.
3854442	Smart Cities: Big Data and the Quest for a Better Future	5814502	Doing Data Science: Straight Talk from the Frontline	4	Although it's not much of a "pop science" book, it seems very inspiring. It gives examples of how companies like Google, eBay and Microsoft apply Data Science in practice. It can be a good start to get an overview of the field.
4154924	Humanizing Big Data: Meeting of Data, Consumer Insights, and Design	6000290	Data and Goliath	3	I like to know more about these tracking systems and how they work.
			The Theory That Would Not Die	4	Because of my interest to the Bayesian approach to statistics
5795621	Predictive Analytics: The Smartest Way to Predict Who Will Do What		Automate This	4	Gives insights in current ways of using algorithms and data science to predict what people will do.
			Green Information	5	Considering Data Science and Society, to my belief doing something good for society.

# Assignment 1a: Pitch-on-paper

- › Submit Top-3 books through Google Form:
  - <http://bit.ly/infomdss-form1>
- › Submit pitch “review” through: <http://bit.ly/infomdss-assignment1>
  - four open questions, each with a 1-5 rating on “perceived quality”
  - also upload “2-pager pitch” PDF
- › Explaining your book’s:
  1. Key problem related to data science
  2. Described societal impact of this problem
  3. Application field of focus
  4. Estimated scientific feasibility
- › Overall
  - a) recommendation score
  - b) set of 10 ordered thematic keywords



## Assignment 1b: Pitch-in-event

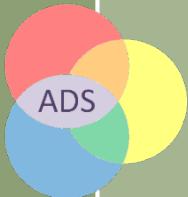
- › After submission, all 2-pagers will be graded
  - › The best pitch for each book present a 3-minute pitch in the Pitching lecture on Tue Oct 2
  - › 0.5 bonus on grading component A if pitch was satisfactory
- 
- › *A good pitch satisfies at least the following criteria:*
1. Your pitch provides instant insight into the key message of the book.
  2. You *show* (explicitly) what the Big Problem is that this book tackles and what Big Solution it envisions or aims to deliver.



# Pitching tips & tricks

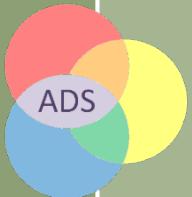
› *Next, you enhance the pitch by PLUS-ing it:*

1. **“Pulling demand”**: your pitch needs to leave the listeners behind with a desire to read the book themselves.
2. **“Lasting”**: your pitch needs to be remembered by your audience. You only have max. 3 minutes to make a good impression. Start with a catchy opening (e.g. a question or anecdote), and also introduce yourself very briefly, and why you chose this book.
3. **“Undeniable”**: Be very clear. Be ‘to-the-point’.
4. **“Simple”**: The pitch should be very light on technical language or jargon. This pitch should be understandable by your grandparents at one of your family parties!



# Pitching tips & tricks

- › *Presenting without pictures – The perfect presentation in eight steps*
  1. The Law of the three Ps:
    - › Prepare, prepare, prepare!
  2. Your objective: Touch your audience
  3. Trigger emotions
  4. Use your body language
  5. The magic of the number three
  6. Come up with one-liners
  7. Deviate from the standard
  8. Conform to best practices





Utrecht University

Graduate School of Natural Sciences  
(GSNS)

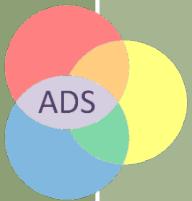
# Applied Data Science

Introducing the multidisciplinary master's profile

**Dr. Marco Spruit**

Coordinator master's profile Applied Data Science

5 Sept 2018



See <http://bit.ly/infomdss-lit>

## Week 01: Literature

- › Davenport, T. H., & Patil, D. J. (2012). Data scientist: The Sexiest Job of the 21st Century. *Harvard business review*, 90(5), 70-76.
- › Stair, R. & Reynolds, G. (2012). *Fundamentals of Information Systems*. Sixth Edition.  
**NOTE: Chapters 1 and 3 ONLY.** Cengage: Boston, MA. ISBN-13: 978-0-8400-6218-5. (*other more recent editions are also fine*).
- › Chapman, P. Clinton, J., Kerber, R., Khabaza, T., Reinartz, T., Shearer, C., and Wirth, R. (2000). *CRISP-DM 1.0 Step-by-step Data Mining Guide*. [[@IBM](#)]
- › Pritzker, P., and May, W. (2015). *NIST Big Data interoperability Framework (NBDIF): Volume 1: Definitions*. NIST Special Publication 1500-1. Final Version 1. National Institute of Standards and Technology.
- › Spruit, M., & Lytras, M. (2018). Applied Data Science in Patient-centric Healthcare: Adaptive Analytic Systems for Empowering Physicians and Patients. *Telematics and Informatics*, 35(4), 643–653.

