

# **Artificial-intelligence-augmented clinical medicine**

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4th International Symposium on Health Informatics and Bioinformatics, Ankara,  
Turkey, 17 April 2009

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## Artificial intelligence (1)

- *Definition 1:* AI is a field of science and engineering concerned with the computational understanding of what is commonly called intelligent behavior, and with the creation of artifacts that exhibit such behavior.

from: Shapiro, S.C. (1992) Artificial Intelligence. In Shapiro, S.C. (ed.) *Encyclopedia of Artificial Intelligence*, 2nd ed., vol. 1, Wiley, New York, 54–57.

- *Definition 2:* AI is the science of artificial simulation of human thought processes with computers.

from: Feigenbaum, E.A. & Feldman, J. (eds.) (1995) *Computers & Thought*. AAAI Press, Menlo Park, back cover.

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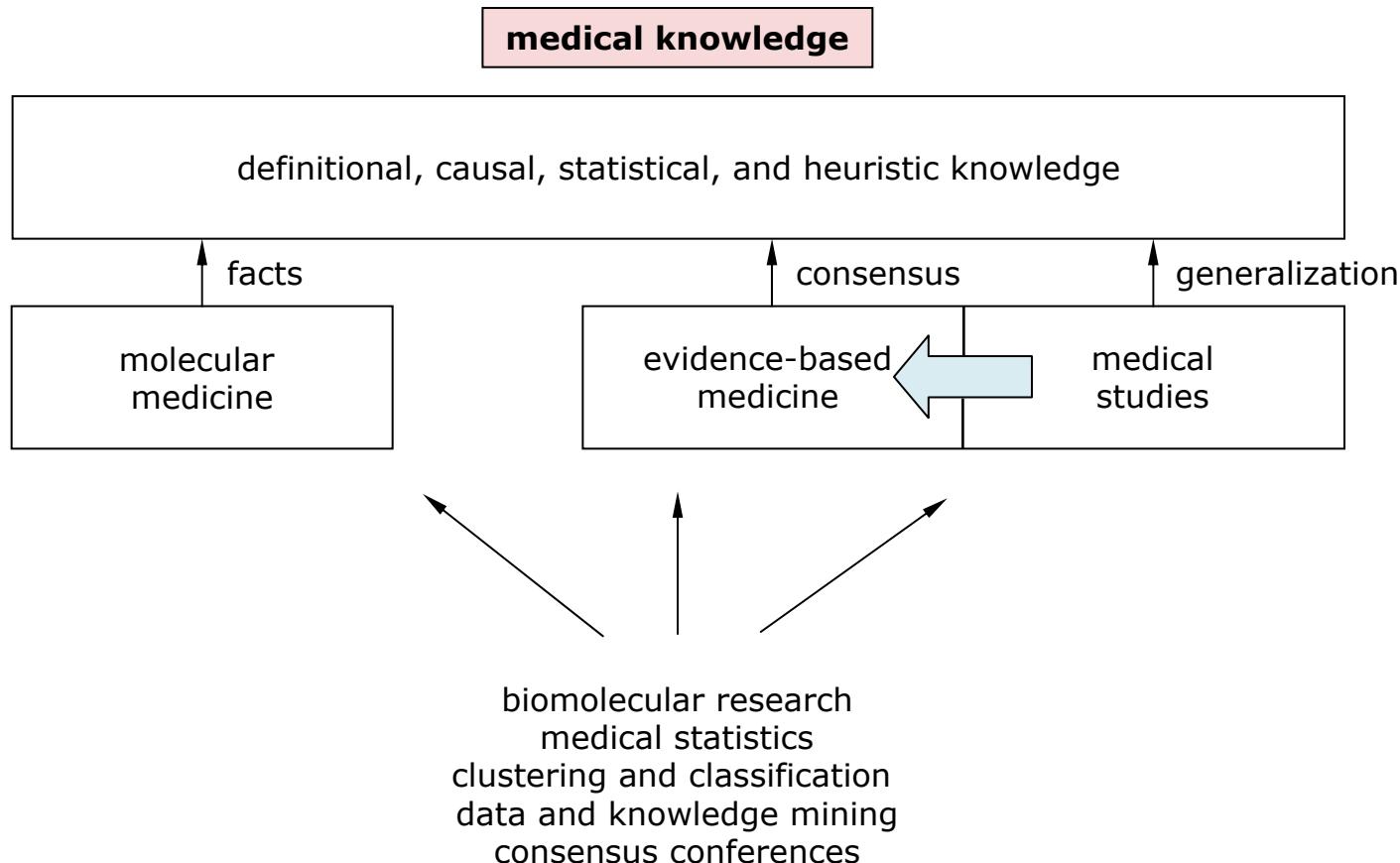
## Artificial intelligence—applicable to clinical medicine

- It is the **decomposition** of an **entire clinical thought process** and its separate artificial simulation—also of simple instances of “clinical thought”—that make the task of **AI in clinical medicine** manageable.
- A functionally-driven science of AI that **extends clinicians through computer systems** step by step can immediately be established.

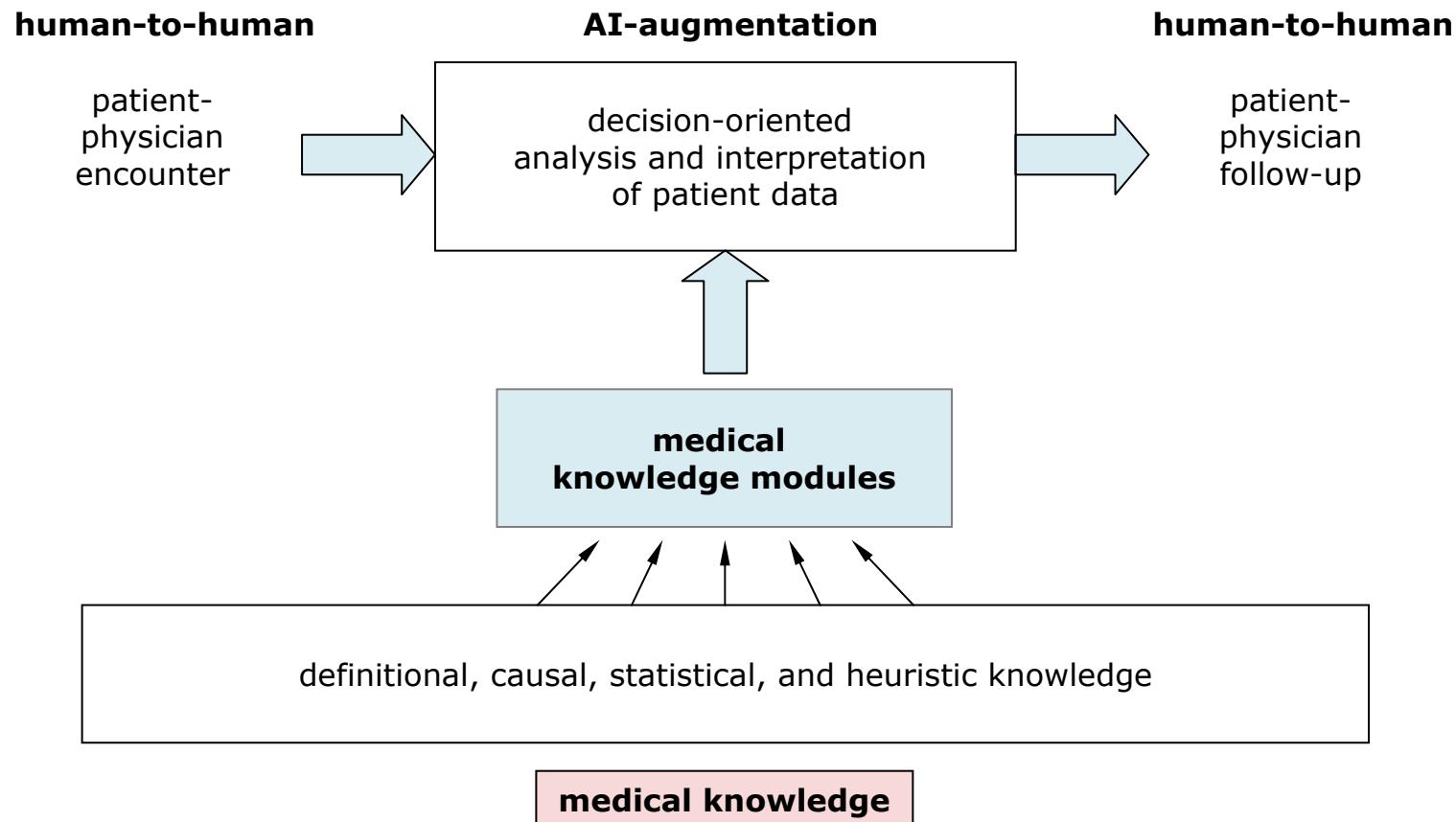


artificial-intelligence-augmented clinical medicine

# Computational intelligence in medical research



# Computational intelligence in patient care



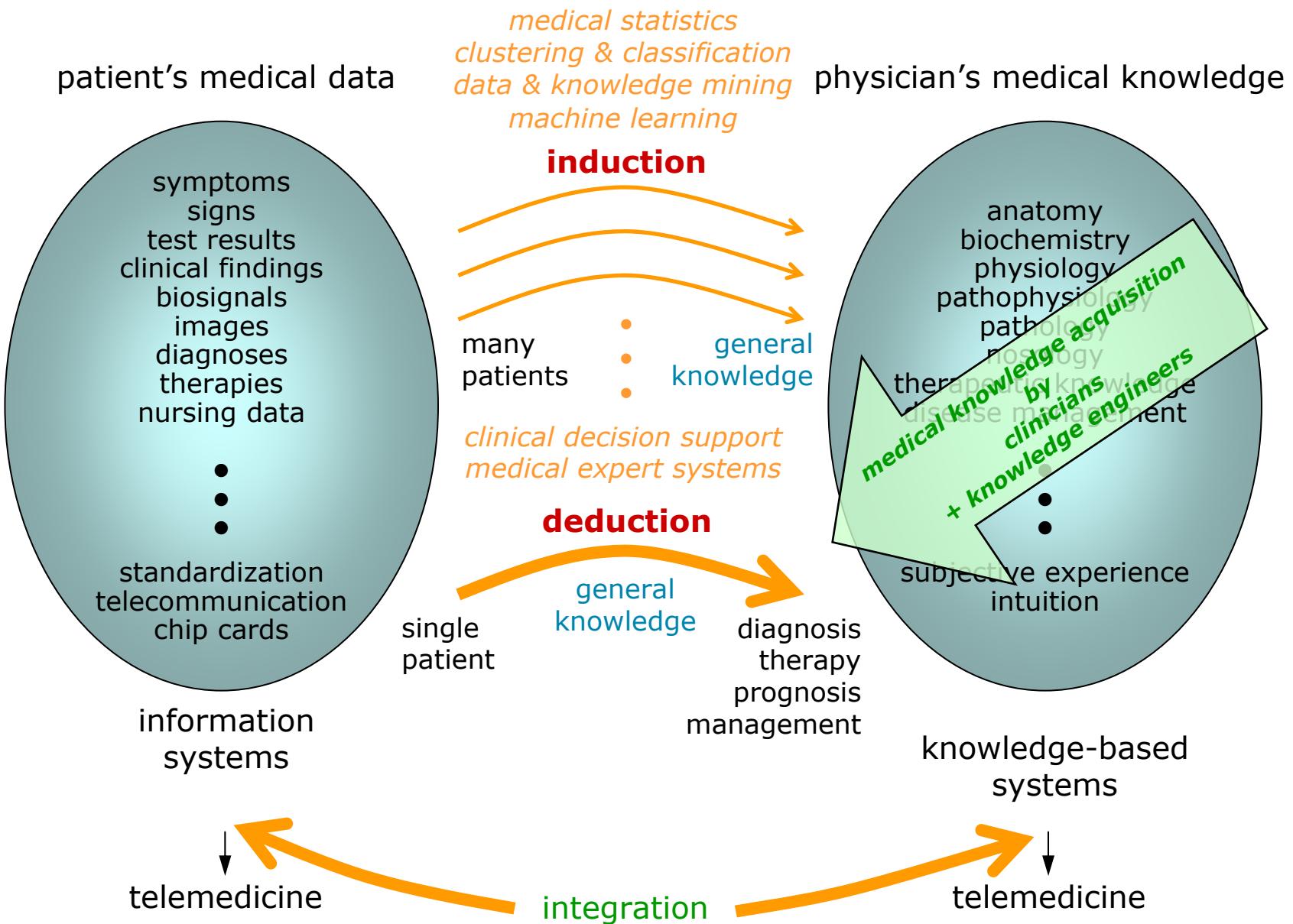
## Computers in clinical medicine

### Steps of natural progression

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- step 1: patient administration
  - ADT and billing
- step 2: medical data
  - electronic health record
- step 3: medical data retrieval and analysis
  - research databases, studies, quality management
- step 4: knowledge-based systems for clinical decision support
  - safety net, patient-centered quality assurance
    - ... for the individual patient
    - ... and the physician
    - ... and the medical institution

# Medical information and knowledge-based systems



## Clinical decision support

|   |   |
|---|---|
| <p><b>diagnosis</b></p> <ul style="list-style-type: none"> <li>• clinical alerts, reminders, calculations</li> <li>• data interpretation, (tele)monitoring</li> <li>• single or differential diagnosis           <ul style="list-style-type: none"> <li>– further or redundant diagnostic investigations</li> <li>– all pathological signs accounted for</li> </ul> </li> <li>• consensus-criteria-based diagnosis           <ul style="list-style-type: none"> <li>– definitions</li> <li>– classification criteria</li> </ul> </li> </ul> | <p><b>therapy</b></p> <ul style="list-style-type: none"> <li>• drug alerts, reminders, calculations           <ul style="list-style-type: none"> <li>– indication, contraindications, redundant medications, substitutions</li> <li>– drug allergies, interactions, dosage calculations, consequent orders</li> </ul> </li> <li>• management of antibiotics therapy</li> <li>• (open-loop) control systems</li> </ul> |
| <p><b>prognosis</b></p> <ul style="list-style-type: none"> <li>• illness severity scores, prediction rules</li> <li>• trend detection and visualization</li> </ul>  | <p><b>patient management</b></p> <ul style="list-style-type: none"> <li>• administrative reminders</li> <li>• computerized clinical guidelines, protocols</li> <li>• community- and hospital-acquired infections, cross infections</li> <li>• high-level patient and hospital analytics</li> </ul>  |

**Hepaxpert/Interpretation****Knowledge-based interpretation of hepatitis A, B, and C serology**[Input of test results](#)[Interpretation](#)[FAQs](#)[Scientific development](#)[Scientific publications](#)[Feedback](#)[English version](#)[Deutsche Version](#)**Interpretation**user: mxt [logout](#)**Hepatitis A serology**

| anti-HAV | IgM anti-HAV | HAV-RNA    |
|----------|--------------|------------|
| positive | not tested   | not tested |

Antibodies to the hepatitis virus A may occur in three different situations: (a) in the case of a recent hepatitis A virus infection (acute icteric or anicteric hepatitis A, subclinical disease, or stage of convalescence from hepatitis A), (b) in the case of immunity after an earlier hepatitis A virus infection, or (c) after active vaccination or in the case of passively acquired immunity through injection of gamma globulin.

**Hepatitis B serology**

| HBsAg      | anti-HBs   | anti-HBc       | IgM anti-HBc |
|------------|------------|----------------|--------------|
| negative   | not tested | not tested     | negative     |
| HBeAg      | anti-HBe   | anti-HBs titre |              |
| not tested | not tested | 2000 U/l       |              |

This constellation of findings (positive anti-HBs antibodies, with negative IgM anti-HBc antibodies) indicates the presence of immunity to the hepatitis virus B. This immunity may either have been acquired naturally upon restitution following a hepatitis B virus infection or it may have been induced by active or passive immunization.

**Vaccination Recommendation:** If an indication for a hepatitis B vaccination exists, the primary course of immunization has been completed, the last partial vaccination was given at least 1 month previously, and the vaccinated person's immunity is unimpaired, then a hepatitis B vaccination (or a follow-up anti-HBs titre check) within 5 years, based on the titre examination date, is to be recommended at the measured anti-HBs titre value of 2000 U/l.

**Hepatitis C serology**

| anti-HCV | HCV-RNA  |
|----------|----------|
| positive | negative |

The findings obtained give an indication of a formerly passed HCV infection or the remission of a present HCV infection. If on account of the clinical picture hepatitis C is suspected, follow-up tests are recommendable. Blood of such patients may be considered as infectious with regard to hepatitis C.

**Important Notice**

The attending physician alone is responsible for the patient's diagnosis and therapy. Therefore, contact a doctor at all times. Only the doctor will be able to align the Hepaxpert interpretation with the full clinical picture of the patient.

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## One of the rules to interpret clinically relevant findings (rule premises form equivalent classes)

### RULE 103:

**IF one of the following 100 combinations**

| HBsAg | anti-HBs | anti-HBc | IgM anti-HBc | HBeAg   | anti-HBe |
|-------|----------|----------|--------------|---------|----------|
| +     | •        | +        | - ±          | - ± •   | +        |
| +     | •        | +        | + •          | + - ± • | + - ± •  |

### THEN

The simultaneous occurrence of HBe-antigen and anti-HBs antibodies is a rare event in the natural course of a hepatitis B virus infection. This constellation of findings may be attributed to one of the following causes: (a) circulating HBsAg-anti-HBs immune complexes, (b) hepatitis B virus infection coinciding with a hepatitis B vaccination or injection of HB-hyperimmune globulin, or (c) reinfection with a hepatitis virus B with a different HBsAg subtype. Blood and secretions (saliva, sperm, breast milk) of such patients are to be regarded as infectious.

Befund  
02.05.2001 (09:46)

Vor-Befund

Referenzbereich und Einheit

## PROTEINDIAGNOSTIK

CRP

61.5 \*\*\*

0.8 - 5.0 mg/l

## HORMONE

TSH

Schilddrüsendiagnostik  
3.00

0.2 - 3.5 mU/l

## INFEKTIONSSEROLOGIE

HIV-Antikörper

Negativ

Negativ

## HEPATITIS-SEROLOGIE

Anti-HAV-IgM

Negativ

Negativ

Anti-HAV

**Positiv**

\*

Negativ

HBsAG

Negativ

Negativ

Anti-HBs

Negativ

Negativ

Anti-HBs (quant.)

1.42

U/l

Anti-HBc

Negativ

Negativ

Anti-HCV

Negativ

Negativ

### Medizin. Kommentar/Interpretation:

#### HEPATITIS-SEROLOGIE:

Positive Gesamtkörper (Anti-HAV) bei negativen IgM-anti-HAV Antikörpern beweisen Immunität gegen das Hepatitis-A-Virus und schließen eine rezente Hepatitis A aus. Diese Immunität kann entweder durch eine frühere Infektion natürlich erworben oder aber durch aktive Impfung oder passive Immunisierung induziert sein.

Anti-HBs Titer: 1 Units/Liter

Eine bestehende oder frühere Hepatitis-B-Virusinfektion kann (mit Ausnahme des Inkubationsstadiums) ausgeschlossen werden. Es besteht keine Immunität gegen das Hepatitis-B-Virus. Das Blut kann hinsichtlich Hepatitis B als nicht infektiös angesehen werden. Impfempfehlung: Die Indikation zur Hepatitis-B-Impfung vorausgesetzt, soll in diesem Fall bei einem Ungeimpften die Grundimmunisierung (entsprechend dem Schema des jeweiligen Impfstoffes) durchgeführt und - zur Abschätzung der Immunantwort - 1-2 Monate nach der letzten Teilimpfung der Anti-HBs Titer bestimmt werden. Bei einem Geimpften mit abgeschlossener Grundimmunisierung soll unverzüglich eine Booster Injektion gegeben und - falls der Verdacht eines slow responders besteht - eine Titerkontrolle 2 Monate nach dem Booster erhoben werden.

test results

interpretation

# ORBIS Experter: Hepatitis serology diagnostics

ORBIS

Datei Bearbeiten Fenster Extra ?

IM/ST1 FLEMING

10.11.2005 13:26:54 DEMO -05.03.29.4410

Übersichten

Station Funktionsbereich OP-Bereich Expertensystem

Hepaxpert III

Hep. A Hep. B Hep. C

|              |             |               |                |          |             |
|--------------|-------------|---------------|----------------|----------|-------------|
| Anti-HAVA    | Negativ     | Anti-HBs      | Positiv        | Anti_HCV | Positiv     |
| IgM anti-HAV | Positiv     | Anti-HBs Titr | 50             | HCV_RNA  | Grenzwertig |
| HAV          | Grenzwertig | HBsAg         | Positiv        |          |             |
|              |             | Anti-HBc      | Negativ        |          |             |
|              |             | IgM_anti_HB   | Negativ        |          |             |
|              |             | HbeAg         | Positiv        |          |             |
|              |             | Anti_HBe      | Nicht gemessen |          |             |

Ergebnisse

**Hepatitis A** Der Befund enthält Widersprüche, da definitionsgemäß bei Vorliegen von IgM-anti-HAV-Antikörpern auch die Gesamtkörper Anti-HAV positiv sein müssten.  
Rücksprache mit dem Laborleiter wird empfohlen. Zur Kontrolle des nicht eindeutig negativen oder positiven Befundes wird neuerliche Materialeinsendung empfohlen.

**Hepatitis B** Das gleichzeitige Auftreten von HBe-Antigen und Anti-HBs-Antikörpern ist im natürlichen Verlauf einer Hepatitis-B-Virusinfektion ein seltenes Ereignis. Diese Befundkonstellation ist entweder auf (a) zirkulierende HBsAg-Anti-HBs-Immunkomplexe, (b) auf eine Koinzidenz einer Hepatitis-B-Virusinfektion mit einer Hepatitis-B-Impfung oder Injektion von HB-Hyperimmunglobulin oder (c) eine Reinfektion mit einem Hepatitis-B-Virus mit unterschiedlichem HBsAg-Subtypus zurückzuführen. Blut und Sekrete (Speichel, Sperma, Muttermilch) solcher Patienten sind als infektiös anzusehen.

**Hepatitis C** Es besteht eine rezente oder chronisch persistierende oder eine früher abgelaufene Hepatitis-C-Virusinfektion. Die Bestimmung von HCV-RNA bringt zusätzliche Information. Das Blut solcher Personen ist hinsichtlich Hepatitis C als infektiös anzusehen.  
Zur Kontrolle des nicht eindeutig negativen oder positiven Befundes wird neuerliche Materialeinsendung empfohlen.

geöffnete Akten

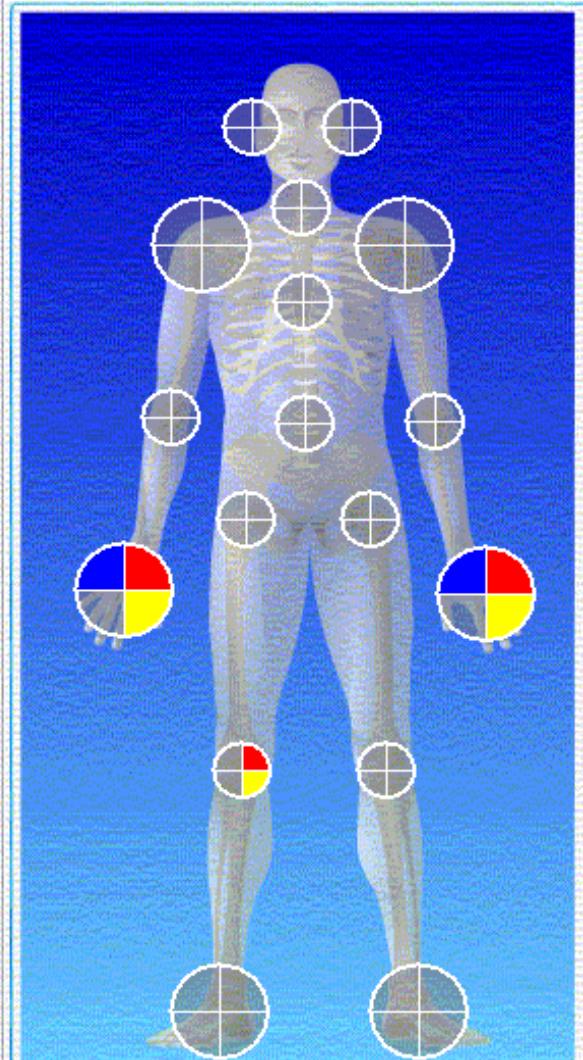
Bauer, Mathias

Diagnosen Prozeduren Kumulativbefund Labor Krankengeschichte Abrechnung DRG Workplace Fieberkurve ICU-Scoring Interne Leistungen Zusatzinfos

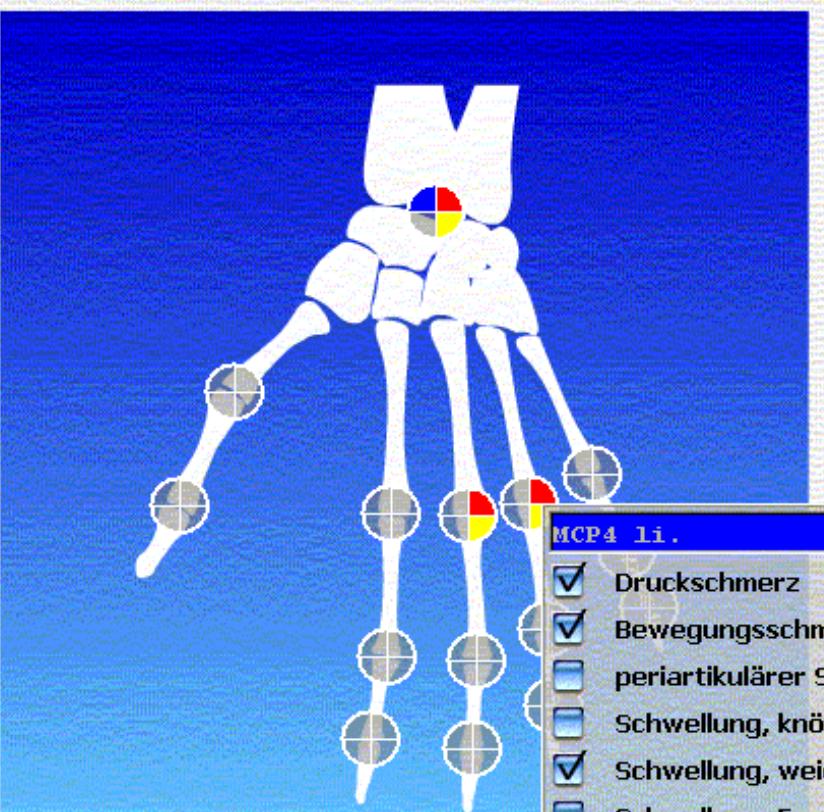


Stammdaten Anamnese Status Labor/Röntgen Diagnosevorschlag

Status Gelenke



Detailansicht

**MCP4 li.**

- Druckschmerz
- Bewegungsschmerz
- periartikulärer Schmerz
- Schwellung, knöchern
- Schwellung, weich
- Schwellung, Erguß
- Rötung
- Bewegungseinschränkung

Transparenz des Körpers

Status Wirbelsäule

Fingerbodenabstand 10 cm

Schobersche Distanz 5 cm

re li

Menellsche Zeichen

Beckentiefstand

re: Beinlänge

cm

li: Beinlänge

cm

periphere Lähmung re li

re

li



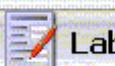
Stammdaten



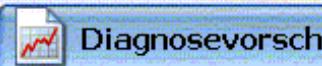
Anamnese



Status



Labor/Röntgen



Diagnosevorschlag

**Diagnosevorschlag**

## mögliche Diagnosen

- Verdacht auf entzündliche Gelenkerkrankung
  - Verdacht auf reaktive Arthritis
  - Verdacht auf Arthropathia psoriatica
  - Verdacht auf chronische Polyarthritis
  - Verdacht auf metabolische Gelenkerkrankung



## ausgeschlossene Diagnosen

- Verdacht auf mechanische Ursache der Rückenbeschwerden
  - Verdacht einer malignen Erkrankung als Ursache der Rückenbeschwerden
  - Verdacht eines Traumas als Ursache der Rückenbeschwerden
  - Verdacht auf funktionelle oder degenerative Rückenbeschwerden
  - Verdacht auf Nervenwurzelkompression der Wirbelsäule
- Verdacht auf entzündliche Wirbelsäulenerkrankung
  - Verdacht auf bakterielle Spondylarthritis
  - Verdacht auf Spondylitis ankylosans
  - Verdacht auf Spondylarthropathia psoriatica
  - Verdacht auf Spondylarthritis bei Reiter-Syndrom
  - Verdacht auf Spondylarthritis bei Enteropathie (Morbus Crohn usw.)
  - Verdacht auf metabolische Wirbelsäulenerkrankung



## **data level**

## **data-to-symbol conversion**

**degenerative affection of one or more distal joints**

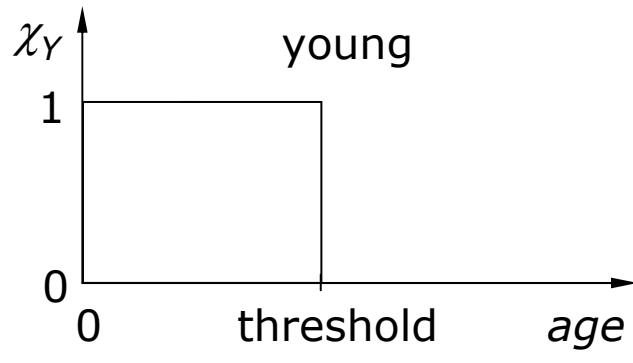
at least 1 out of 18:  
DIP r or DIP l or IP r or IP l and  
per joint: (tenderness or pain on motion) and  
osseous swelling

# ~~symbol level~~

## Uncertainty in medicine

- **imprecision** (=fuzziness) of medical concepts
  - due to the unsharpness of boundaries of linguistic concepts; gradual transition from one concept to another
  - modeled by fuzzy sets
- **uncertainty** of medical conclusions
  - due to the uncertainty of the occurrence and co-occurrence of imprecise medical concepts
  - modeled by SigmaCounts (unconditioned and conditioned frequencies of fuzzy sets)
- **incompleteness** of medical data and medical theory
  - due to only partially known data and partially known explanations for medical phenomena
  - modeled by fuzzy intervals

## Crisp sets vs. fuzzy sets



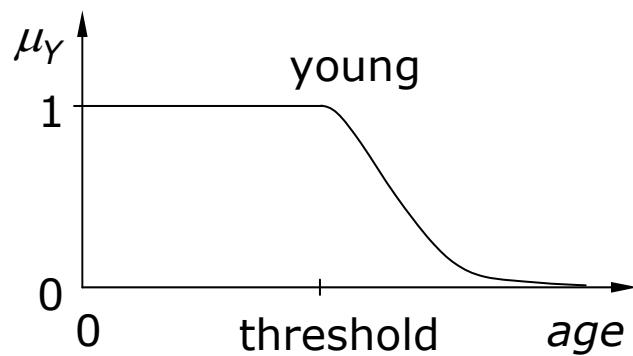
yes/no decision

$$U = [0, 120]$$

$$Y \subseteq U \text{ with } Y = \{(\chi_Y(x)/x) | x \in U\}$$

$$\chi_Y: U \rightarrow \{0, 1\}$$

$$\chi_Y(x) = \begin{cases} 0 & x > \text{threshold} \\ 1 & x \leq \text{threshold} \end{cases} \quad \forall x \in U$$



gradual transition

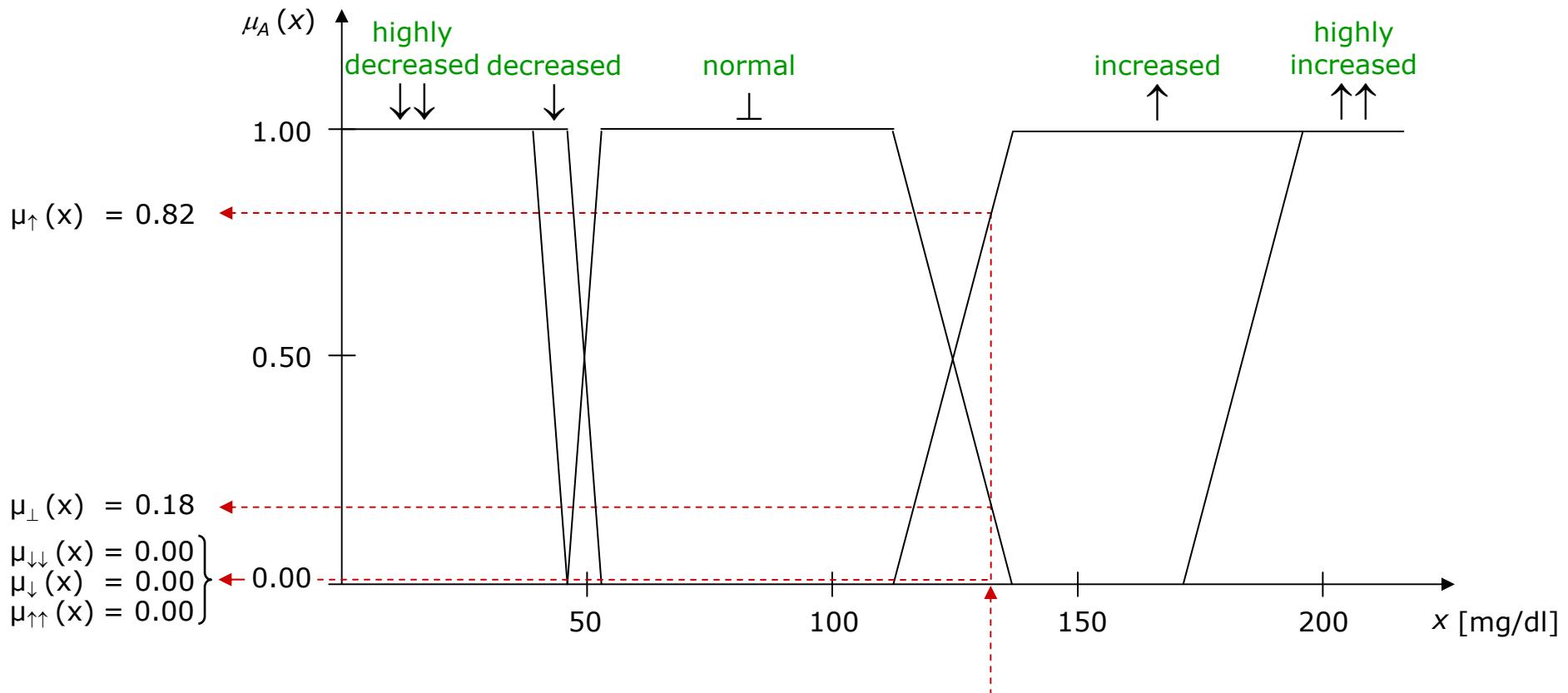
$$U = [0, 120]$$

$$Y \subseteq U \text{ with } Y = \{(\mu_Y(x)/x) | x \in U\}$$

$$\mu_Y: U \rightarrow [0, 1]$$

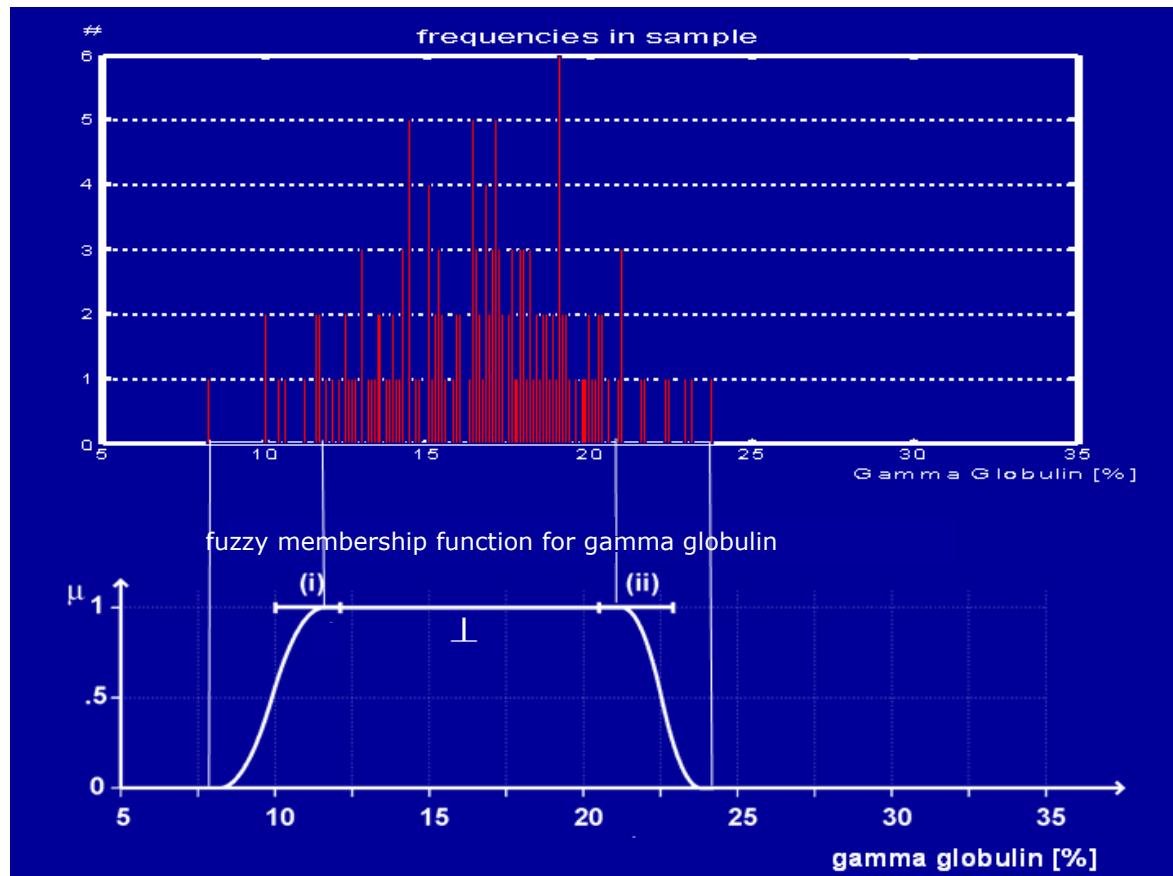
$$\mu_Y(x) = \begin{cases} \frac{1}{1 + (0.04 x)^2} & x > \text{threshold} \\ 1 & x \leq \text{threshold} \end{cases} \quad \forall x \in U$$

## Degree of compatibility [= degree of membership]



glucose level in serum of 130 mg/dl

## Calculation of fuzzy sets from sample data



**Healthy persons:**

$$n = 151$$

$$\min = 8.2$$

$$\max = 23.8$$

$$\Phi_{0,05} = 11.6$$

$$\Phi_{0,95} = 21.24$$

$$\mu_1 = \pi(x; 8.2; 9.9; 11.6; 21.24; 22.52; 23.8)$$

(i) 90% confidence interval:  
[10; 12.1]

(ii) 90% confidence interval:  
[20.5; 22.9]

PDMS & FuzzyKBWean

monitoring

pulsoximeter

ventilator

intubated patient



DataSets: 0 100

| HR    | SpO2  | EtCO2 | Rsp_m | Vrate | I_E  | TVex  | pCO2a | pO2a | pHa | RMV  | RSPcap | FiO2  | PEEP | PIP   | Delta | EtCO2corr |
|-------|-------|-------|-------|-------|------|-------|-------|------|-----|------|--------|-------|------|-------|-------|-----------|
| 83.75 | 98.00 | 29.26 | 14.25 | 15.00 | 2.00 | 0.538 |       |      |     | 7.98 | 15.00  | 34.00 | 3.00 | 16.00 | 1.02  | 30.28     |

Time &amp; Date

22:53 1999.01.22

**Changes**

|            |    |   |       |  |  |
|------------|----|---|-------|--|--|
| proposed:  | 29 | * | 14.11 |  |  |
| effective: |    |   |       |  |  |

**Proposals:**

Ventilation\_3 Hyperventilation : PIP .2

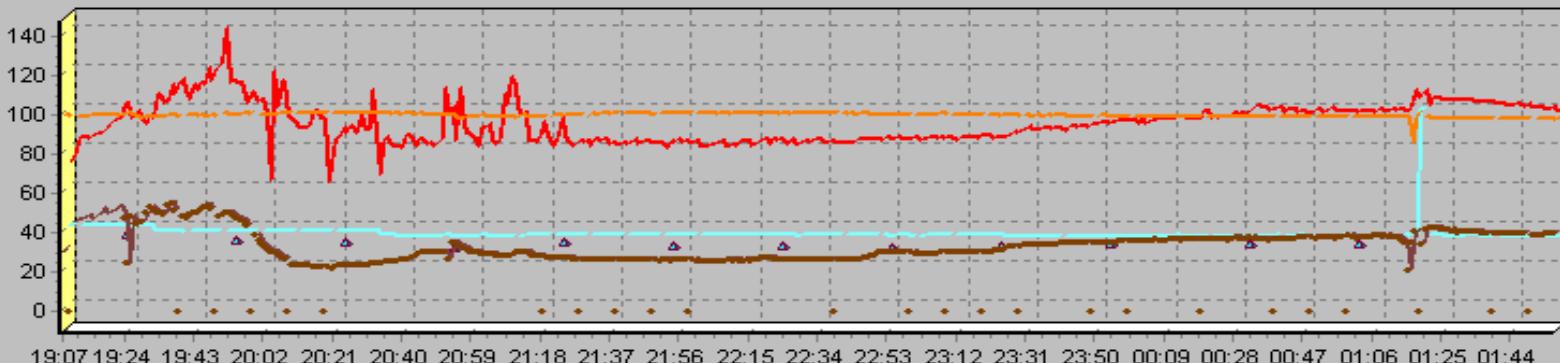
Oxygenierung\_1 Oxygenierung normal : FiO2 .5

**Spec. Data-Set**

19 \_\_\_\_\_.\_\_\_\_\_.\_\_\_\_\_.\_\_\_\_\_.\_\_\_\_\_.\_\_\_\_\_. Data Set



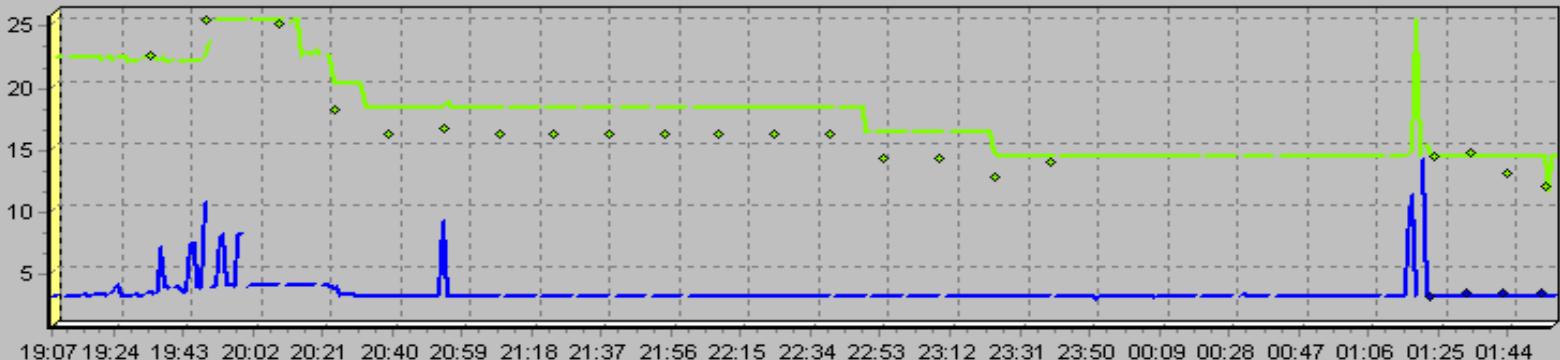
Empty Table



- HR
- FiO2
- PropFiO2
- SpO2
- EtCO2
- EtCO2corr

- HR
- FiO2
- PropFiO2
- SpO2
- EtCO2

410



- PIP
- PIP\_Prop
- PEEP
- PEEP\_Prop

- PIP
- PIP\_Prop
- PEEP
- PEEP\_Prop
- VRate

3D

5:36:25

KBWean Knowledge Base Editor - NFuzzyU\_2.kbs

Knowledge base: BIPAP\_fuzzy\_2000

## Rules (detailed) (17)

Rule Ventilation\_1

if and

- hasNotFiredRule
- Oxygenierung\_2
- 20
- hasNotFiredRule
- Extubation\_1
- 15
- isValid
- ETCO2
- 0
- hasNotFiredRule
- Ventilation\_1
- 30
- in
- mean
- ETCO2
- 1
- 30
- ETCO2\_wean\normal
- in
- ETCO2
- ETCO2\_wean\normal
- in
- TVex
- TVex\normal

then

Set output values

| FiO2 | PIP    | PEEP   | dPIP |
|------|--------|--------|------|
| [%]  | [mbar] | [mbar] |      |
| -3   |        |        |      |

Display message

Weaning\_Ventilation im Normalbereich

Block / unblock groups and rules

- ... < no group >
- Meßfehler\_1
- Meßfehler\_2
- Ventilation\_1
- Ventilation\_2
- Ventilation\_3
- Oxygenierung\_1
- Oxygenierung\_2
- Oxygenierung\_3
- Extubation\_1
- inv\_PIP
- Anstieg\_EtCO2
- Meßfehler\_3

Block

= minute(s)  
 = until unblocked

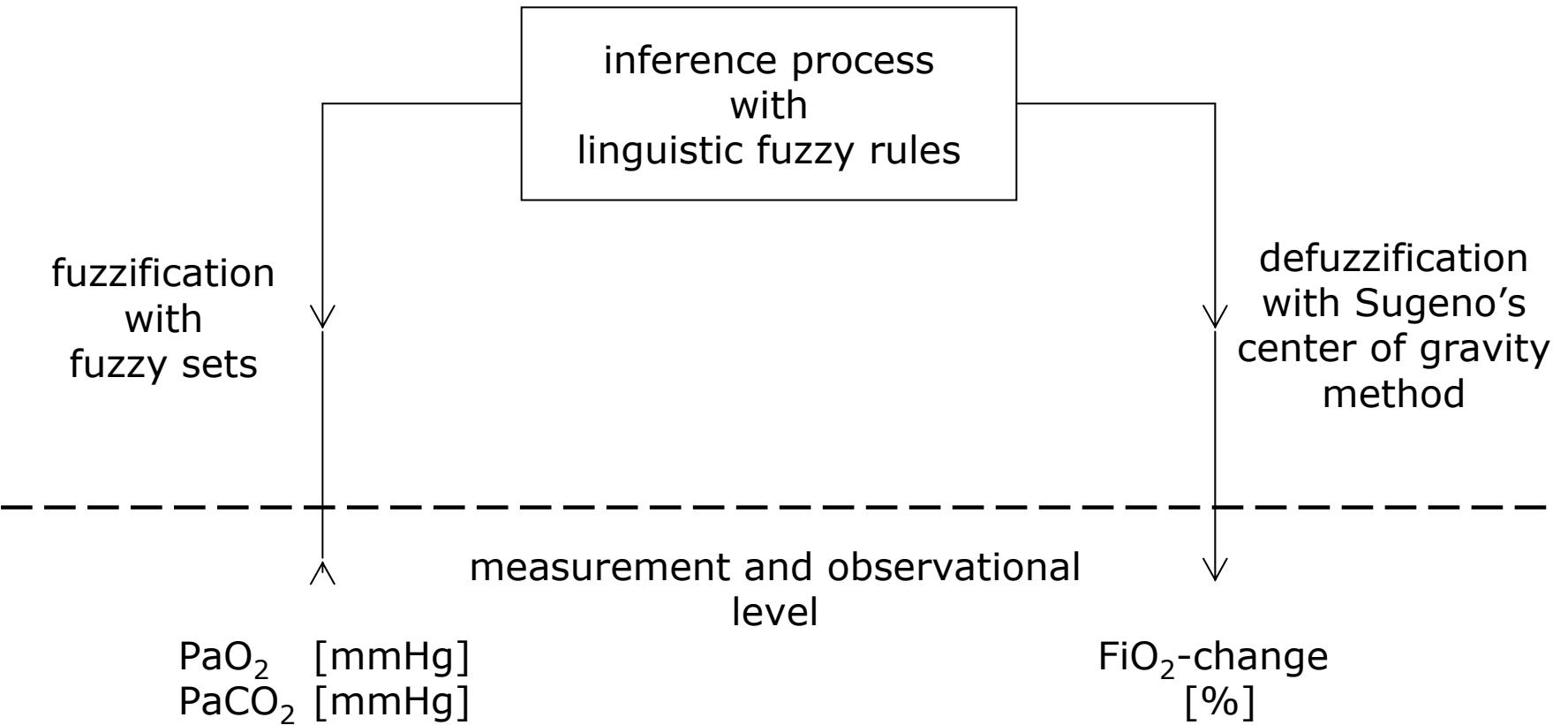
Unblock

Don't change

Set mode of operation < no change >

General settings Variables Fuzzy sets Groups + Rules Rules (detailed)

## Fuzzy control



increased  
disposition by  
low immunity

exposure to  
pathogens

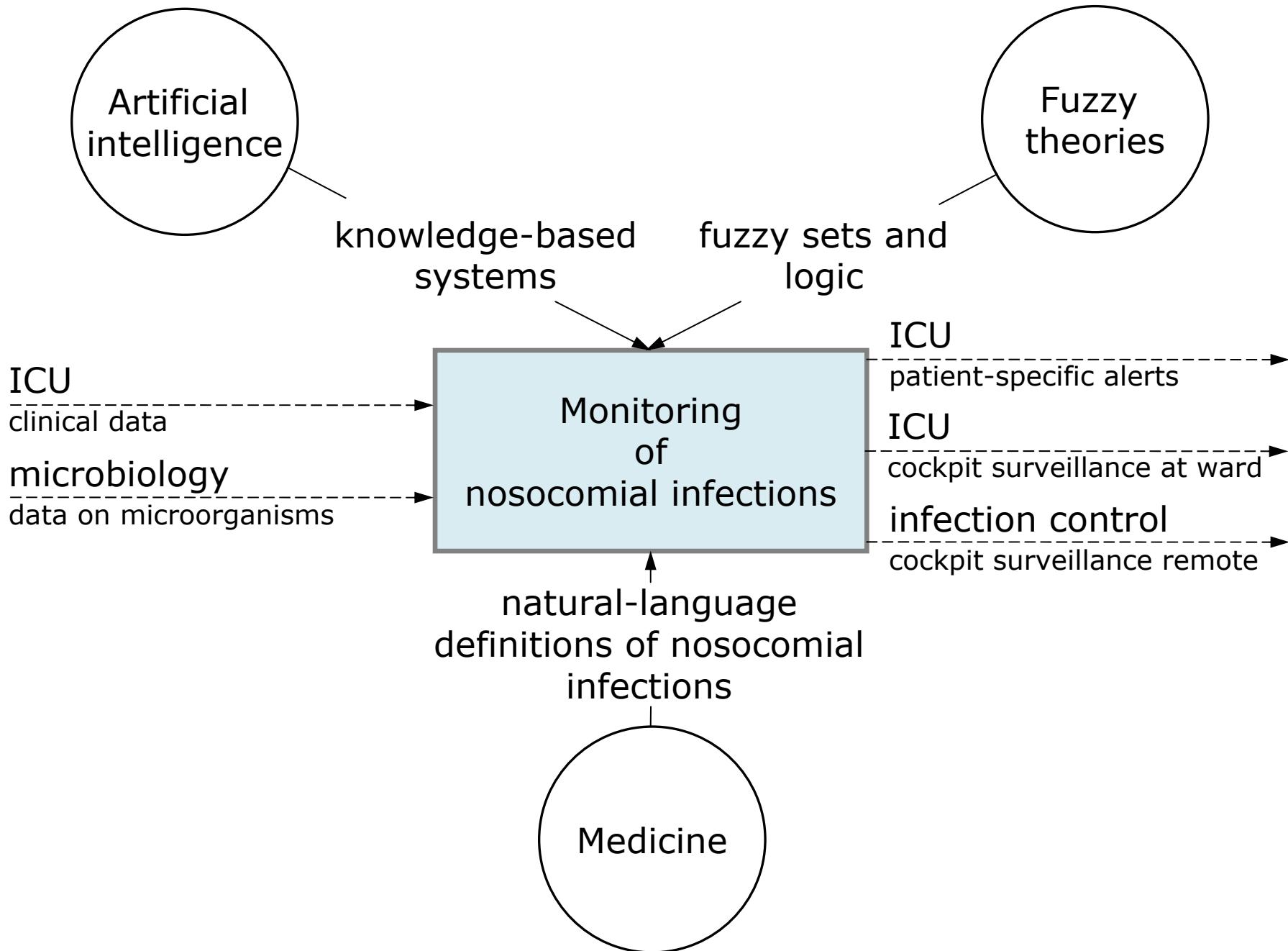
ESBL - extended spectrum beta-lactamase

VRE - vancomycin-resistant enterococcus

MRSA - methicillin-resistant *Staphylococcus aureus*

MDR-TB - multidrug-resistant tuberculosis

entry sites



**INFECTION SITE:** Symptomatic urinary tract infection

**CODE:** UTI-SUTI

**DEFINITION:** A symptomatic urinary tract infection must meet at least one of the following criteria:

**Criterion 1:** Patient has at least *one* of the following signs or symptoms with no other recognized cause: fever ( $>38^{\circ}$  C), urgency, frequency, dysuria, or suprapubic tenderness  
*and*

patient has a positive urine culture, that is,  $\geq 10^5$  microorganisms per  $\text{cm}^3$  or urine with no more than two species of microorganisms.

**Criterion 2:** Patient has at least *two* of the following signs or symptoms with no other recognized cause: fever ( $>38^{\circ}$  C), urgency, frequency, dysuria, or suprapubic tenderness  
*and*

at least *one* of the following:

- a. positive dipstick for leukocyte esterase and/or nitrate
- b. pyuria (urine specimen with  $\geq 10 \text{ wbc/mm}^3$  or  $\geq 3 \text{ wbc/high power field of unspun urine}$ )
- c. organisms seen on Gram stain of unspun urine
- d. at least *two* urine cultures with repeated isolation of the same

uropathogen (gram-negative bacteria or *S. saprophyticus*) with  $\geq 10^2$  colonies/ml in nonvoided specimens

e.  $\leq 10^5$  colonies/ml of a single uropathogen (gram-negative bacteria or *S. saprophyticus*) in a patient being treated with an effective antimicrobial agent for a urinary tract infection

f. physician diagnosis of a urinary tract infection

g. physician institutes appropriate therapy for a urinary tract infection.

**Criterion 3:** Patient  $\leq 1$  year of age has at least *one* of the following signs or symptoms with no other recognized cause: fever ( $>38^{\circ}$  C), hypothermia ( $<37^{\circ}$  C), apnea, bradycardia, dysuria, lethargy, or vomiting  
*and*

patient has a positive urine culture, that is,  $\geq 10^5$  microorganisms per  $\text{cm}^3$  of urine with no more than two species of microorganisms.

**Criterion 4:** Patient  $\leq 1$  year of age has at least *one* of the following signs or symptoms with no other recognized cause: fever ( $>38^{\circ}$  C), hypothermia ( $<37^{\circ}$  C), apnea, bradycardia, dysuria, lethargy, or vomiting  
*and*

at least *one* of the following:

- a. positive dipstick for leukocyte esterase and/or nitrate
- b. pyuria (urine specimen with  $\geq 10 \text{ wbc/mm}^3$  or  $\geq 3 \text{ wbc/high power field of unspun urine}$ )

$\text{wbc/mm}^3$  or  $>3 \text{ wbc/high power field of unspun urine}$ )

c. organisms seen on gram stain or unspun urine

d. at least *two* urine cultures with repeated isolation of the same uropathogen (gram-negative bacteria or *S. saprophyticus*) with  $\geq 10^2$  colonies/ml in nonvoided specimens

e.  $\leq 10^5$  colonies/ml of a single uropathogen (gram-negative bacteria or *S. saprophyticus*) in a patient being treated with an effective antimicrobial agent for a urinary tract infection

f. physician diagnosis of a urinary tract infection

g. physician institutes appropriate therapy for a urinary tract infection.

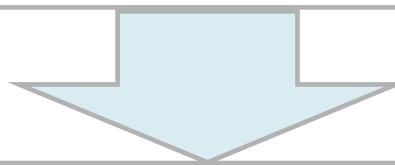
#### COMMENTS:

- A positive culture of a urinary catheter tip is *not* an acceptable laboratory test to diagnose a urinary tract infection.
- Urine cultures must be obtained using appropriate technique, such as clean catch collection or catheterization.
- In infants, a urine culture should be obtained by bladder catheterization or suprapubic aspiration; a positive urine culture from a bag specimen is unreliable and should be confirmed by a specimen aseptically obtained by catheterization or suprapubic aspiration.

## Bloodstream infection with clinical signs and growth of same skin contaminant from two separate blood samples

- Patient has at least one of the following signs or symptoms: fever ( $>38^{\circ}\text{C}$ .), chills, or hypotension and 2 positive blood cultures for a common skin contaminant (from 2 separate blood samples drawn within 48 hours).

skin contaminants = coagulase-negative staphylococci, *Micrococcus sp.*, *Propionibacterium acnes*, *Bacillus sp.*, *Corynebacterium sp.*



BSI-A2

1  
↔

clinical\_signs\_of\_BSI (t-1d, t, t+1d)

^

same\_skin\_contaminant\_from\_two\_separate\_blood\_samples

# Decomposition—clinical signs

clinical\_signs\_of\_BSI (t-1d, t, t+1d) [yesterday, today, tomorrow]

=

clinical\_signs\_of\_BSI (t-1d)

=

{ fever (t-1d)  
  ∨  
hypotension (t-1d)  
  ∨  
leucopenia (t-1d)  
  ∨  
leucocytosis (t-1d)  
  ∨  
CRP increased (t-1d)}

∨

clinical\_signs\_of\_BSI (t)

=

{ fever (t)  
  ∨  
hypotension (t)  
  ∨  
leucopenia (t)  
  ∨  
leucocytosis (t)  
  ∨  
CRP increased (t)}

∨

clinical\_signs\_of\_BSI (t+1d)

=

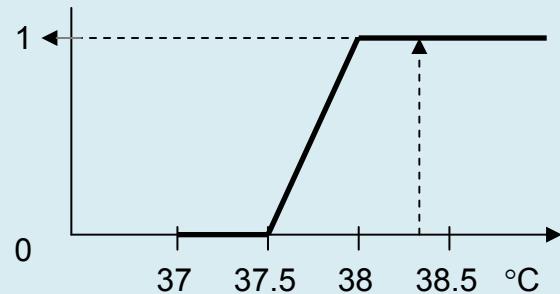
{ fever (t+1d)  
  ∨  
hypotension (t+1d)  
  ∨  
leucopenia (t+1d)  
  ∨  
leucocytosis (t+1d)  
  ∨  
CRP increased (t+1d)}

# Clinical signs—fever

fever ( $t-1d$ )  $\Leftarrow \dots$

fever ( $t$ )  $\Leftarrow \begin{cases} \text{body temperature } \uparrow \\ \vee \\ \text{thermoregulation applied } \dots \end{cases}$

← data import  
intensive care unit  
[ maximum value  
of the day  
e.g.,  $38.5^\circ\text{C}$  ]



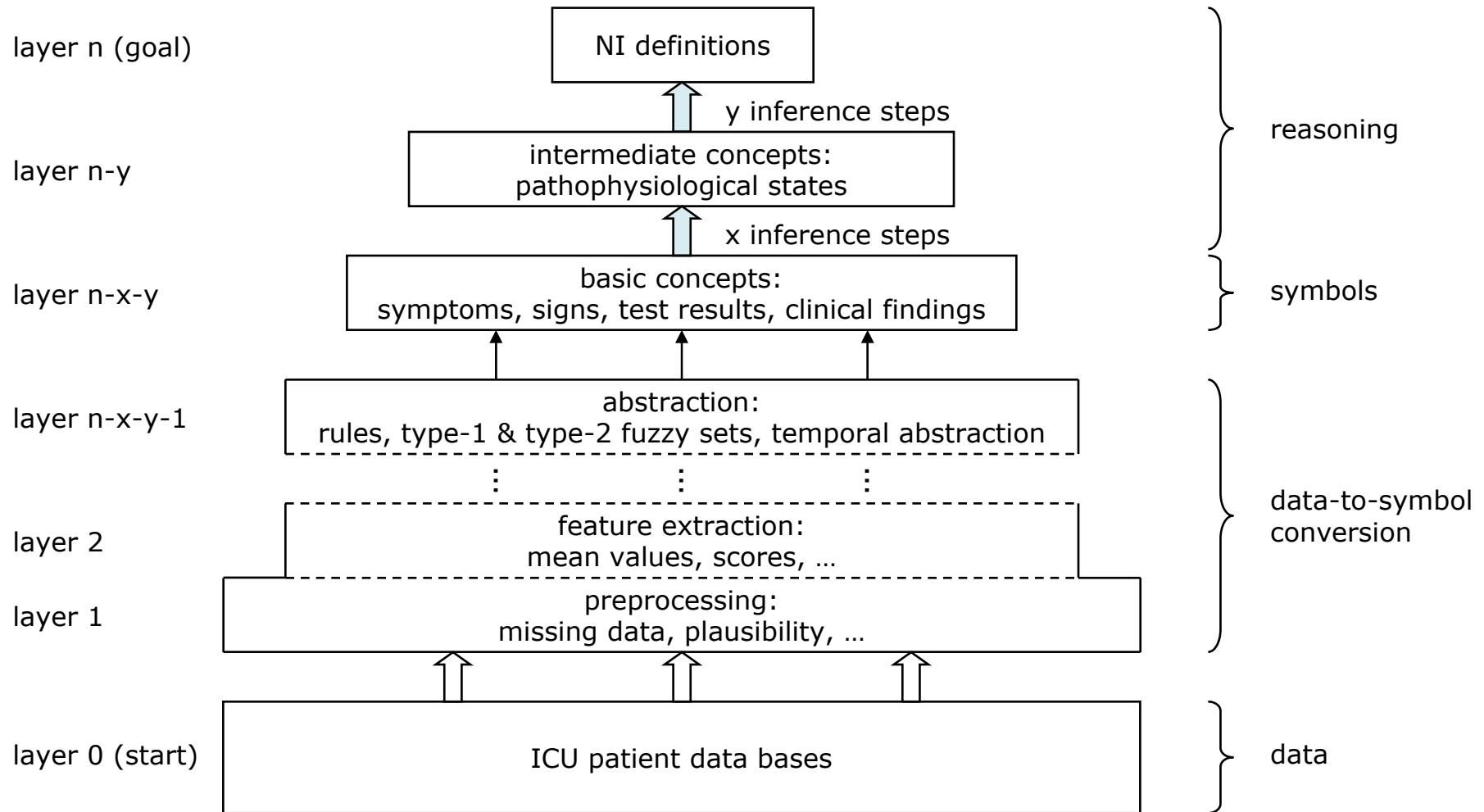
fever ( $t+1d$ )  $\Leftarrow \dots$



|              | Zeit: 4 h<br>Autom. Dokument. @30mi  | 1800 | 2200 | 06Juli05<br>0200 | 0600 | 1000                 | 06Juli05<br>1400            | 1800                 | 2200                 | 07Juli05<br>0200     | 0600                 | 1000                 | 07Juli05<br>1400     |
|--------------|--|------|------|------------------|------|----------------------|-----------------------------|----------------------|----------------------|----------------------|----------------------|----------------------|----------------------|
| GRAFIK       | A Katheter/Sonde<br>1 Ereignis: Was?<br>1 Ereignis: Wer?   |      |      |                  |      | *                    | ZVK 1<br>* gelegt<br>* kos. |                      |                      |                      |                      |                      |                      |
| ÜBER-SICHT   | Z VK 1: Zugang<br>V VK 1: Tag/Lumen<br>K VK 1: Befund<br>Z VK 1: Rein./Desinf.<br>Z VK 1: Versorgung<br>Z VK 1: Versorg. seit<br>Z VK 1: Kontrolle |      |      |                  |      | ►re Scl.<br>► 1 4-lu | re Scl.<br>1 4-lu           | re Scl.<br>1 4-lu    | re Scl.<br>1 4-lu    | re Scl.<br>2 4-lu    | re Scl.<br>2 4-lu    | re Scl.<br>2 4-lu    | re Scl.<br>2 4-lu    |
| NEURO/STATUS | Z VK 1: Rein./Desinf.<br>Z VK 1: Versorgung<br>Z VK 1: Versorg. seit<br>Z VK 1: Kontrolle  |      |      |                  |      | ►0,9/ SH<br>► Stand. | Stand.                      | Stand.               | Stand.               | Stand.               | Stand.               | Folie                | Folie                |
| ATMUNG       | Z VK 2: Zugang<br>Z VK 2: Tag/Lumen<br>Z VK 2: Befund<br>Z VK 2: Rein./Desinf.   |      |      |                  |      | ► 6 Juli             | 6 Juli                      | 6 Juli               | 6 Juli               | 6 Juli               | 6 Juli               | 7 Juli               | 7 Juli               |
| MED./BILANZ  | Z VK 2: Versorgung<br>Z VK 2: Versorg. seit<br>Z VK 2: Kontrolle   |      |      |                  |      | li Scl.<br>14 3-lu   | li Scl.<br>14 3-lu          | li Scl.<br>15 3-lu   |                      |                      |                      |                      |                      |
| SPEZ.THERAP  | Z VK 2: Versorgung<br>Z VK 2: Versorg. seit<br>Z VK 2: Kontrolle   |      |      |                  |      | Folie<br>►28 Juni    | Folie<br>28 Juni            | Folie<br>►28 Juni    | Druckvb<br>6 Juli    | Druckvb<br>6 Juli    | Druckvb<br>6 Juli    | ►Druckvb<br>► 6 Juli | ►Druckvb<br>► 6 Juli |
| PFLEGE       | A Art.2: Zugang<br>r Art.2: Tag/Typ<br>t Art.2: Befund<br>e Art.2: Rein./Desinf.<br>r Art.2: Versorgung<br>i Art.2: Versorg. seit                  |      |      |                  |      | li fem.<br>►22 G16L  | li fem.<br>22 G16L          | li fem.<br>►22 G16L  |                      |                      |                      |                      |                      |
| SPEZ.PFLEGE  | r Art.2: Rein./Desinf.<br>i Art.2: Versorg. seit   |      |      |                  |      | gerötet              | gerötet                     | gerötet              |                      |                      |                      |                      |                      |
| KATH./SONDEN | H Harnabl.2: Tag/Typ<br>a HarnK.2: Ch/Material<br>r HarnK.2: Befund<br>n HarnK.2: Rein/Desinf<br>a HarnK.2: Versorgung<br>i HarnK.2: Versorg. seit |      |      |                  |      | 9 DK<br>►16 Sili     | 9 DK<br>16 Sili             | 9 DK<br>►16 Sili     | 9 DK<br>17 Sili      | 9 DK<br>17 Sili      | 9 DK<br>17 Sili      | 10 DK<br>17 Sili     | 10 DK<br>17 Sili     |
| OP-WU/DRAIN  | oB.<br>Std/  |      |      |                  |      |                      |                             |                      |                      |                      |                      |                      |                      |
| LABOR1       | E EntSonde2: Tag/Lokal<br>n EntSonde2: Ch/Typ<br>t EntSonde2: Kontrolle<br>e EntSonde2: Befund<br>r EntSonde2: Fixation                            |      |      |                  |      | Schutz<br>30 Juni    | Schutz<br>30 Juni           | Schutz<br>30 Juni    | Schutz<br>30 Juni    | Schutz<br>30 Juni    | Schutz<br>►30 Jundi  | Schutz<br>30 Jundi   | Schutz<br>30 Jundi   |
| LABOR2       | Pfli+Pol<br>Pfli+Pol<br>Pfli+Pol<br>Pfli+Pol   |      |      |                  |      | ►25 nasL<br>►15 MaSi | ►25 nasL<br>►15 MaSi        | ►26 nasL<br>►15 MaSi | ►26 nasL<br>►15 MaSi | ►26 nasL<br>►15 MaSi | ►27 nasL<br>►15 MaSi | ►27 nasL<br>►15 MaSi | ►27 nasL<br>►15 MaSi |
| NIERE        | P PM: Tag/Zugang<br>M PM: Befund<br>PM: Rein/Desinf.<br>PM: Versorgung<br>PM: Versorg. seit  |      |      |                  |      | 40 Vent              | 40 Vent                     | 40 Vent              | ►41 Vent             | 41 Vent              | ►42 Vent             | 42 Vent              | 42 Vent              |
| HÄMODY-NAMIK |  |      |      |                  |      | Stand.<br>5 Juli     | Stand.<br>5 Juli            | Stand.<br>5 Juli     | ► Stand.<br>► 5 Juli | Stand.<br>5 Juli     | ► Stand.<br>5 Juli   | Stand.<br>5 Juli     | Stand.<br>5 Juli     |
| SCORES       |  |      |      |                  |      |                      |                             |                      |                      |                      |                      |                      |                      |



## Processing layers



# Cockpit surveillance at the infection control unit: Three criteria-based definitions in two patients are completely fulfilled (100%), backtracking of the logical chain of reasoning is provided ...

Moni IV Verwaltung Abmelden

Inferenz Surveillance Export Themes Hilfe

von 1980-08-25 bis 2008-08-25 Anzeigen

| Stationen/Patienten             | BSI-A 1, PN4 1 T1 | BSI-A (primäre Sepsis) |
|---------------------------------|-------------------|------------------------|
| 13H1                            |                   |                        |
| 13C1                            |                   |                        |
| 13C2                            |                   |                        |
| 13B3                            |                   |                        |
| 13C3                            |                   |                        |
| 13B1                            |                   |                        |
| BSI-A 1, PN4 1 T1<br>BSI-A 2 T2 |                   |                        |
| 13H3                            |                   |                        |
| 13H2                            |                   |                        |

BSI-A 1, PN4 1 T1     BSI-A (primäre Sepsis)

2000-01-01    pos. BlutKultur 100 %

  └ Messwerte

  └ Interpretationen und Diagnosen

    └ BSI-A (primäre Sepsis) 100 %

2000-01-08    100 %

  └ beatmet

  └ Interpretationen und Diagnosen

    └ PN4 100 %

    └ PN4 (beatmet) 100 %

    └ PNS 100 %

    └ Fieber 100 %

    └ klinische Anzeichen für Pneumonie (beatmet) 100 %

    └ wiederholter radiolog. Hinweis auf Pneumonie 100 %

# ... down to the level of detailed clinical and laboratory findings

Moni IV Verwaltung Abmelden

Inferenz Surveillance Export Themes Hilfe

von  bis

BSI-A (primäre Sepsis) 

Regel: BSI-A.1 (Regelgewicht: 100 %)

| Parameter              | Wert | Station | ermittelt                   | Urheber | Anmerkung |
|------------------------|------|---------|-----------------------------|---------|-----------|
| BSI-A (primäre Sepsis) | 1.0  | 13B1    | Aug 25, 2008 10:34:22<br>AM | [mxt]   |           |

Bedingungen

| Parameter       | Wert  | Station | ermittelt | Urheber      | Anmerkung                                   |
|-----------------|-------|---------|-----------|--------------|---|
| pos. BlutKultur | 100 % | 13B1    |           | mibi. Import | none; Blut; E. Coli. 10 <sup>6</sup> KBE/ml |

BSI-A (primäre Sepsis) trifft zu, wenn ein kultureller Nachweis von pathogenen Erregern im Blut vorliegt, die nicht in anderem Material zu finden sind.

## Arden and Health Level Seven (HL7)

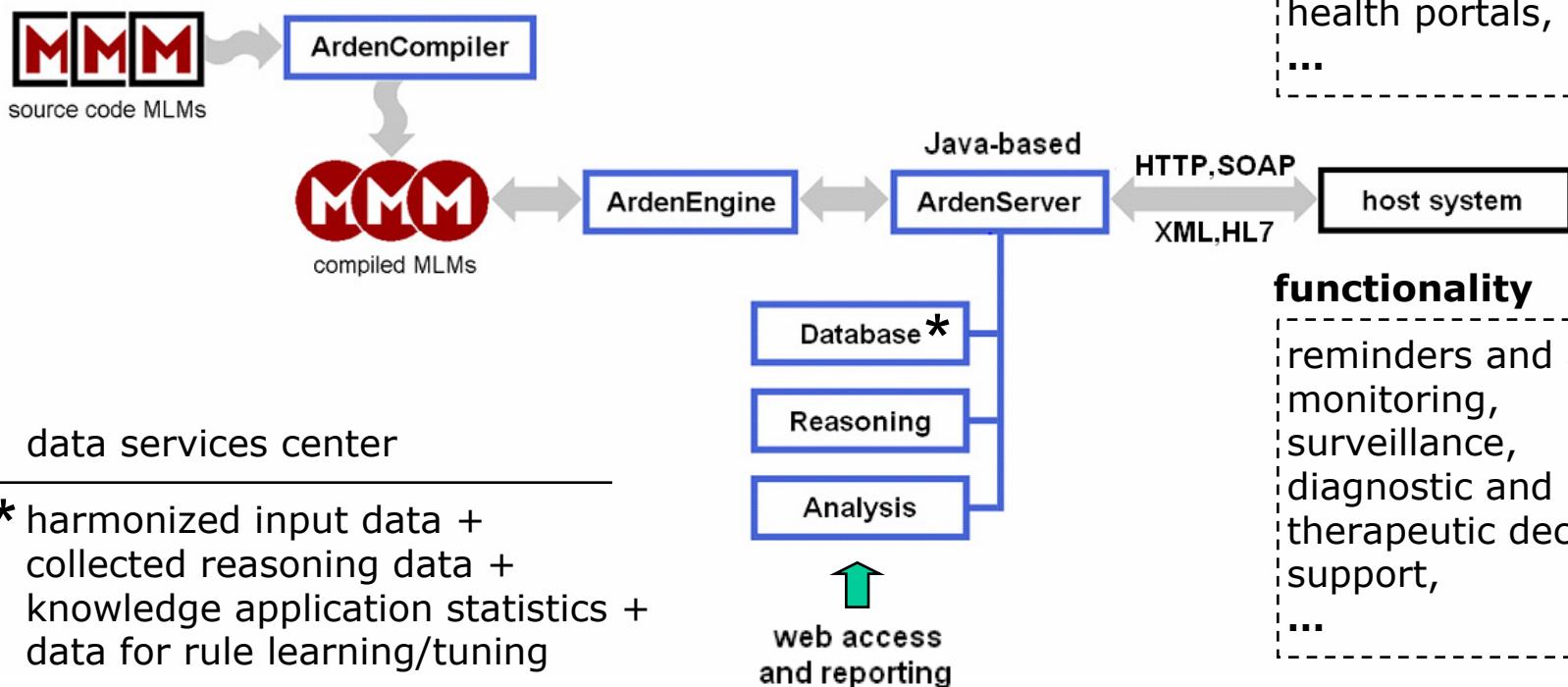
- A standard language for writing situation-action rules that can trigger alerts based on abnormal clinical events detected by a clinical information system.

van Bemmel, J.H., Musen, M.A. (eds.) (1997)  
Handbook of Medical Informatics, Springer-Verlag,  
Heidelberg, Glossary, p. 559.
- Each module, referred to as a Medical Logic Module (MLM), contains sufficient knowledge to make a single decision.

*extended by packages of MLMs for complex clinical decision support*
- Contraindication alerts, management suggestions, data interpretations, treatment protocols, and diagnosis scores are examples of the health knowledge that can be represented using MLMs.

*extended by single and differential diagnosis, temporal monitoring, control systems, selective computerized processing of clinical pathways and management guidelines*
- The first version of the ARDEN syntax was administered and issued by the American Society for Testing and Materials ASTM (1992, version 1.0; today 2.5). Since 1998, an Arden Syntax Special Interest Group (SIG) is part of the HL7 organization ([www.hl7.org](http://www.hl7.org)).

# Arden, ArdenServer, and health care information systems



## Significance of nosocomial infections

- 3 to 14% of patients admitted to acute care hospitals acquire one or more nosocomial infections
- in consequence, 5 to 7% of them die

### Vienna General Hospital with 2,200 beds:

patients admitted to wards: 94,715

days of care: 688,619

average length of stay: 6.1 days

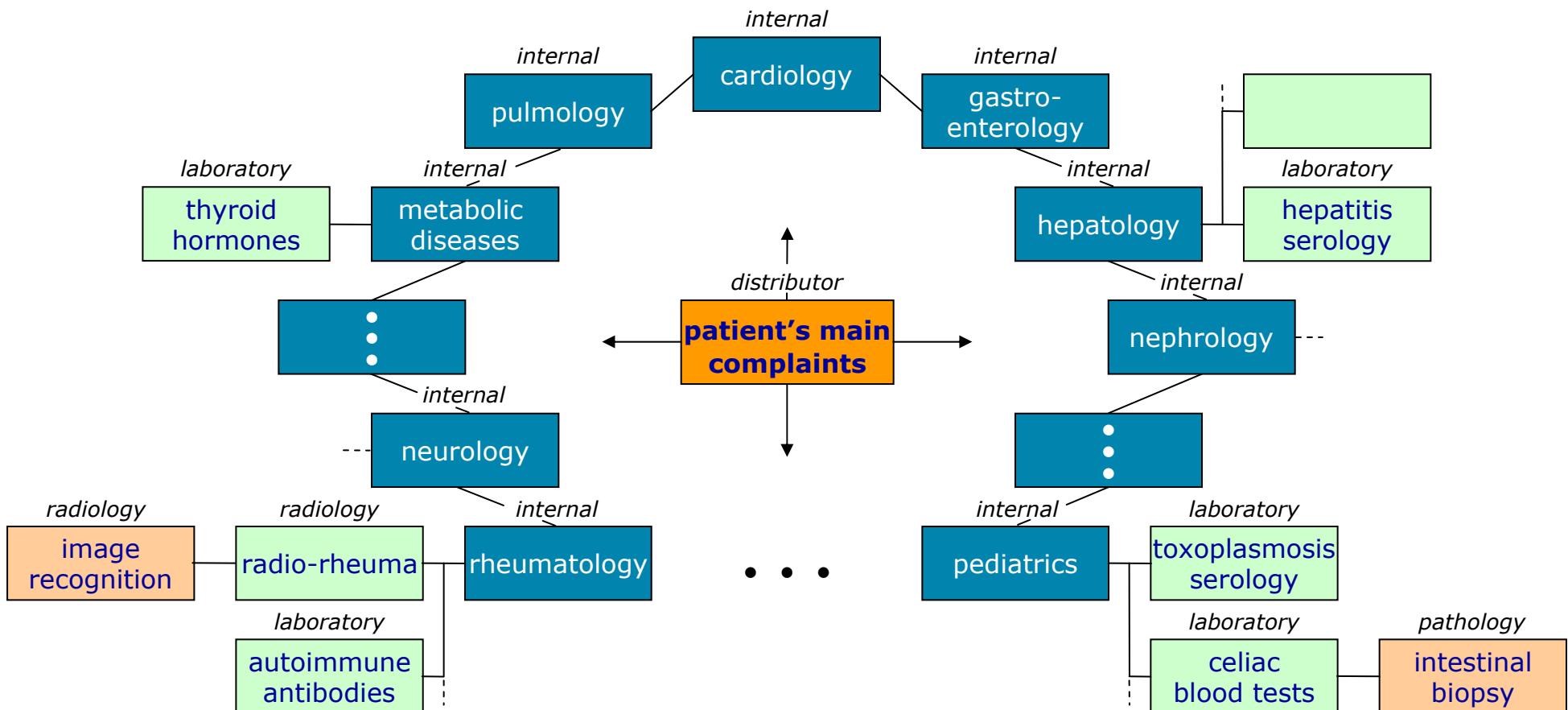
costs / patient / day: EUR 678.-

- nosocomial infections: 4,262 patients / year (rate of 4.5% assumed)
- 213 out of them die / year (5% mortality assumed)
- additional costs of **EUR 14,448,180.-** (5 days of prolonged stay, in average)

source: Prof. Dr. med. Ojan Assadian, Division of Hospital Hygiene, Medical University of Vienna (2002)

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# Cooperating computational intelligence in medicine—as a safety net for health care processes



## Towards a science of clinical medicine

patient's medical data  
and  
healthcare processes  
for  
human processing

≠

patient's medical data  
and  
healthcare processes  
for  
machine processing

observations  
e.g., temperature chart  
skin color (jaundice, livid, ...)  
...  
...

measurements  
e.g., CRP  
color measurement  
...  
...

"Measure what is measurable, and make measurable what is not so."

**Galileo Galilei**  
1564–1642

*Crucial point in clinical medicine:*

"Digitize what is digitizable, and make digitizable what is not so."

**Klaus-Peter Adlassnig**