

De onwaarschijnlijke evolutie van de informatietechnologie

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KU Leuven

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 **STADIUS**
Center for Dynamical Systems,
Signal Processing and Data Analytics

Menu

- From science to technology
- The fourth paradigm
- AI waves
- Use Cases
- Government action programs

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Signal Processing and Data Analytics

The science

1880: Maxwell's laws (electro-magnetism)

1905: Quanta: Planck and Einstein

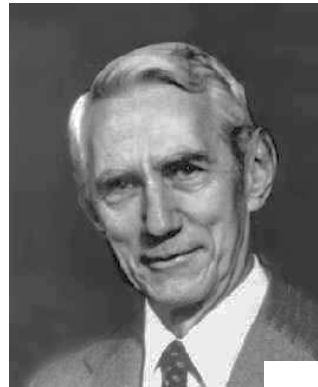
1910: Atom model Bohr

1930: Quantummechanics of Heisenberg, Schrödinger,...

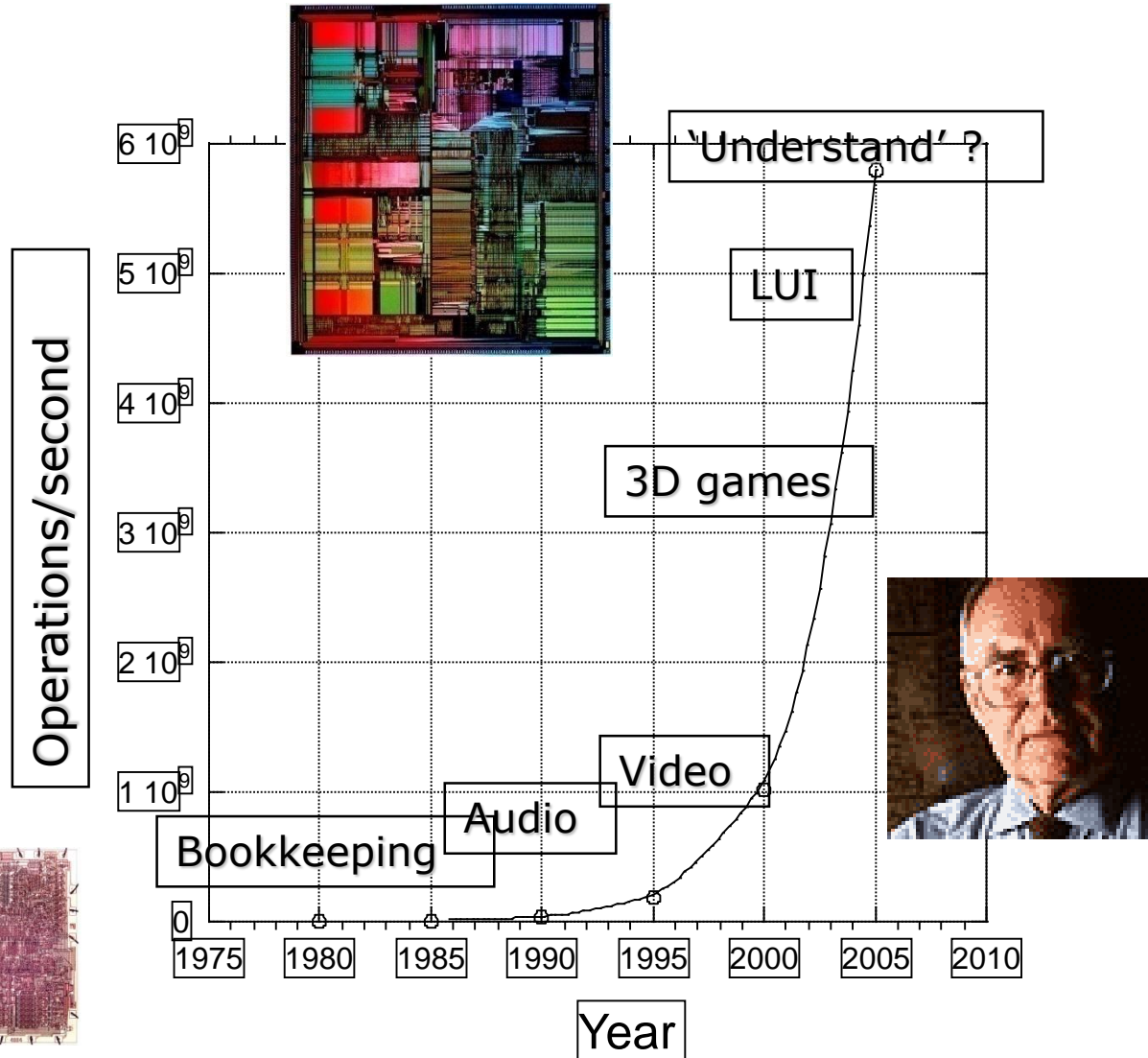
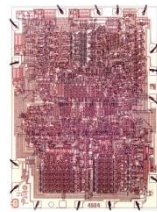
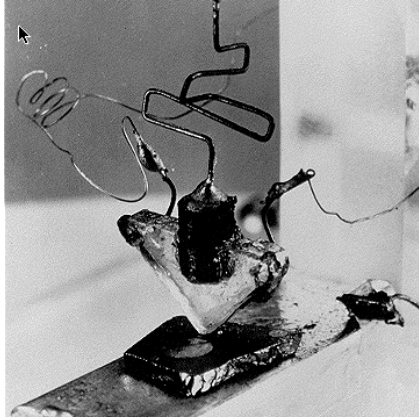
1940: Computer (principle) of Turing and von Neumann

1948: Information theory of Shannon

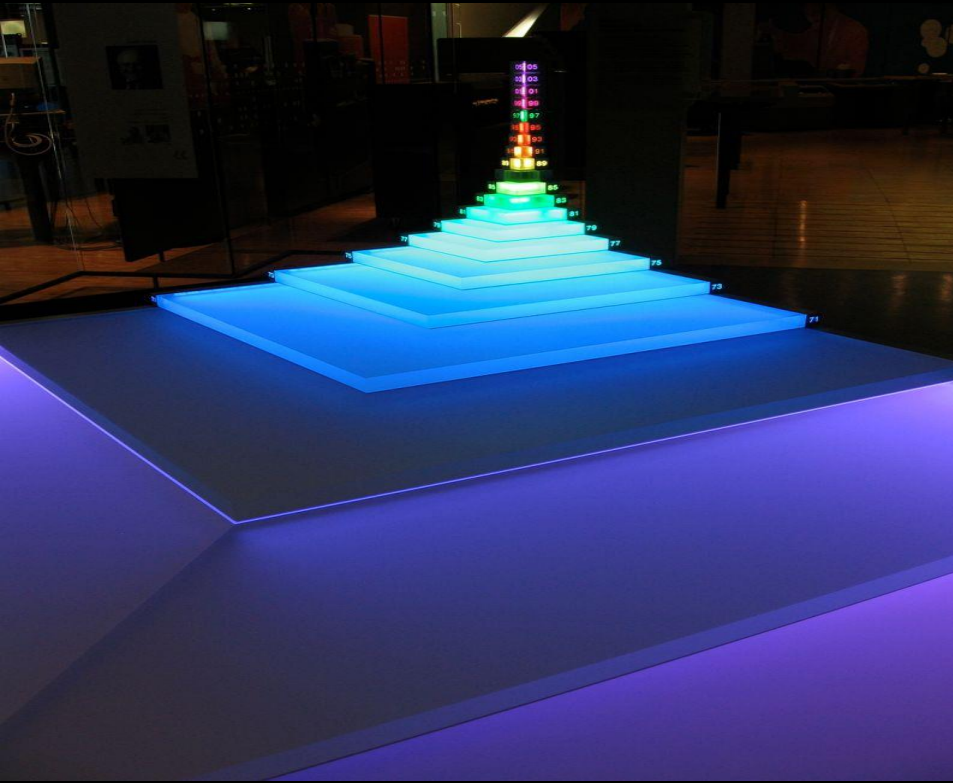
1950: Transistor of Shockley, Bardeen,...



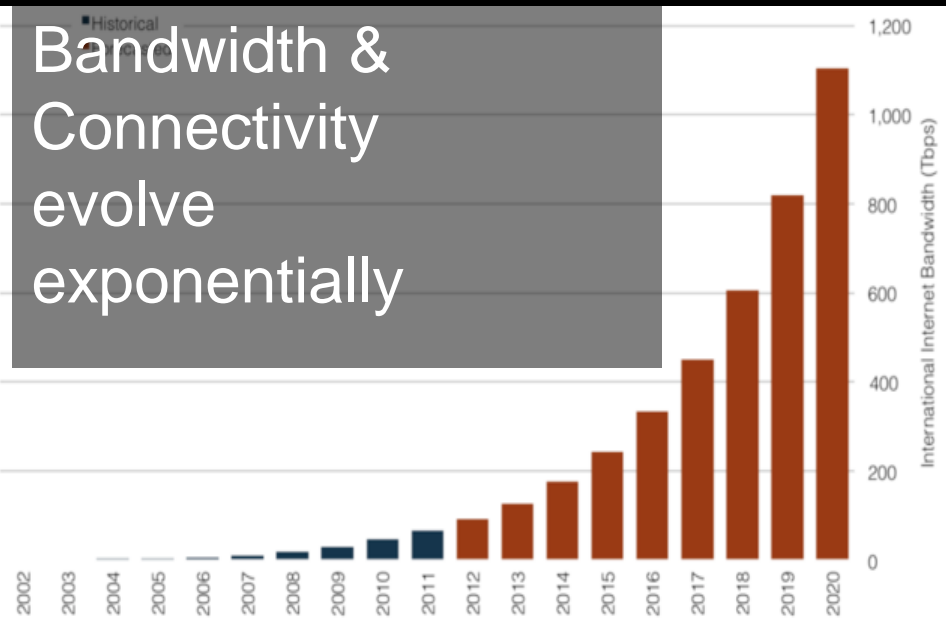
Technology and Engineering Design: The third industrial revolution (1945...)

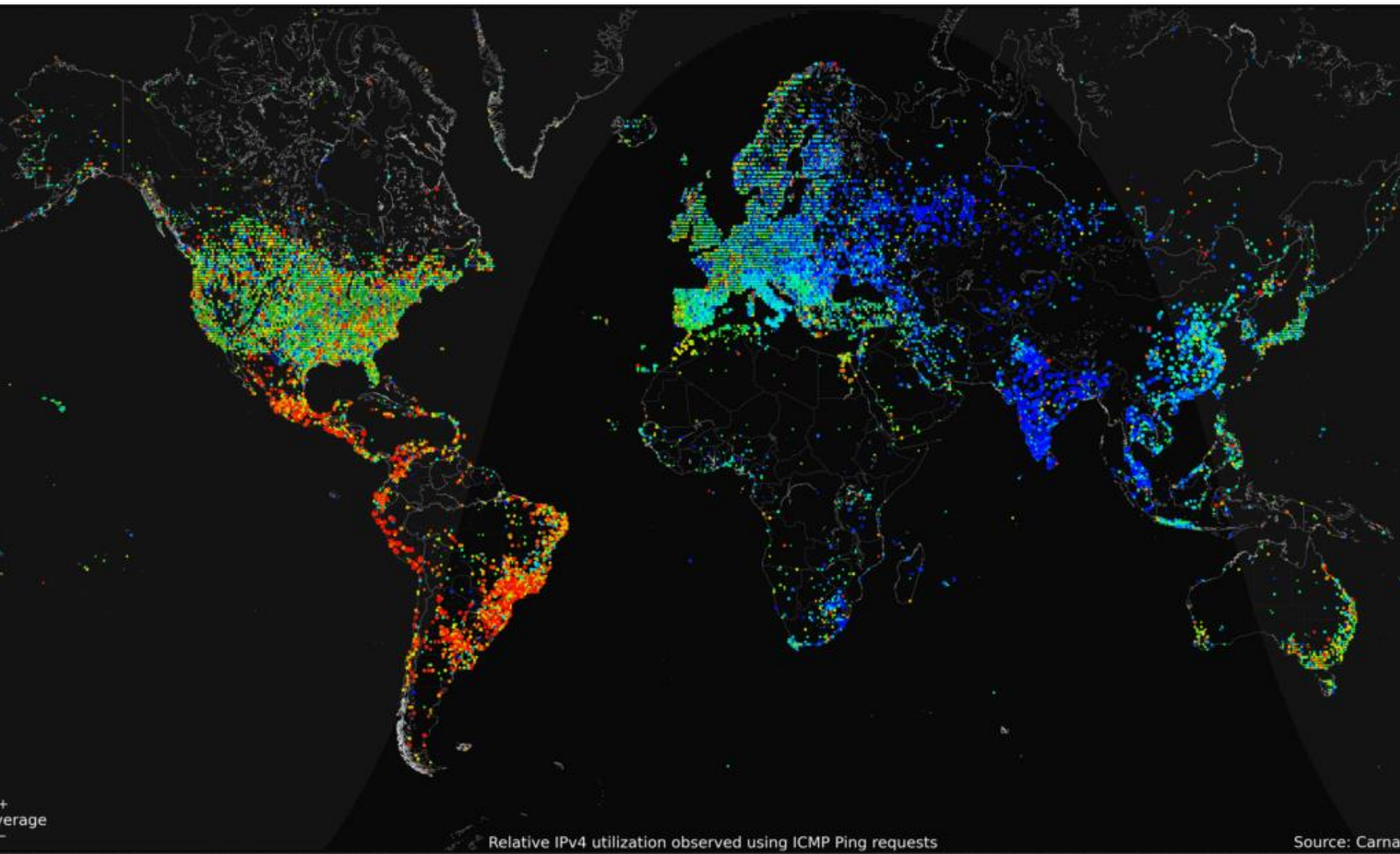


Computational power x 2 every 18 months



Moore's law:
computing power
doubles
every 18 months





+
verage

Relative IPv4 utilization observed using ICMP Ping requests

Source: Carna



Grains of rice the world consumes annually: **27.5 quadrillion**

Amount of data the world consumes every 30 minutes: **40.4 petabytes**

We consume more bytes on the internet in 30 minutes than grains of rice in a year.

1 million = 1 000 000

1 billion = 1 000 000 000

1 trillion = 1 000 000 000 000

1 quadrillion =

1 000 000 000 000 000

1 kB = 1 000

1 MB = 1 000 000

1 GB = 1 000 000 000

1 TB = 1 000 000 000 000

1 PB = 1 000 000 000 000 000

1 TB

= large university library

= 212 DVD discs

= 1430 CDs

= 3 year music CD quality

Menu

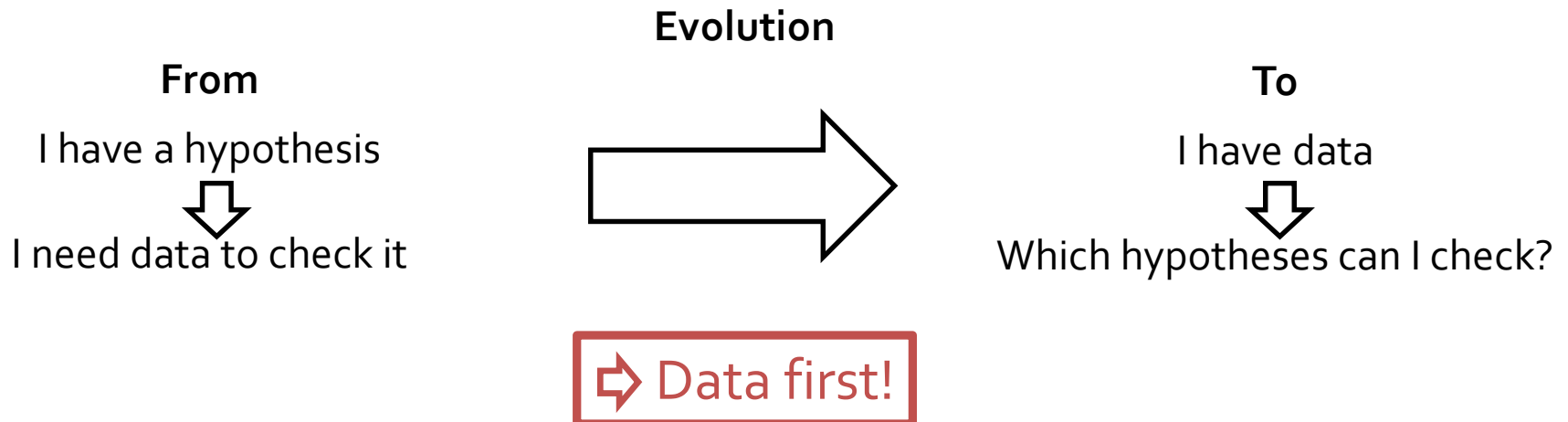
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- The fourth paradigm
- AI waves
- Use Cases
- Government action programs

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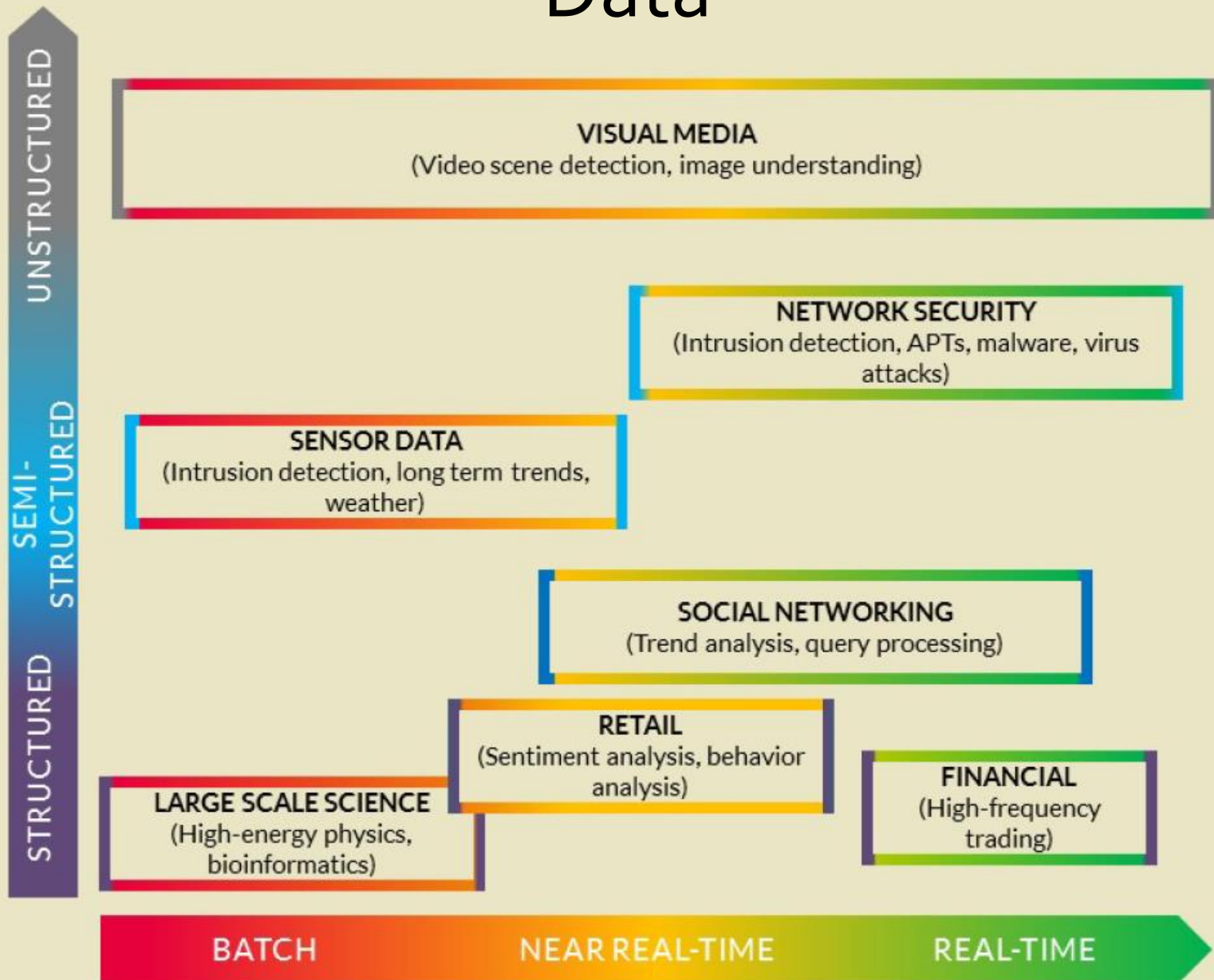
The Fourth Paradigm

Paradigm	Time Ago	Method
First	A millenium	Empirical
Second	A few centuries	Theoretical
Third	A few decades	Computational
Fourth	Today	Data-driven



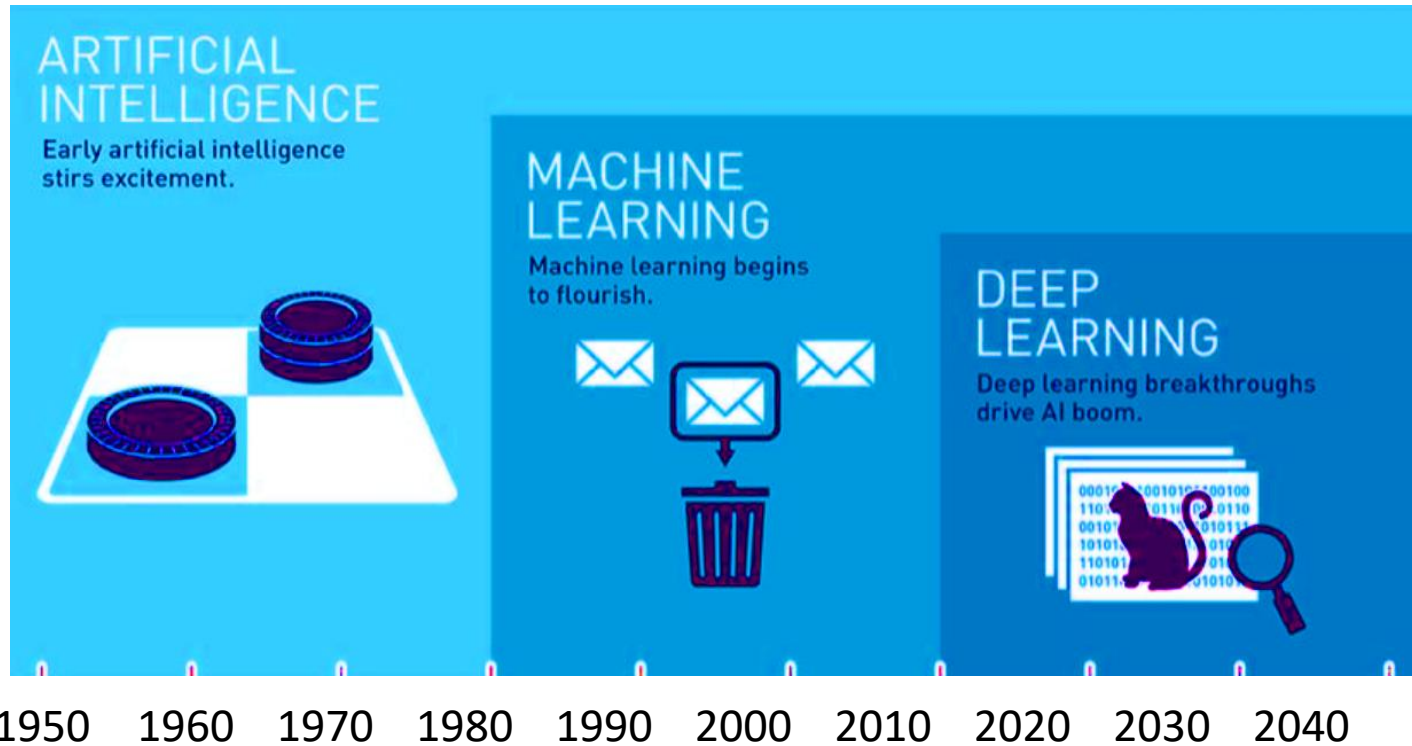


Data



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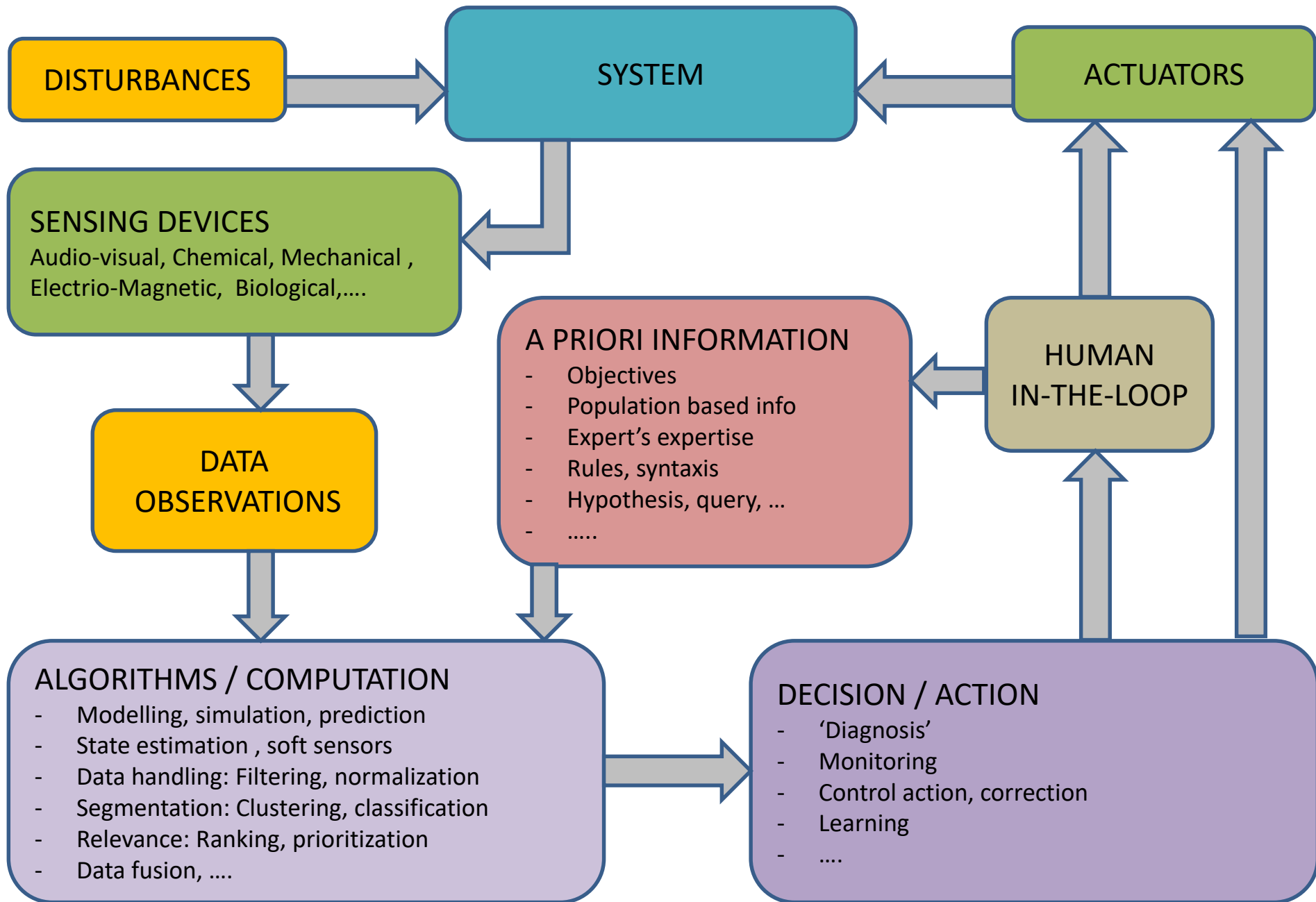
Expert Systems

Data

Computations



AI enabled Decision Support Systems



Main tasks

Prediction



Regression

Segmentation



Clustering

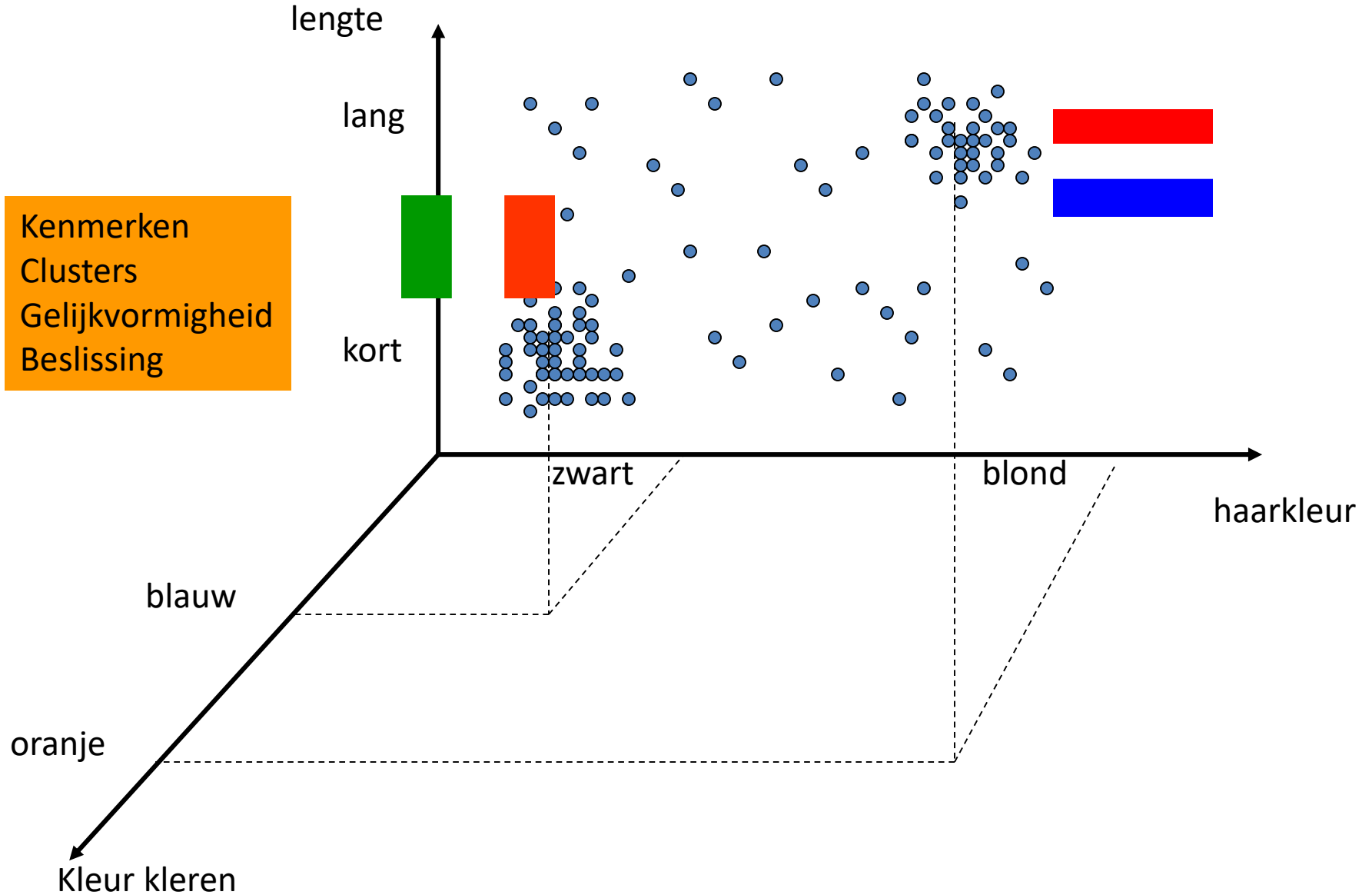
Classification

Anomalies



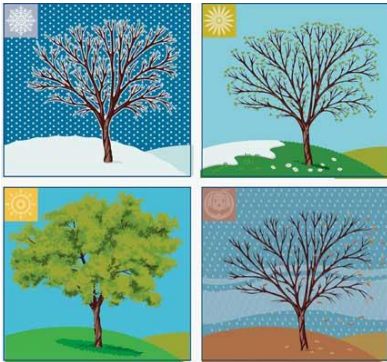
Detect outliers

Methodes om te clusteren



Main tasks

Filtering effects



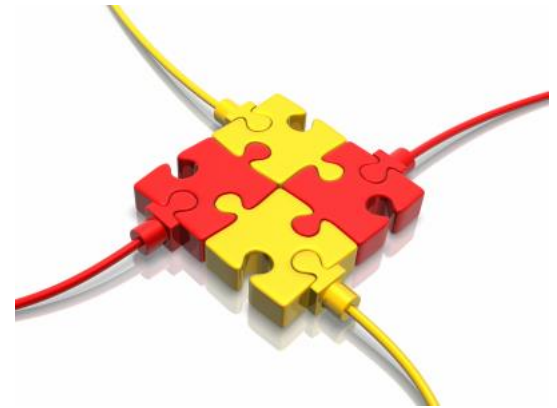
Normalization

Assess relevance



Ranking

Combining info



Data fusion

Objectives - ICT

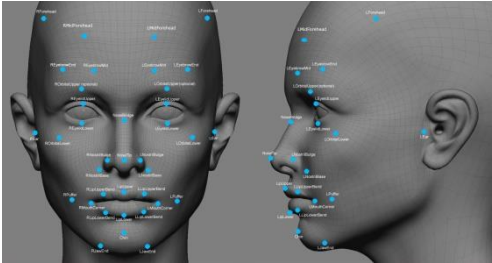
Communication networks



Home automation



Facial recognition



Digital signing



Data center optimization



Objectives - Finance

Fraud detection



Credit worthiness



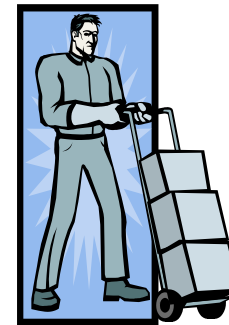
Portfolio management

Order	Symbol	Company	Price	Change	Volume	Market Cap	PE Ratio	Dividend Yield	52-Week High	52-Week Low	Chart
*	HRP	7.01	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	
*	SLE	14.66	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	
*	NWS	19.41	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	
*	MO	20.43	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	
*	HRB	22.55	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	
*	CAG	23.51	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	
*	FRE	27.09	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	
*	HAL	45.23	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	
*	HUM	47.77	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	
*	DGX	49.79	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	
*	K	52.40	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	1.1%	

Risk assessment



Just-in-time production



Objectives – Smart Cities

Predictive maintenance



Flood prediction



Smart lighting



Traffic management



Electricity Demand



Objectives – Health

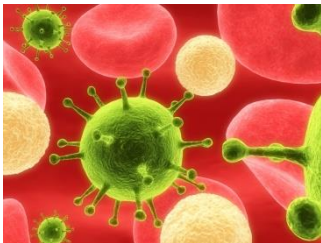
Diagnostics



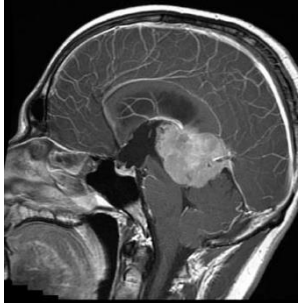
Genome sequencing



Disease spreading



Tumour detection



Medical fraud detection



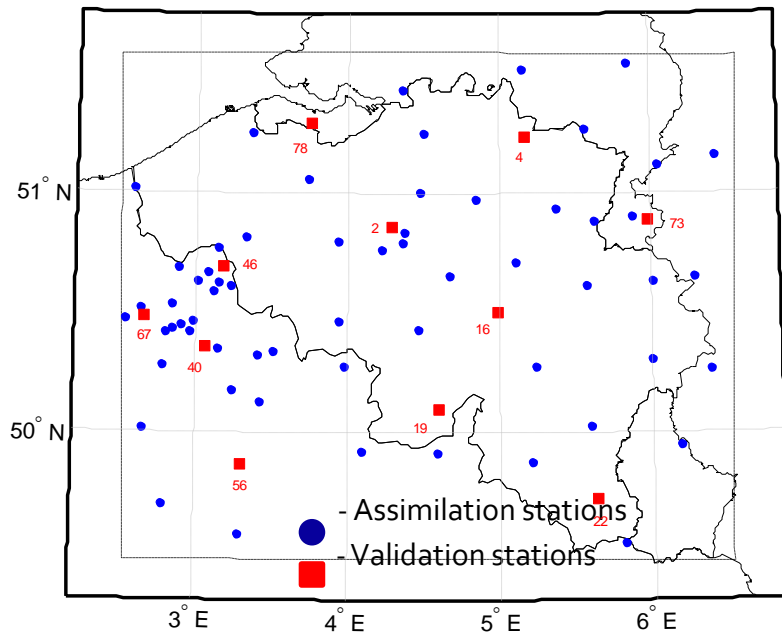
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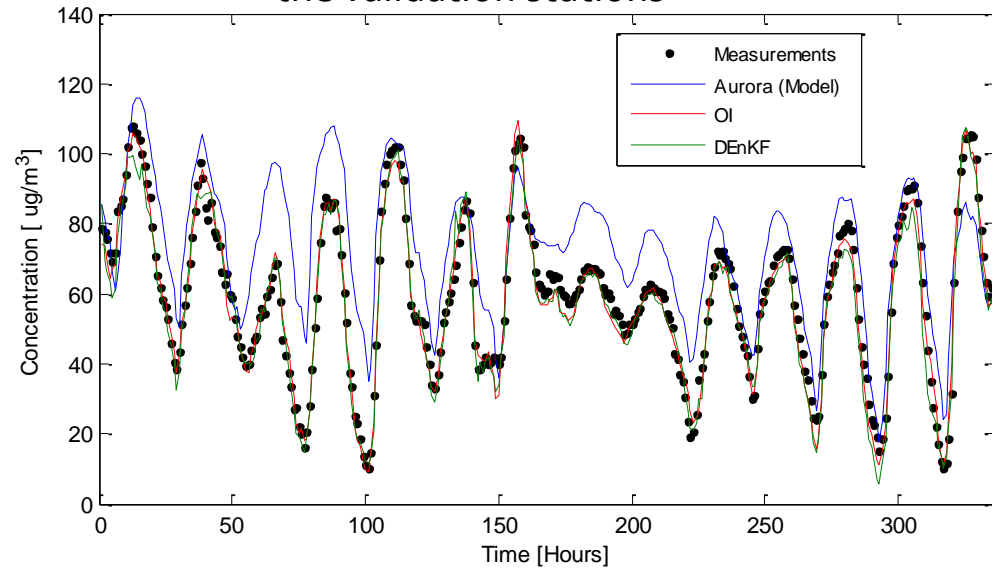
AI enabled Decision Support Systems

- **Smart Cities DSS**
 - Environmental DSS: O3 and small particles
 - Regional flood regulation DSS
 - Nationwide electrical load DSS
 - Security monitoring DSS
 - Sports DSS
- **Industry 4.0 DSS**
 - Chemical processes DSS
 - Mechanical structure monitoring DSS
 - Fraud detection DSS
- **Mobility**
 - Traffic DSS
- **Precision Medicine**
 - DSS for patients, professionals, policy makers
 - CDSS Ovarian Cancer, Biomarker detection
 - CDSS Monitoring Glycemia, vital signals (brain, epilepsy,...)
 - DSS Food
 - DSS Fall detection

O₃ air-quality stations

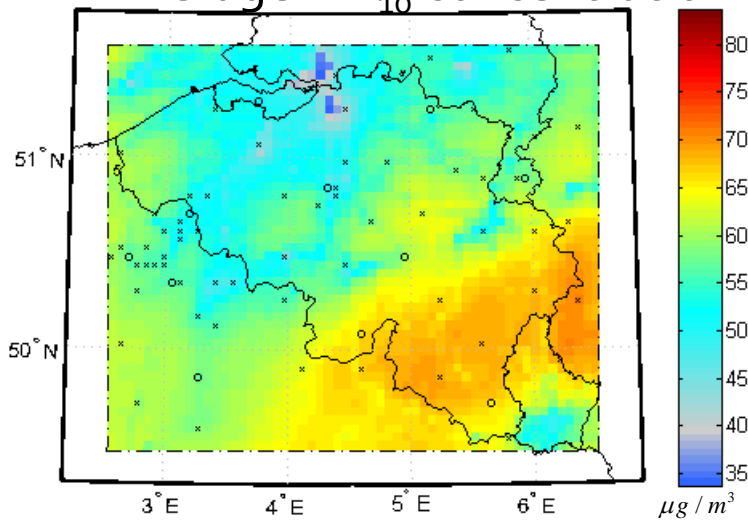


Average of the O₃ concentration over the validation stations

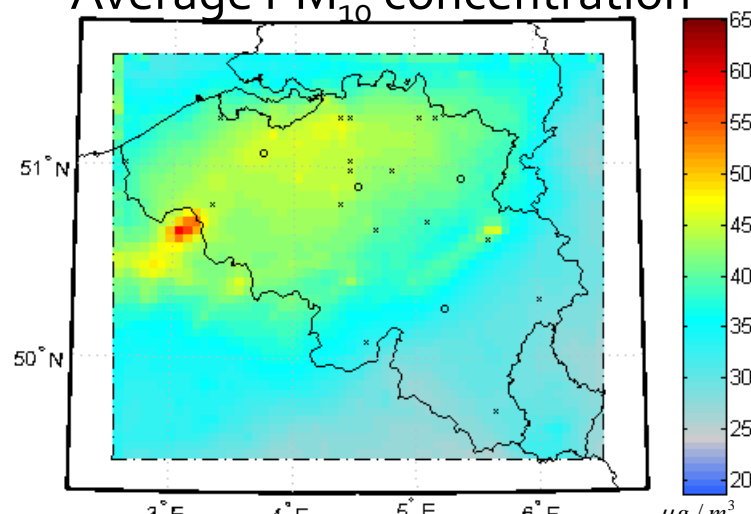


Starting date: May 28th, 2005 at midnight

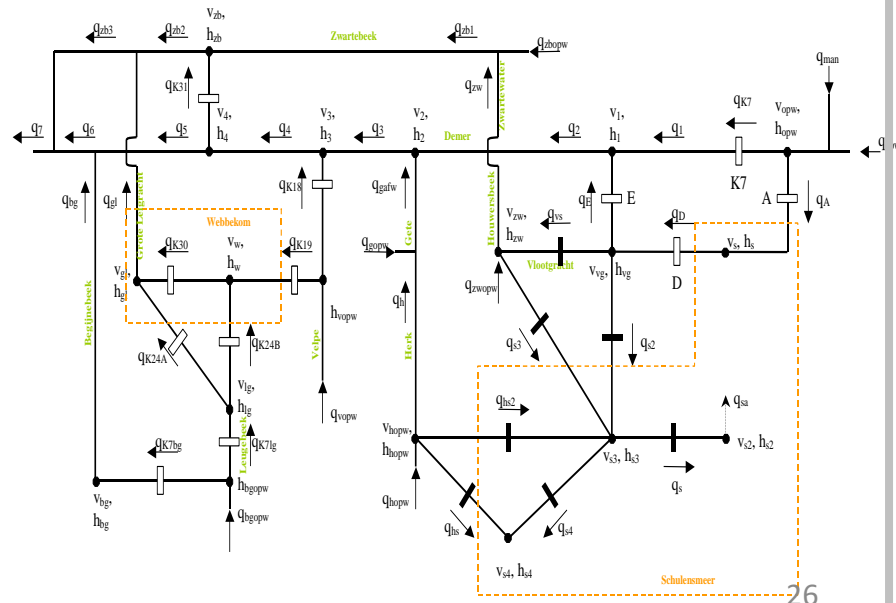
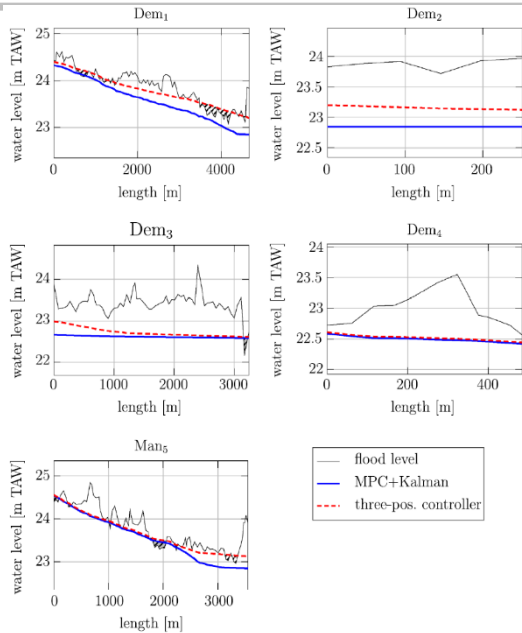
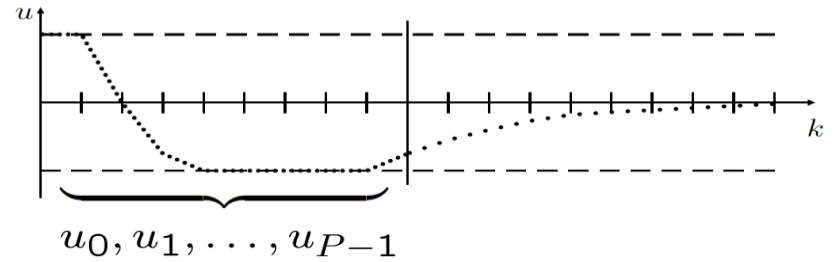
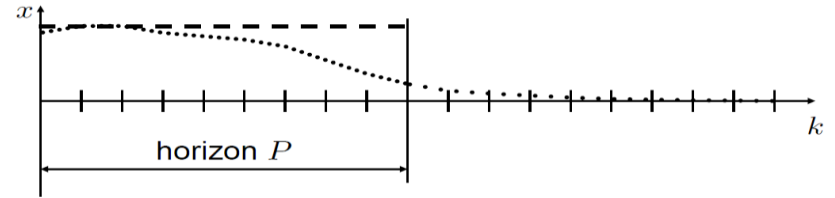
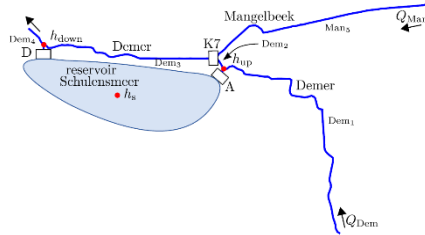
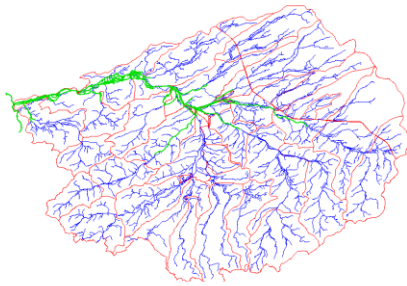
Average PM₁₀ concentration



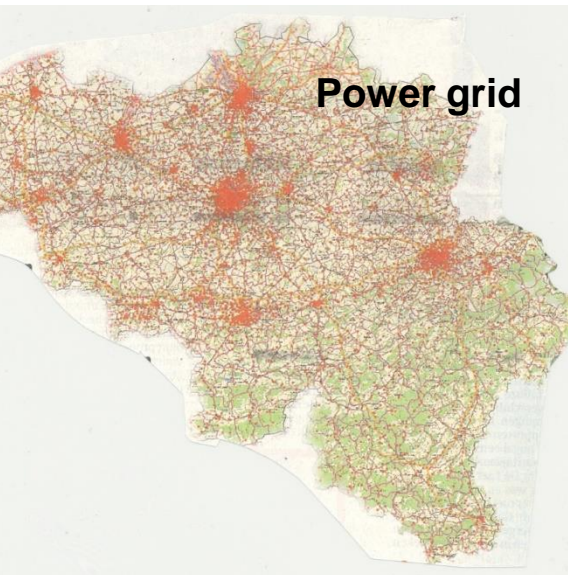
Average PM₁₀ concentration



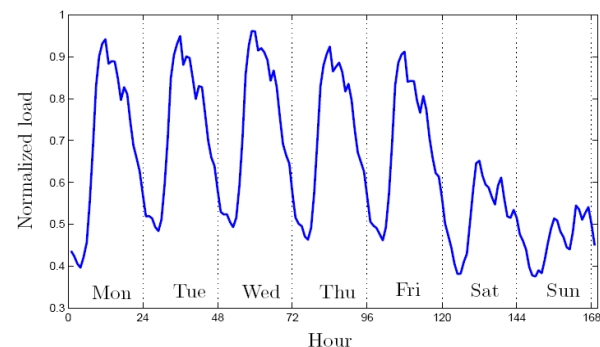
Demer Flood Regulation DSS



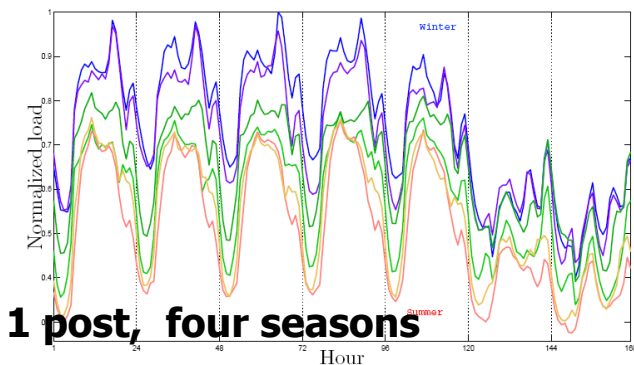
Belgian smart electricity grid DSS



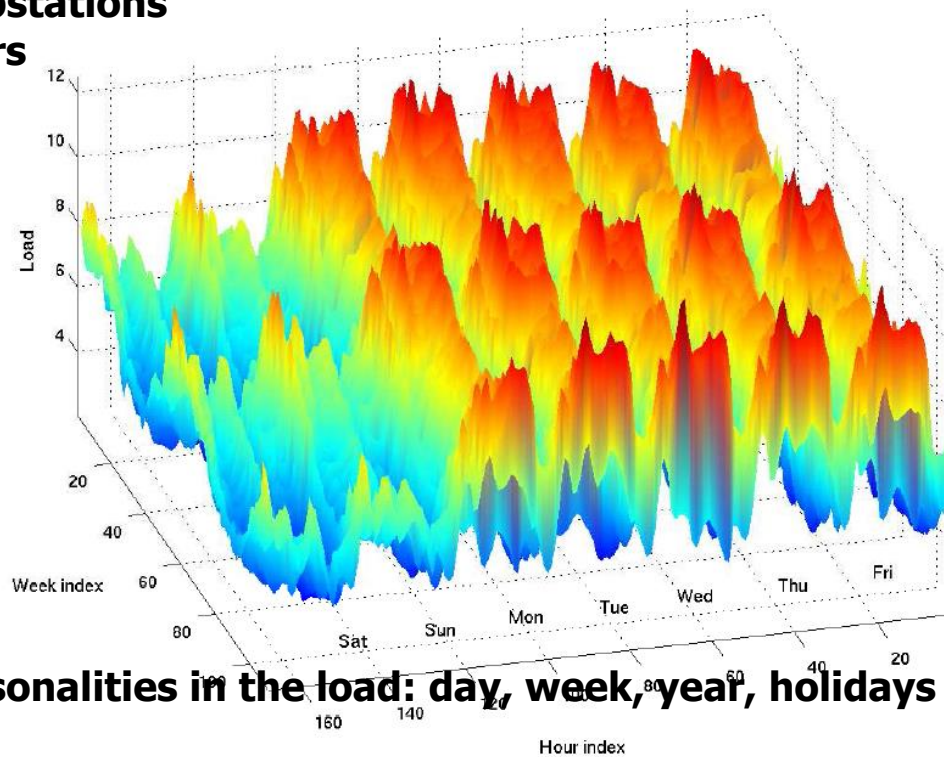
**250 transformer substations
Every 15 min, 5 years**



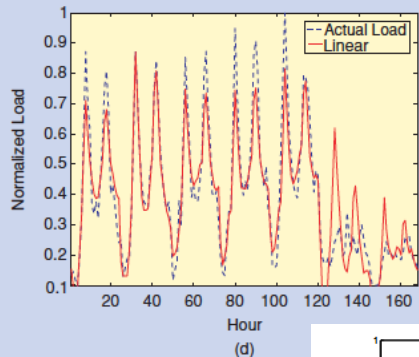
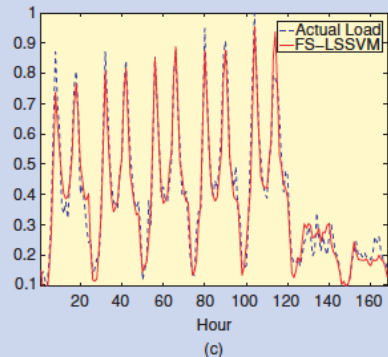
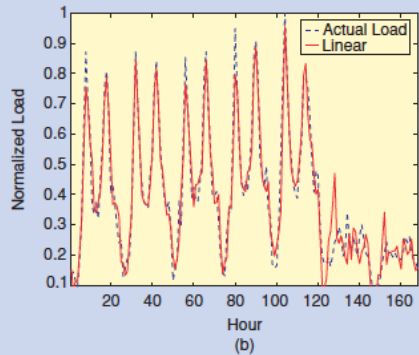
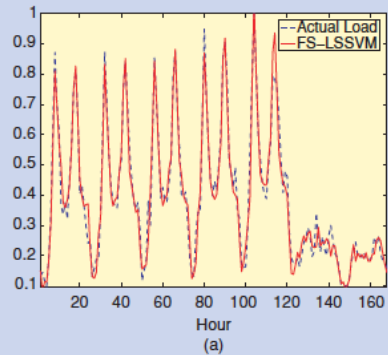
1 post, 1 week



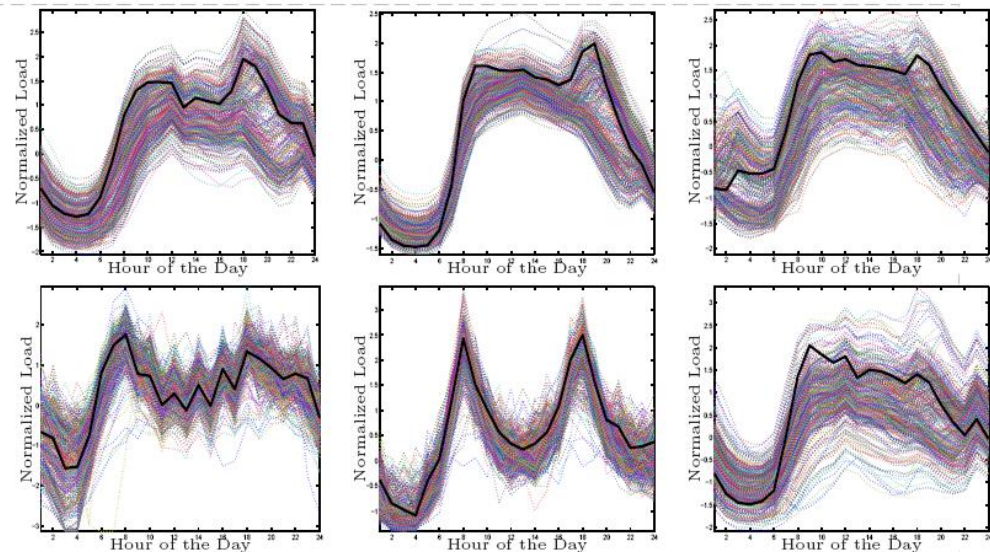
1 post, four seasons



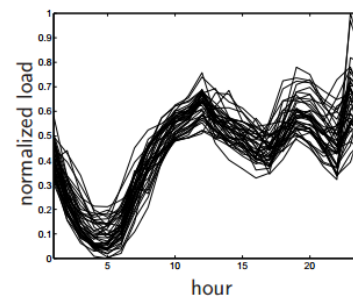
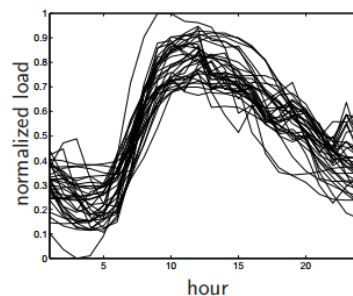
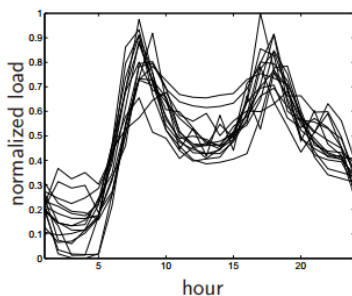
Seasonalities in the load: day, week, year, holidays



**1 month predictions
depending
on day, season
and weather prediction**



**6 posts, 1 year
Seasonalities, calendar holidays !**



**Customer profiling:
Residential, business, industrial**

Electricity load: 245 substations in Belgian grid (1/2 train, 1/2 validation)
 $x_i \in \mathbb{R}^{43.824}$: spectral clustering on **high dimensional data** (5 years)

3 of 7 detected clusters:

- 1: **Residential profile**: morning and evening peaks
- 2: **Business profile**: peaked around noon
- 3: **Industrial profile**: increasing morning, oscillating afternoon and evening

Security monitoring DSS

Background detection

Goals:

- traffic flow monitoring and control
- security CCTV
- face recognition
- recommendation systems
(Netflix problem)
- big data processing

Example:

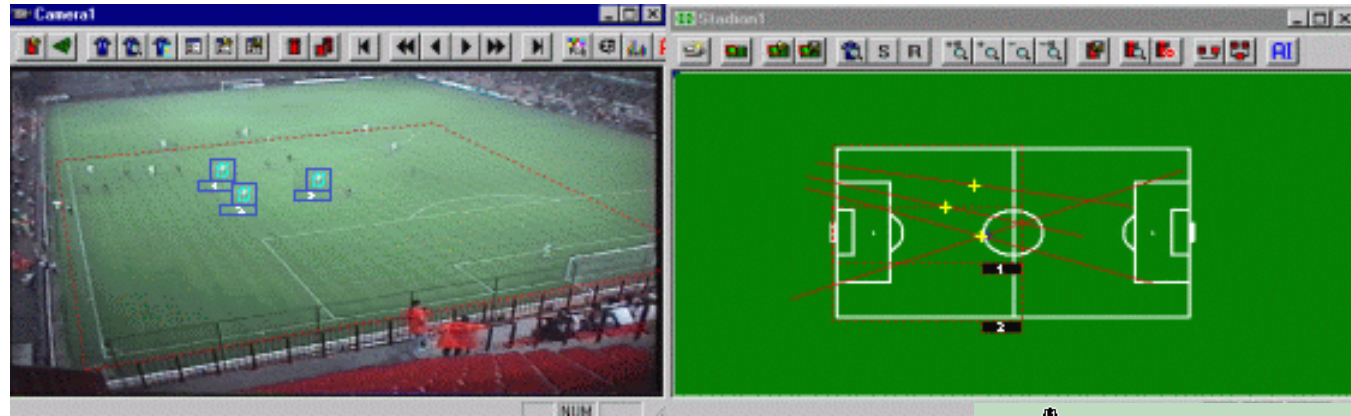
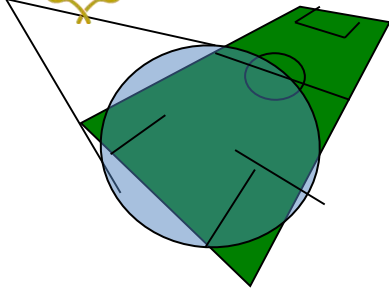
Separate background and foreground objects in a sequence of frames to count, identify, analyze objects on the scene.



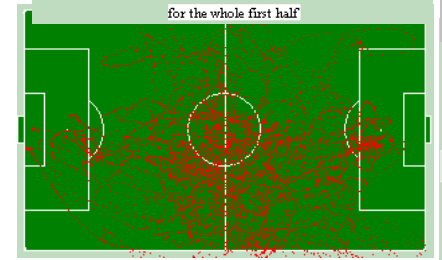
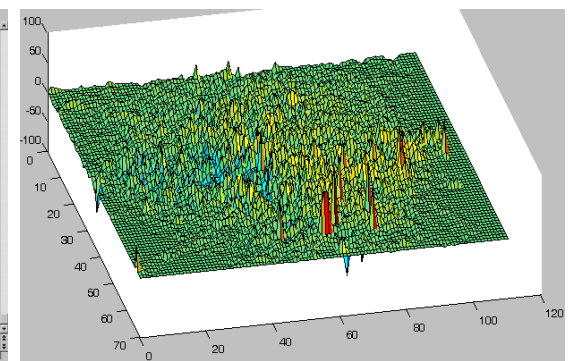
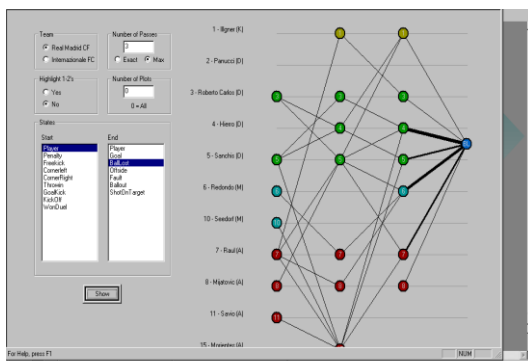
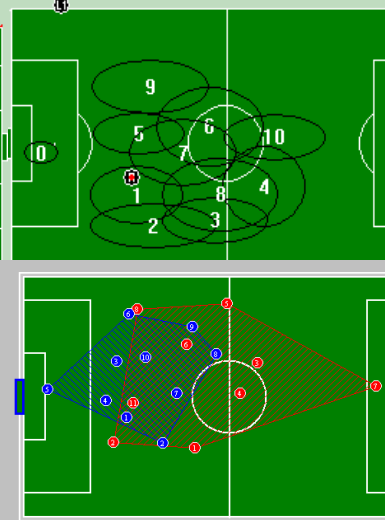
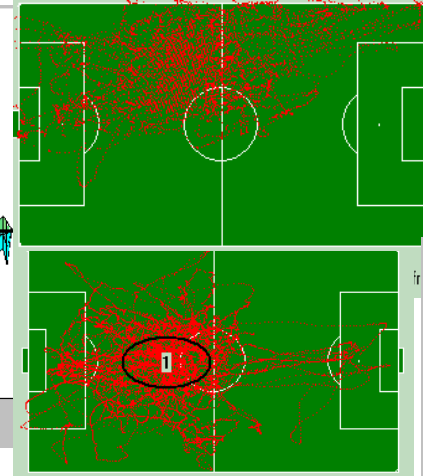
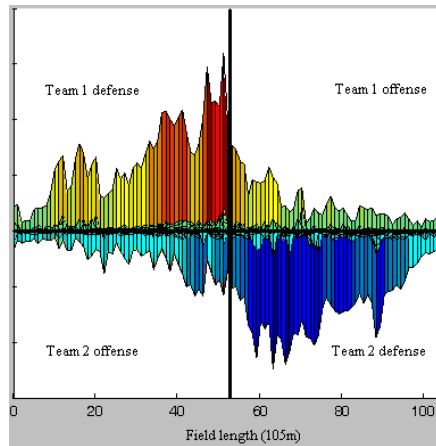
Challenges:

- handle **very large scale** problems
(e.g.: 10 sec, 25 FPS, small resolution (640x480): **150M variables**)
- minimize number of iterations, which are **extremely** costly

Sport Analytics Decision Support Systems



Time	Team	Action	Player	Position
0:00:00	1	Kick Off	9	(50,30)
0:00:01	1	Has Ball	10	(49,29)
0:00:04	1	Has Ball	8	(45,31)
...
0:12:25	1	Ball Out	6	(0,57)
0:12:46	2	Corner	3	(0,60)
0:12:47	2	Has Ball	4	(4,29)
0:12:49	2	Goal	4	(0,29)
0:13:38	1	Kick Off	10	(50,30)
...

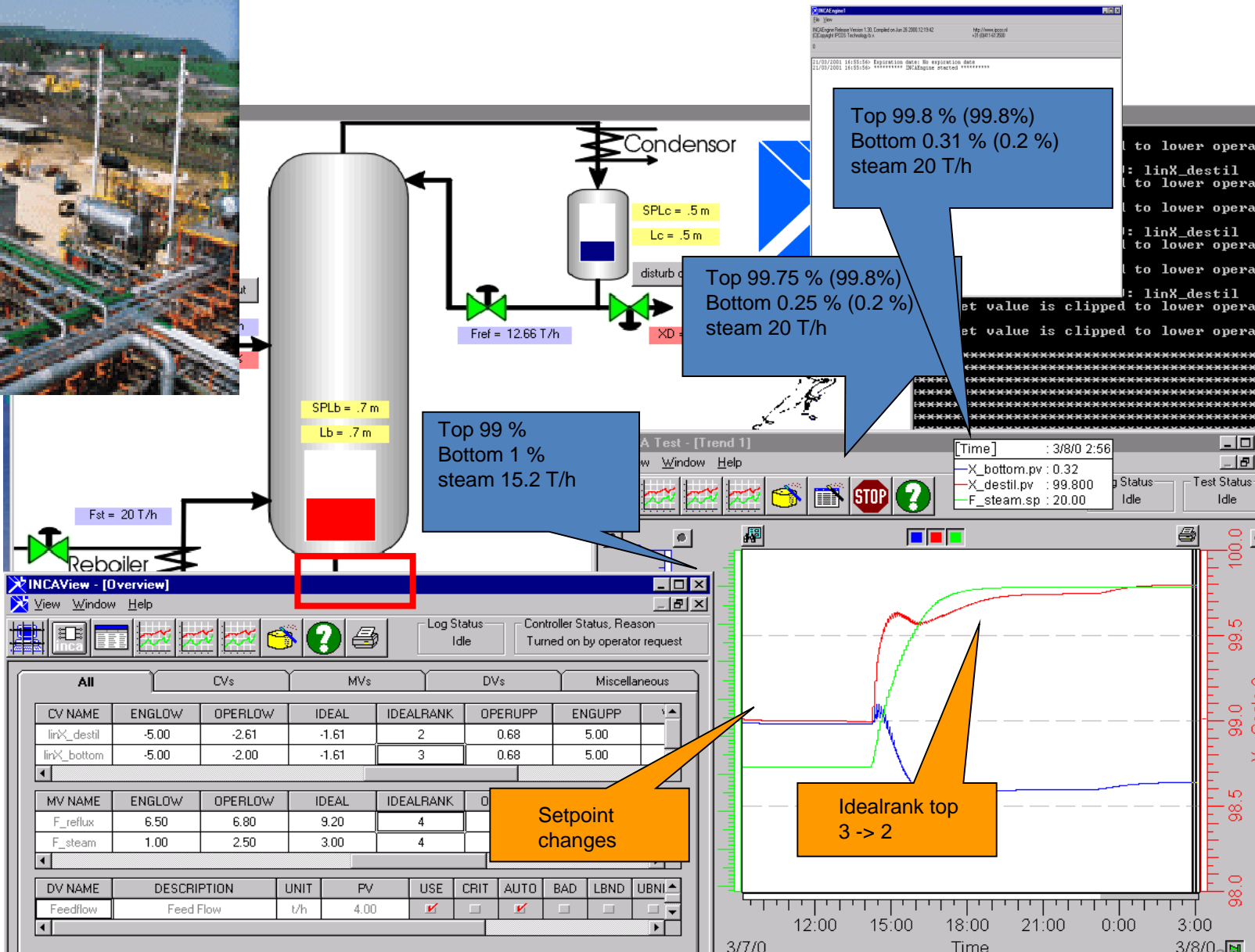


Contact

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 - Environmental DSS: O3 and small particles
 - Regional flood regulation DSS
 - Nationwide electrical load DSS
 - Security monitoring DSS
 - Sports DSS
- **Industry 4.0 DSS**
 - Chemical processes DSS
 - Mechanical structure monitoring DSS
 - Fraud detection DSS
- **Mobility**
 - Traffic DSS
- **Precision Medicine**
 - DSS for patients, professionals, policy makers
 - CDSS Ovarian Cancer, Biomarker detection
 - CDSS Monitoring Glycemia, vital signals (brain, epilepsy,...)
 - DSS Food
 - DSS Fall detection

Chemical process DSS



Chemical process DSS

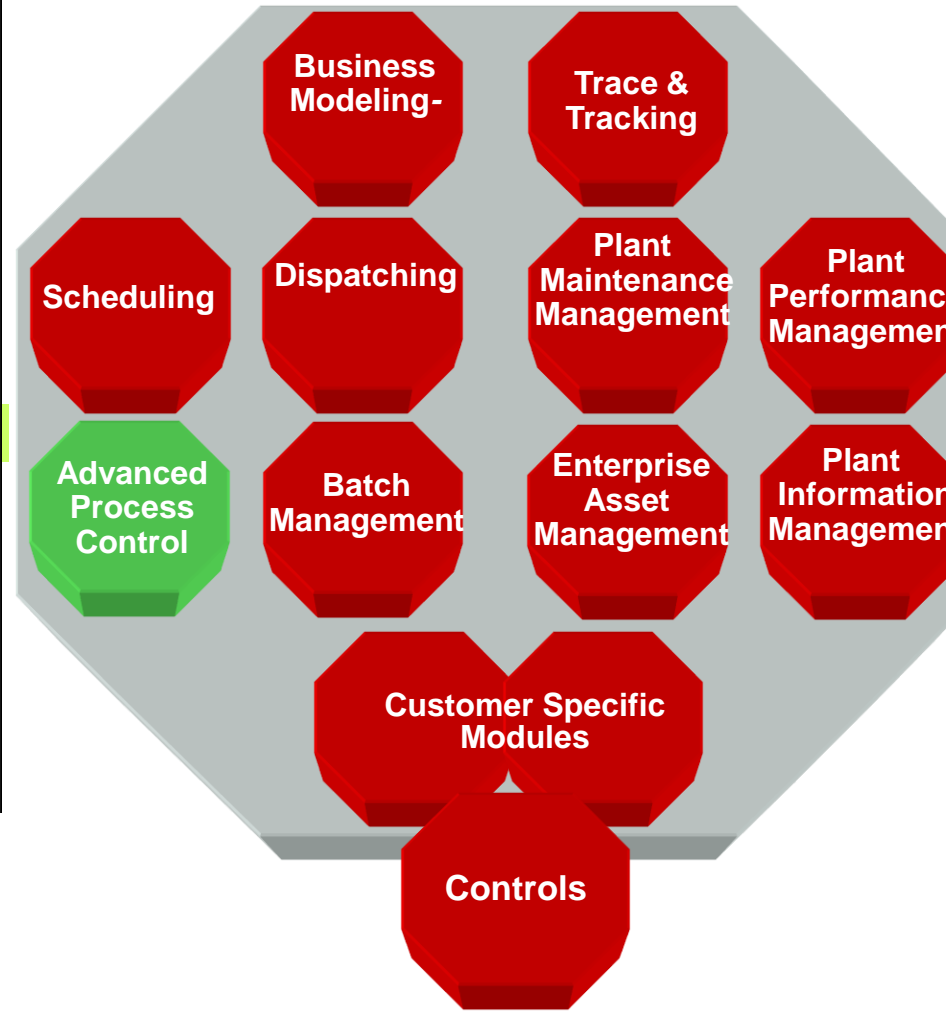
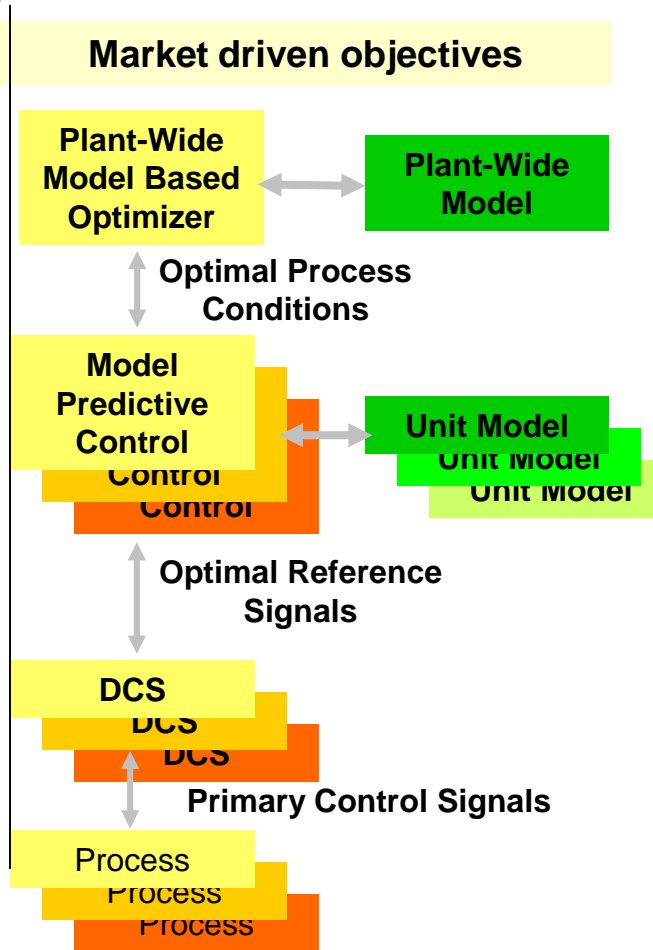
Economical

Benefits

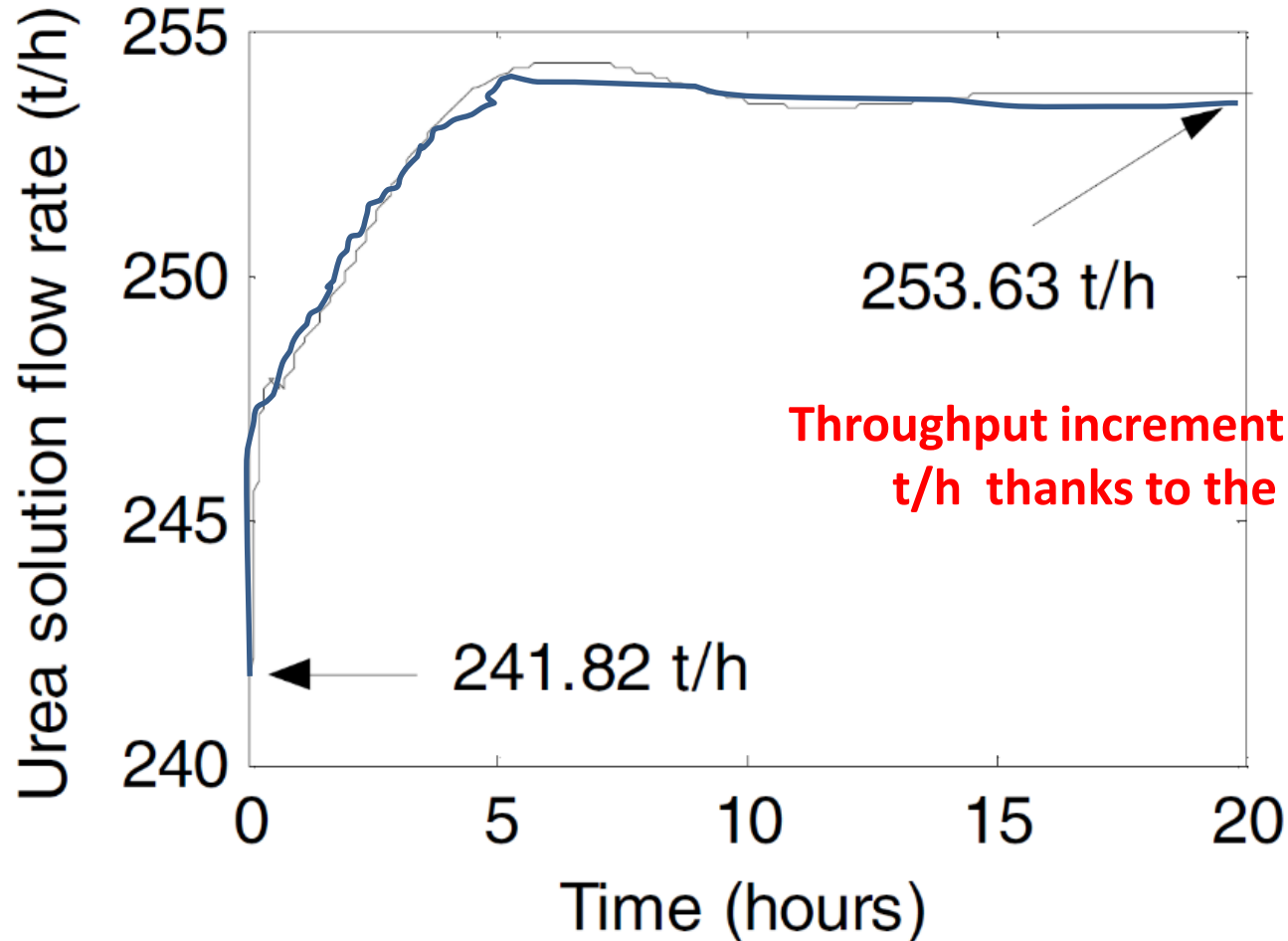
€€€€€€€€€€€€€€

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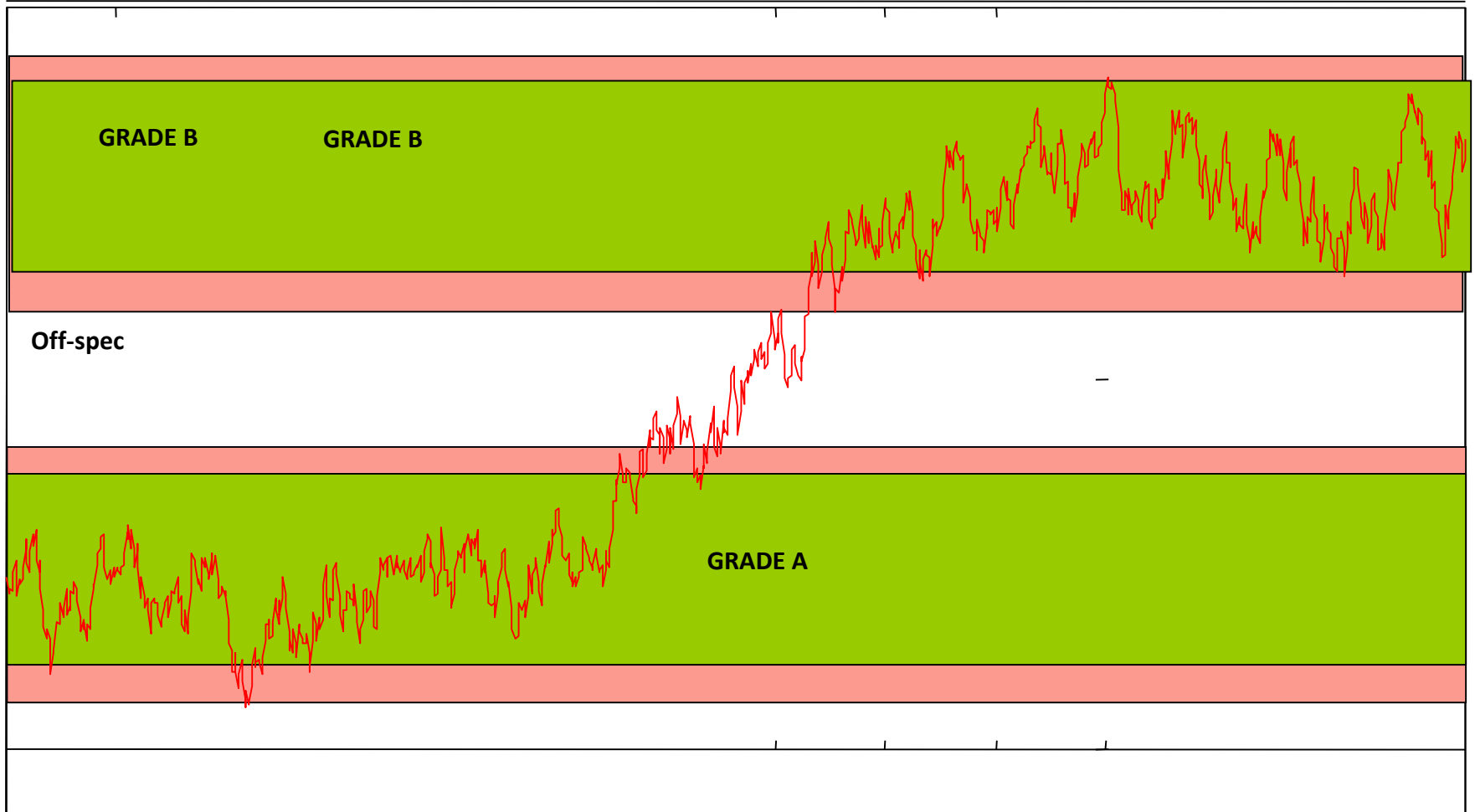
Yield optimization



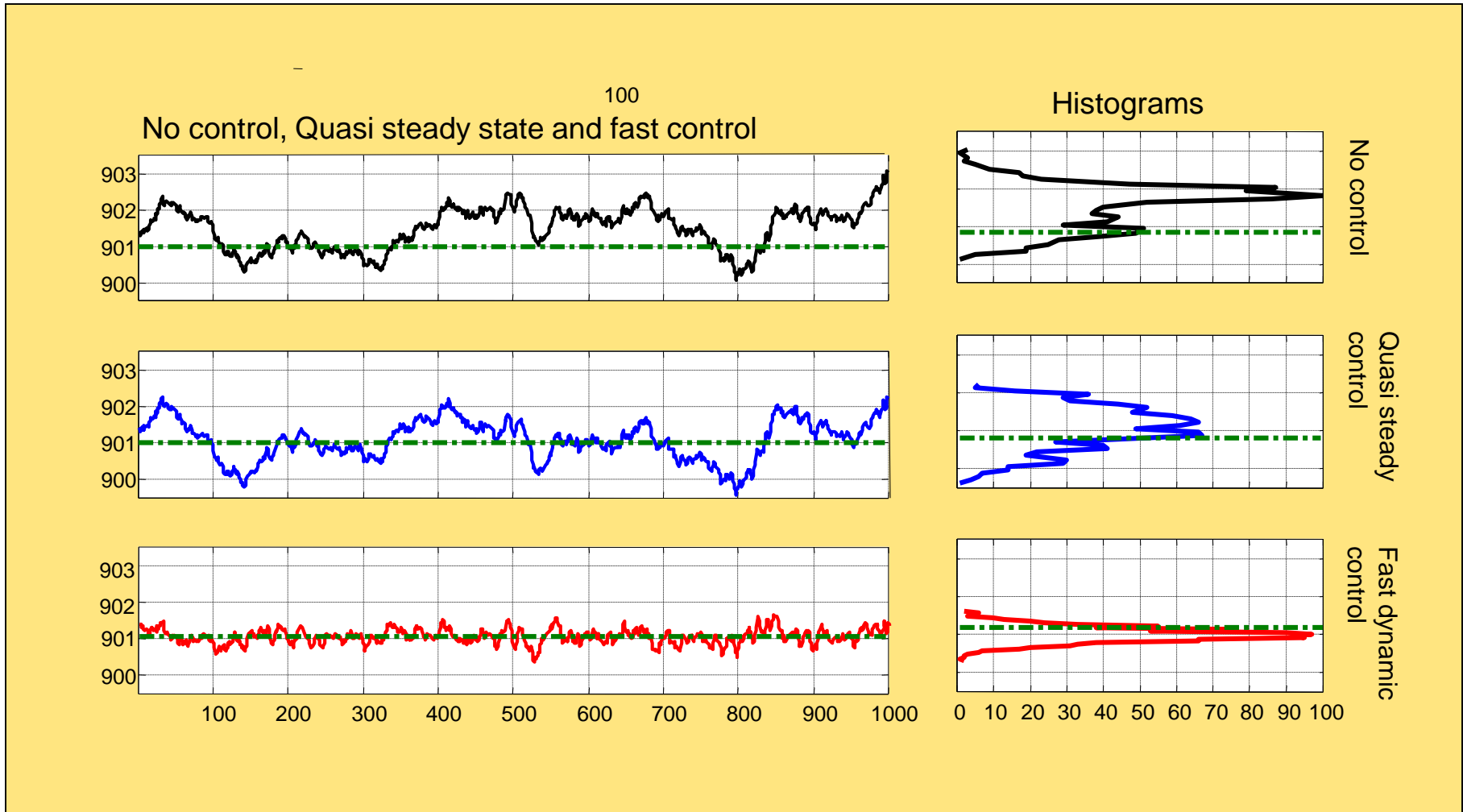
**Throughput increment of 11.81
t/h thanks to the DSS**

Grade transition with minimum off-spec

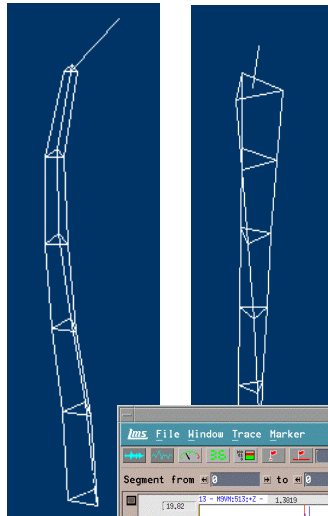
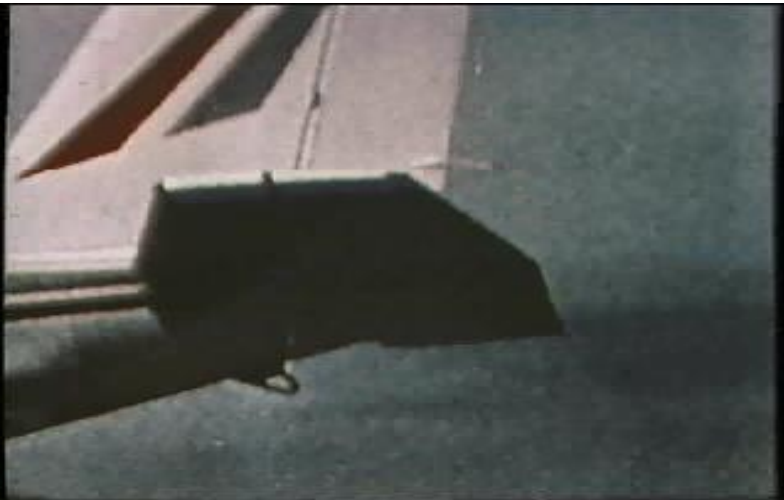
Optimized Grade Change Trajectory



Product quality optimization

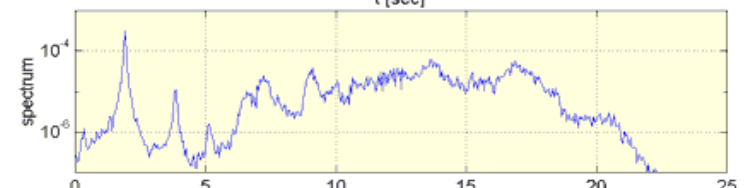
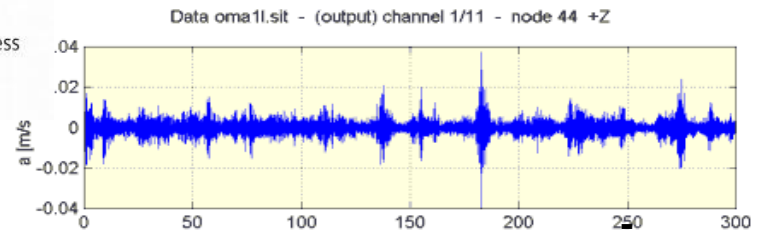
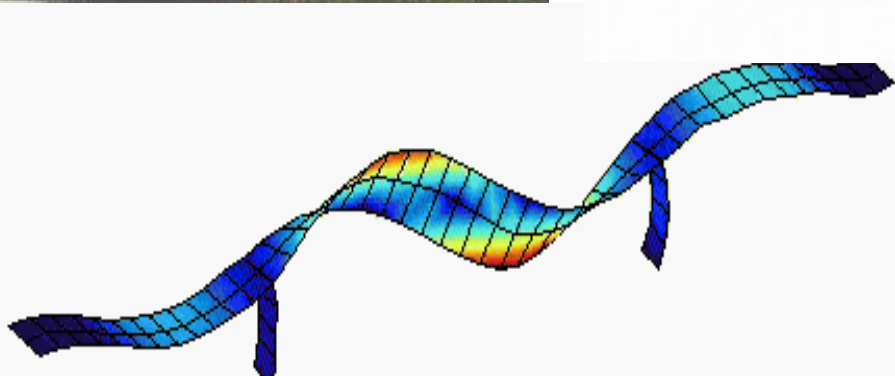
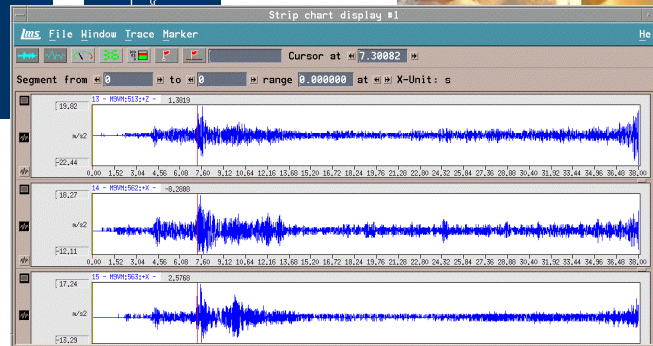


Mechanical structure monitoring DSS



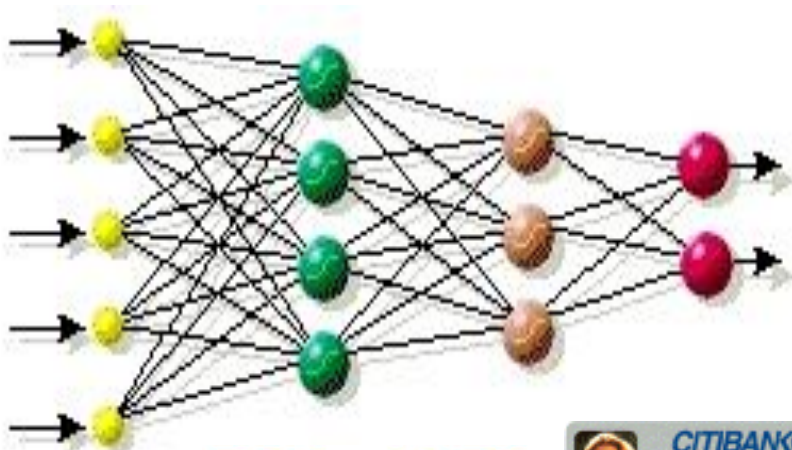
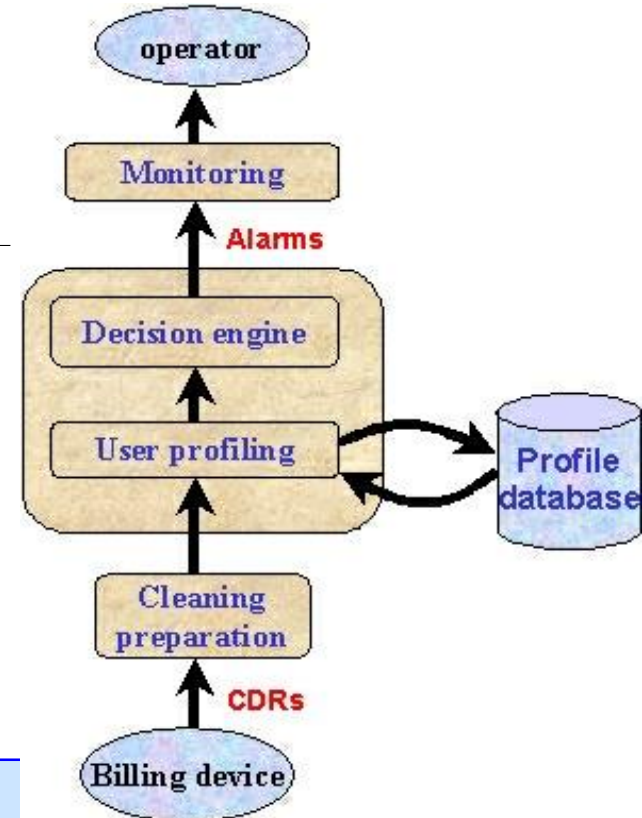
STADIUS
Center for Dynamical Systems,
Signal Processing and Data Analytics

LMS[®]
A Siemens Business



Fraud Detection DSS (phones, credit cards, tax declaration,...)

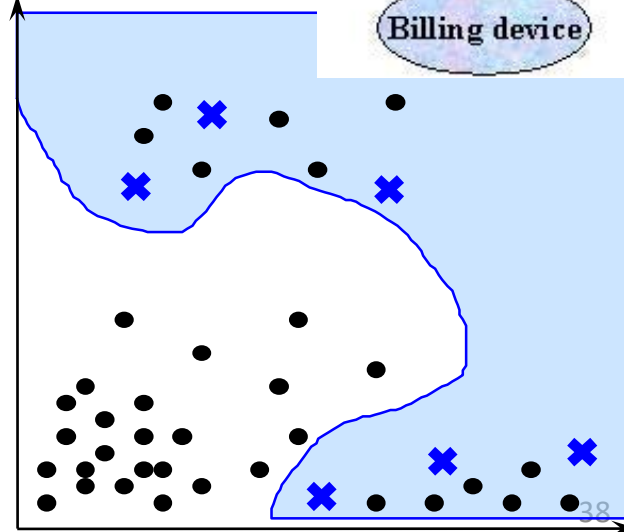
	Short Duration	Long Duration	High Frequency	International	Same Destination	Off Peak	Call Forwarding	Behaviour Change
Direct call selling		X	X	X			X	
PABX fraud	X		X		X	X		X
Freephone fraud	X		X		X			X
Premium rate fraud		X	X		X			X
Subscription fraud			X					X
Handset theft		X	X	X	X			X



TAXonWEB



Average call duration



Call frequency

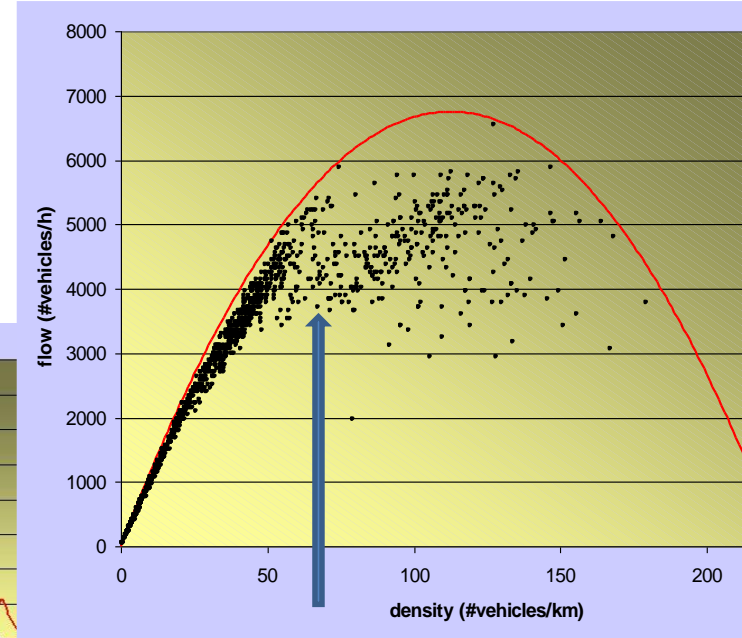
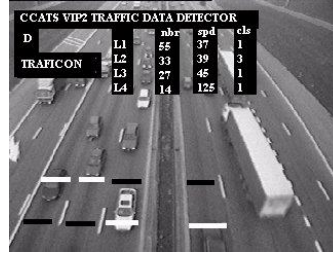
AI enabled Decision Support Systems

- **Smart Cities DSS**
 - Environmental DSS: O3 and small particles
 - Regional flood regulation DSS
 - Nationwide electrical load DSS
 - Security monitoring DSS
 - Sports DSS
- **Industry 4.0 DSS**
 - Chemical processes DSS
 - Mechanical structure monitoring DSS
 - Fraud detection DSS
- **Mobility**
 - Traffic DSS
- **Precision Medicine**
 - DSS for patients, professionals, policy makers
 - CDSS Ovarian Cancer, Biomarker detection
 - CDSS Monitoring Glycemia, vital signals (brain, epilepsy,...)
 - DSS Food
 - DSS Fall detection

Traffic & Mobility DSS

Detector technology: inductive loops, Gatso-meters, camera's

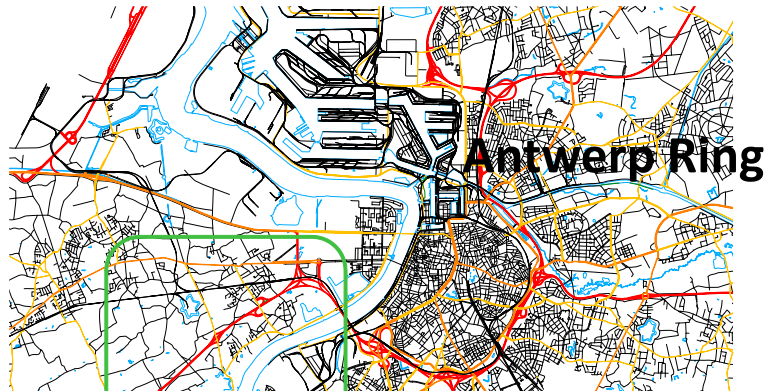
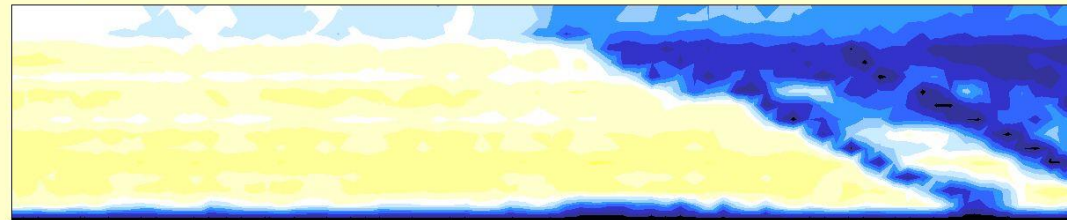
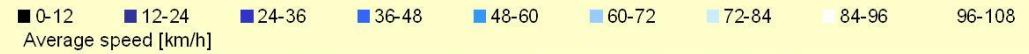
Density – Flow



Density per hour / day of the week



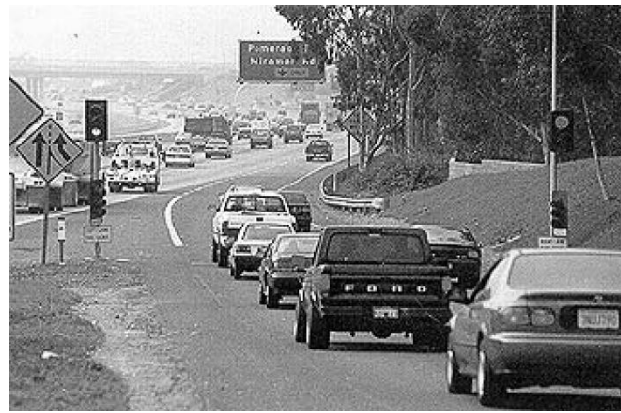
Traffic jam prediction



Traffic & Mobility DSS: control



Speed harmonisation



Ramp metering



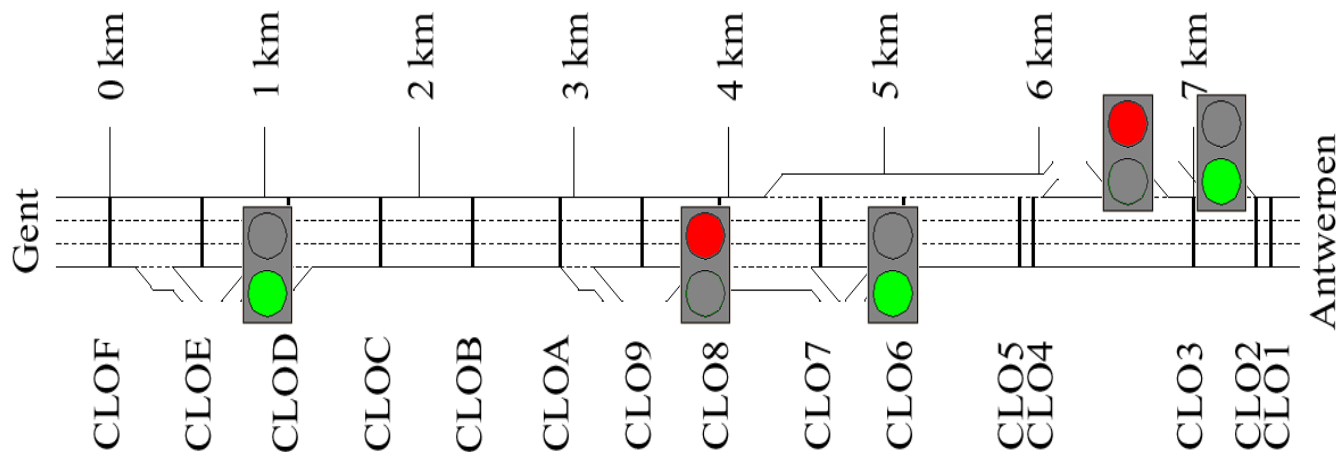
DRIP



Vlaams Verkeerscentrum



Vlaamse overheid



STADIUS
Center for Dynamical Systems,
Signal Processing and Data Analytics

M TRANSPORT & MOBILITY LEUVEN

AI enabled Decision Support Systems

- **Smart Cities DSS**
 - Environmental DSS: O3 and small particles
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 - DSS Food
 - DSS Fall detection

WHO IS IN DEMAND?

PATIENTS



POLICY MAKERS



PROFESSIONALS



IF WE CARE ABOUT THE FUTURE OF CARE...

PATIENT HEALTH RECORD

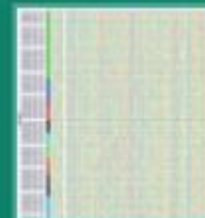
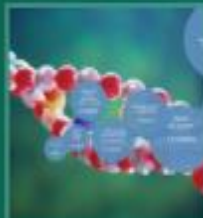
HEALTH DATA ANALYTICS

TELEMEDICINE & -MONITORING

WEARABLES & MHEALTH

...OMICS (genomic, proteomics, metabolomics, interactomics,...)

DECISION SUPPORT SYSTEMS



... AI WILL BE KEY

4 P's OF MEDICINE




Personalized

Customized diagnosis and treatment



Preventive

Better than curation



Predictive

Determine risk profiles & predict outcome



Participative

Involve the patient

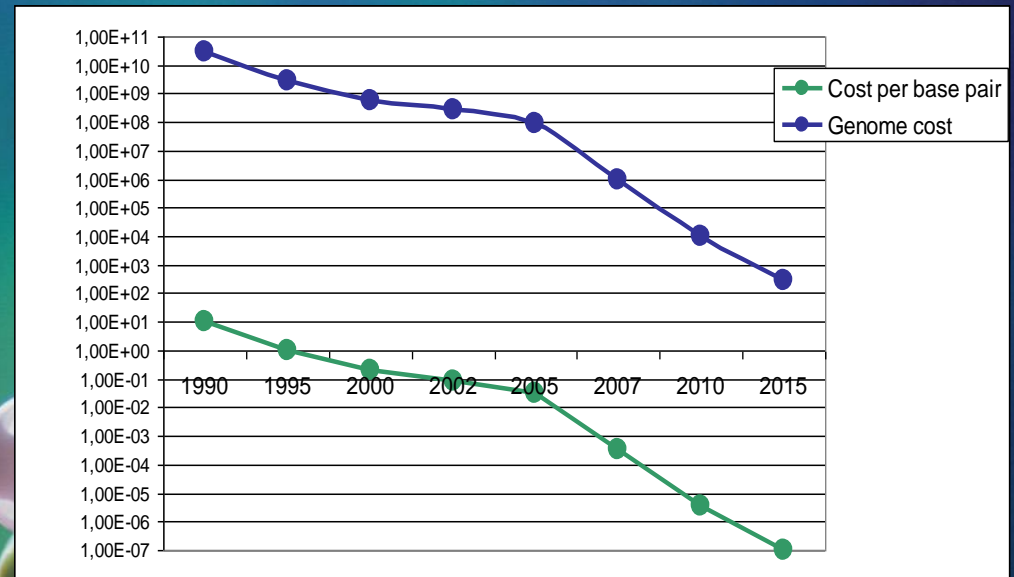
Genome data

- **Human genome project**
 - Initial draft: June 2000
 - Final draft: April 2003
 - 13 year project
 - \$300 million value with 2002 technology

- **Personal genome**
 - June 1, 2007
 - Genome of James Watson, co-discoverer of DNA double helix, is sequenced

- \$1.000.000
- Two months

- **€1000-genome**
 - Expected 2012-2020



Year	Cost per base pair	Genome cost
1990	10	3E+10
1995	1	3.000.000.000
2000	0.2	600.000.000
2002	0.09	270.000.000
2005	0.03	90.000.000
2007	0.000333333	1.000.000
2010	3.33333E-06	10000
2015	0.0000001	300

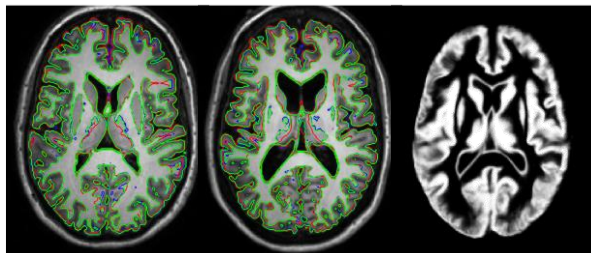
Data tsunami



Computer Tomography



Magnetic resonance

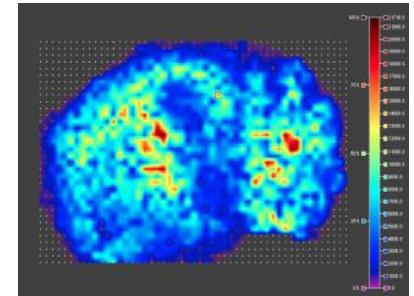
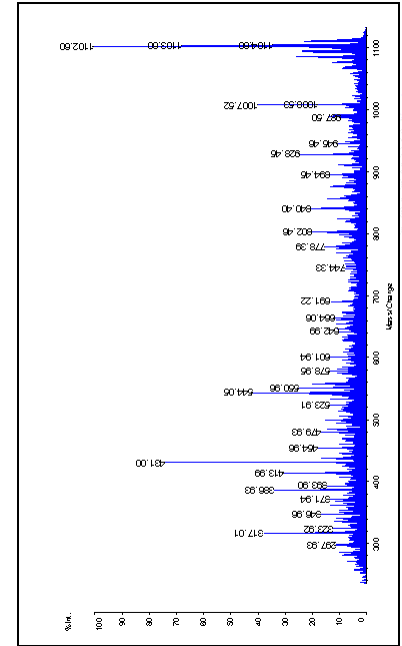


GS-FLX Roche
Applied Science 454

Sequencers

```

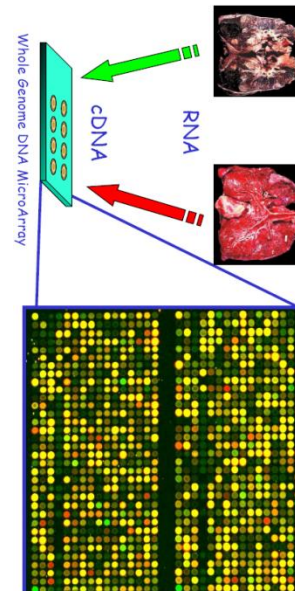
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GTTTTCTTTCTAGGTTGAT
TGACTCATACATGTGTTTCAT
TGAGGAAGGAACCTAACAAAA
CTGCACTTTTTCAACGTCAC
AGCTACTTTAAAAGTGATCAA
AGTATATCAAGAAAGCTTAAT
ATAAAGACATTTGTTTCAAGG
TTTCGTAAGTGCAAAATATCA
AGAAGACAAAAATGACTAATT
TTGTTTTTCAGGAAGCATATAT
ATTACACGAACACAAATCTAT
TTTTGTAATCAACACCGACCA
TGTTTCGATTACACACATTAA
ATCTTATATGCTAAAAGTAGG
TCTCGTTTTAGGGATGTTTAT
AACCATCTTTGAGATTATTGA
TGCATGGTTATTGGTTAGAAA
AAATATACGCTTGTTTTTCTT
TCCTAGGTTGATTGA
    
```



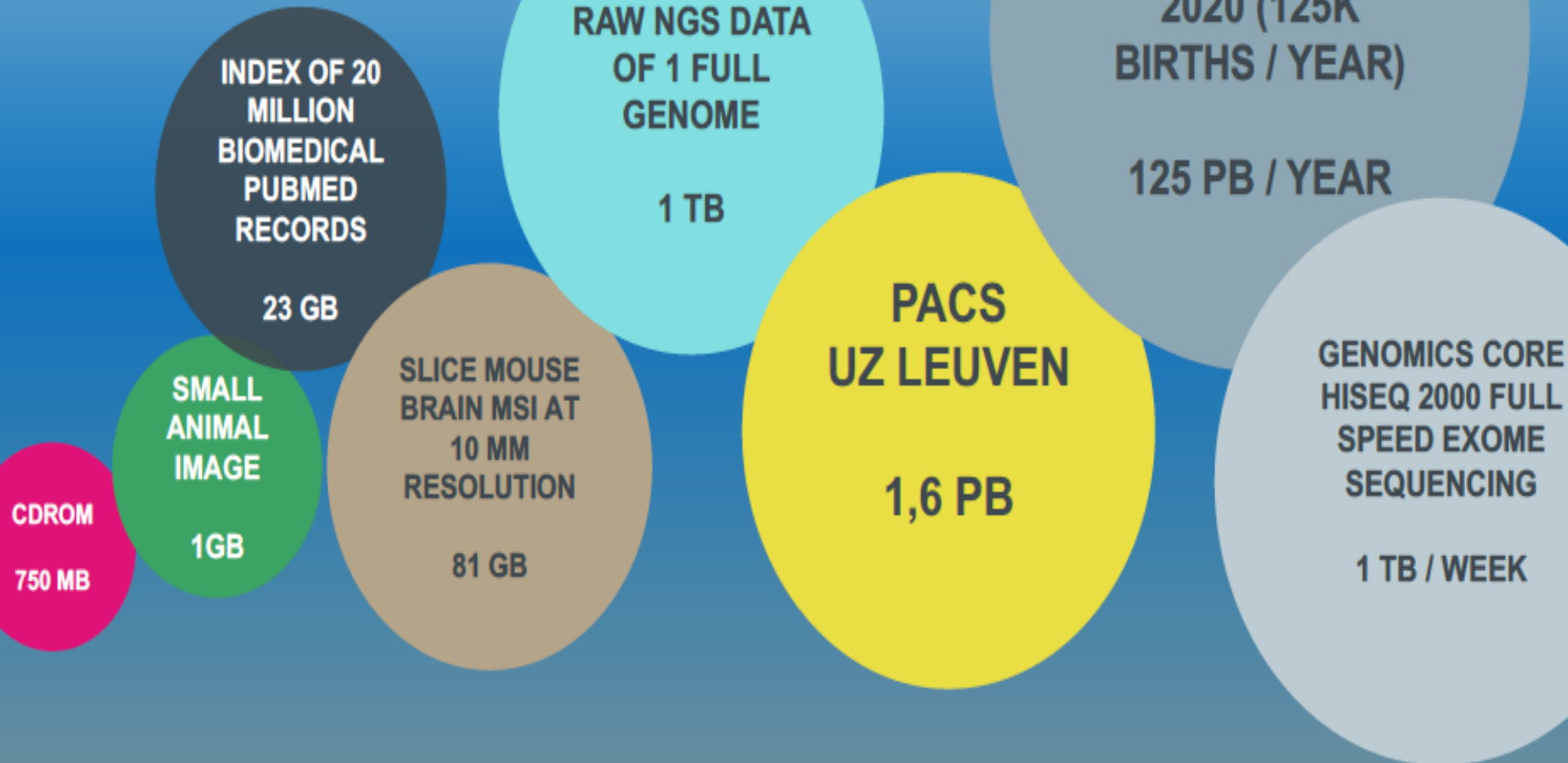
Mass spectrometry



Microarrays
(DNA chips)



TSUNAMI OF MEDICAL DATA



CDROM

750 MB

SMALL ANIMAL IMAGE

1GB

INDEX OF 20 MILLION BIOMEDICAL PUBMED RECORDS

23 GB

SLICE MOUSE BRAIN MSI AT 10 MM RESOLUTION

81 GB

RAW NGS DATA OF 1 FULL GENOME

1 TB

PACS UZ LEUVEN

1,6 PB

SEQUENCING ALL NEWBORNS BY 2020 (125K BIRTHS / YEAR)

125 PB / YEAR

GENOMICS CORE HISEQ 2000 FULL SPEED EXOME SEQUENCING

1 TB / WEEK

Dr. Algorithm is coming

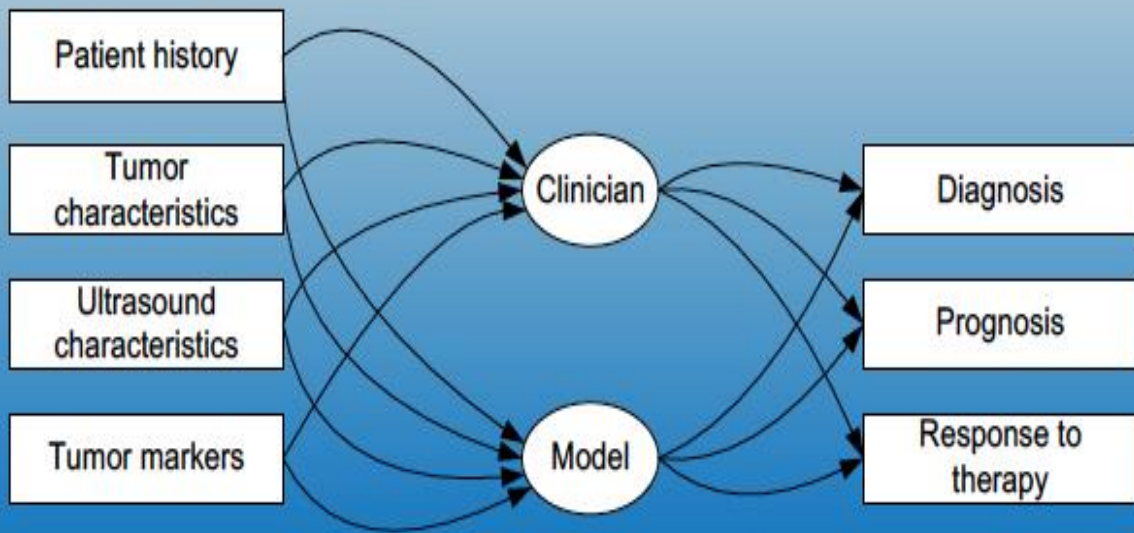


"In the next 10 years, data science and software will do more for medicine than all the biological sciences together."

– Vinod Khosla, Khosla Ventures

<http://techcrunch.com/2013/09/11/vinod-khosla-in-the-next-10-years-data-science-will-do-more-for-medicine-than-all-biological-sciences-combined/>

Example: CDSS Ovarian Cancer



standardize ultrasonographic ovarian tumor analysis → models giving an indication of the probability of malignancy of an ovarian tumour based on 6 to 12 observed parameters



IOTA app to assess ovarian tumour malignancy: population based / standardized



General challenges & opportunities

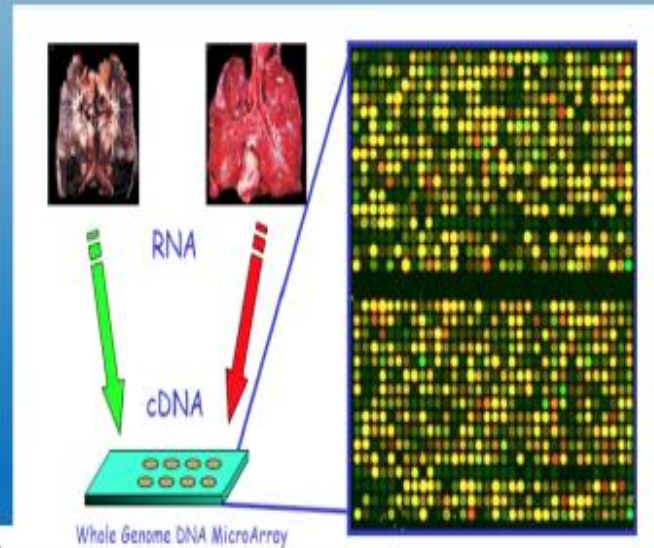
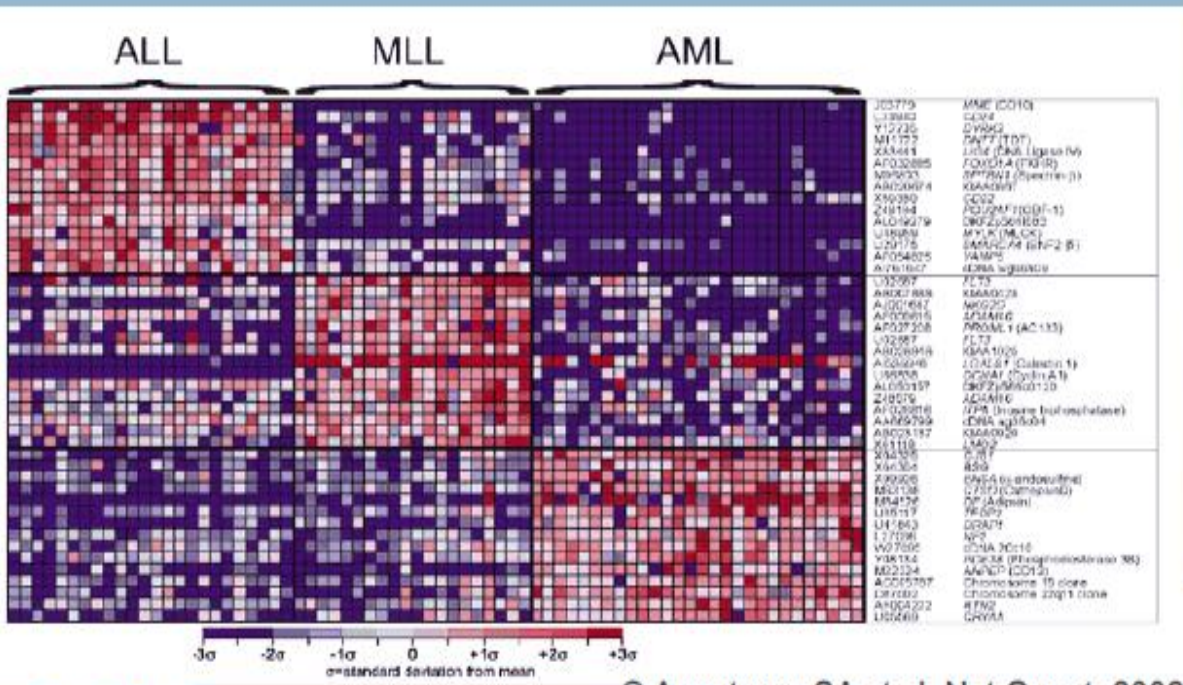
- Integration of various heterogeneous data sources
- Connect with Electronic Medical Records
- Need for population data



IOTA app available in iTunes app store and on

<http://homes.esat.kuleuven.be/~sistawww/biomed/iota/>

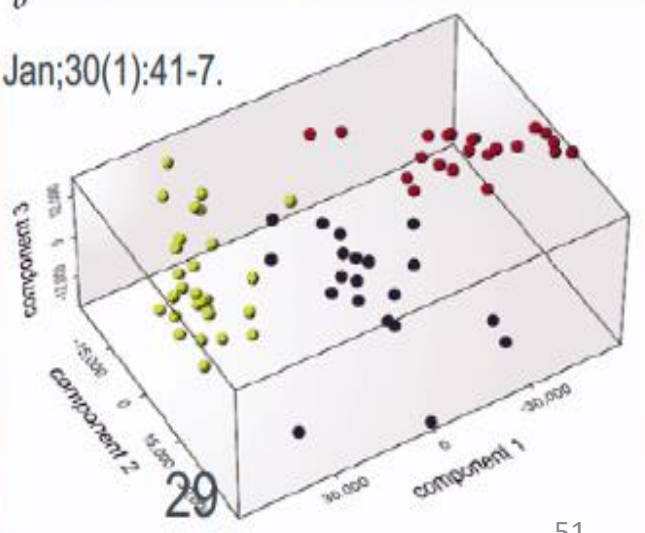
Example: Genomic markers for Leukemia



© Armstrong SA et al. Nat Genet. 2002 Jan;30(1):41-7.

12 600 genes
72 patients

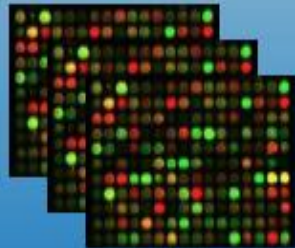
- 28 Acute Lymphoblastic Leukemia (ALL)
- 24 Acute Myeloid Leukemia (AML)
- 20 Mixed Linkage Leukemia (MLL)



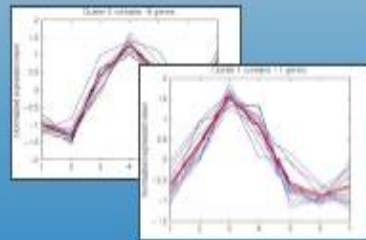
Example: Genomic Data Fusion

Candidate genes

High-throughput genomics



Data analysis



Information sources



Candidate prioritization

Rank	En	Ex	Ip	Ke	GO	TeAvg	Pval
1	TTR	PAH	PAH	PAH	PAH	PAH	PAH
2	PAH	TTR	PAH	PAH	PAH	PAH	PAH
3	PAH	PAH	TTR	PAH	PAH	PAH	PAH
4	PAH	PAH	PAH	TTR	PAH	PAH	PAH
5	PAH	PAH	PAH	PAH	TTR	PAH	PAH
6	PAH	PAH	PAH	PAH	PAH	TTR	PAH
7	PAH	PAH	PAH	PAH	PAH	PAH	TTR
8	PAH	PAH	PAH	PAH	PAH	PAH	PAH
9	PAH	PAH	PAH	PAH	PAH	PAH	PAH
10	PAH	PAH	PAH	PAH	PAH	PAH	PAH

Validation



Endeavour: Aerts et al., Nature Biotechnology, 2006

Name	Ensembl
TTR	ENS00000118271
PAH	ENS00000171759
G6PC	ENS00000131482
IGF1	ENS0000017427
ALB	ENS00000163631
CRP	ENS00000132693
HASP2	ENS00000148702
IF	ENS00000138799
FST	ENS00000134363
ARAF1	ENS00000178061
HMG2	ENS00000149848
C9	ENS00000113600
PCBP3	ENS00000111405
HCOB6	ENS00000108511
RERE	ENS00000142599
HCOA11	ENS00000005073
CLIC1	ENS00000096239
ERC3	ENS00000163161
ERC2	ENS00000162161
TLL2	ENS00000095687
SYT4	ENS00000132672
SYT4	ENS00000132672
PK4CB	ENS00000142292
PKD2	ENS00000118762
	ENS00000001026
ANKRD3	ENS00000183421
P13A1	ENS00000124491
BPAO1	ENS00000161614
KCNH3	ENS00000143603
GRIN2A	ENS00000160086
GRIN2B	ENS00000112246
SIM1	ENS00000174691
	ENS00000083195
C14orf10	ENS00000092020
STX5	ENS00000170310
	ENS00000107671
MSH5	ENS00000098474
CRH	ENS00000147671
MID1	ENS00000101871
	ENS00000184508
	ENS00000113460
TGFB3	ENS00000119699
C12orf1	ENS00000125810
NR4A2	ENS00000163234
PDGFC	ENS00000145431
PDGFC	ENS00000145431
NR3C2	ENS00000151623
NFYA	ENS00000001167
	ENS00000101898
C8orf4	ENS00000176907
TM4SF13	ENS00000106537
MMP3	ENS00000149669
	ENS00000107410

Example: Glycemia control in ICU

- 10 mio adult ICU patients / year (EU + US) (1-2 b\$ market)
- 'Tight Glycemic Control (TGC) in intensive care unit lowers mortality'
 - implement through LOGIC-Insulin: semi-automatic control system that advises nurse on insulin dosage and blood sampling interval aiming at TGC and avoiding hypoglycemia
- LOGIC-I randomized clinical trial (single-centre): compared with expert nurses, LOGIC-Insulin showed improved efficacy of TGC without increasing rate of hypoglycemia
- LOGIC-II randomized clinical trial (multi-centre): Start February 2014



in collaboration
with ICU UZ
Leuven

Menu

- From science to technology
- The fourth paradigm
- AI waves
- Use Cases
- Government action programs

Muyters initiatief AI/CS/PM

- 60 mio €, 2019-2020-.....
 - AI (30 mio €)
 - CS (20 mio €)
 - PM (10 mio €)
- AI (30 mio €)
 - Luik I: Flankerend Beleid (5 mio €)
 - Kennis-/adviescentrum Ethiek en Maatschappelijke Impact
 - Opleidingen
 - Regulier kanaal (BaMa's)
 - Additionele opleidingskader
 - Luik II: Implementatie naar industrie (13 mio €)
 - AI one stop shop
 - VLAIO instrumentarium
 - Luik III: Strategisch Basisonderzoek (12 mio €)
 - 2 a 4 programmaliijnen

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