Andreas Holzinger VO 709.049 Medical Informatics 18.01.2017 11:15-12:45

Lecture 10 Biomedical Information Systems and Knowledge Management

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TU Advance Organizer (1/2)

HCI-KDD :

- Bioinformatics workflow management system = designed specifically to compose and execute a series of computational and/or data manipulation steps and/or workflows in the domain of bioinformatics;
- Business process re-engineering (BPR) = analysis and design of workflows and processes within an organization (=hospital). According to Davenport (1990) a BP is a set of logically related tasks performed to achieve a defined outcome/result:
- Clinical Pathway = aka care map, a tool used to manage the quality in healthcare concerning the standardization of care processes and promote organized and efficient patient care based on EBM;
- Digital Imaging and Communications in Medicine (DICOM) = a standard for handling, storing, printing, and transmitting data in medical imaging (also file format definition and a network communications protocol using TCP/IP):
- Evidence-based medicine (EBM) = aiming at developing mathematical estimates of benefit and harm from population-based research and apply these in the clinical routine, claiming that best research evidence on medical interventions come from experiments (e.g. randomized controlled trials);
- Health Level Seven (HL 7) = a Standardization Organization accredited by the American National Standards Institute (ANSI) to push consensus-based standards representing healthcare stakeholders;

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TU Agenda for today HCI-KDD :

- 00 Reflection follow-up from last lecture
- 01 Information Systems Challenges
- 02 Workflows Clinical Pathways
- 03 Hospital Information Systems (HIS)
- 04 Multimedia: PACS
- 05 Data Standards for Communication
- 06 Open ...
- 07 Conclusion & Future Outlook

Data Interactive Mining

http://hci-kdd.org/international-expert-network

Knowledge Discovery

Visualization

2 Learning Algorithms

Data Prepro-Mapping cessing

GDM (3) Graph-based Data Mining TDM @ Topological Data Mining

EDM S Entropy-based Data Mining

Privacy, Data Protection, Safety and Security

Holzinger, A. 2014. Trends in Interactive Knowledge Discovery for Personalized Medicine: Cognitive Science meets Machine Learning. IEEE Intelligent Informatics Bulletin, 15, (1), 6-14.

TU Advance Organizer (2/2)

Q HCI-KDD -

- Hospital Information System (HIS) = integrated information system for (administrative, financial, clinical etc.) information management in a hospital;
- Integrating Healthcare Enterprise (IHE) = initiative by healthcare professionals and industry to improve the way computer systems in healthcare share information (i.e. promotes the coordinated use of established standards such as DICOM and HL7);
- National Electrical Manufacturers Association (NEMA) = holds copyright of DICOM:
- Paradigm = according to Kuhn (1962) a shared view of a group of researchers, comprising 4 elements: concepts, theories, methods and
- Picture Archiving and Communication System (PACS) =system for handling images from various medical imaging instruments, including ultrasound (US), magnetic resonance (MR), positron emission tomography (PET), computed tomography (CT), endoscopy (ENDO), mammographs (MG) Digital radiography (DR), computed radiography (CR) ophthalmology, etc.;
- Workflow = consists of a sequence of connected steps, succeeding the flow paradigm, where each step follows the precedent;

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Q HCI-KDD-



TU Keywords

- Bioinformatics workflows
- · Clinical workflow & management systems
- Cloud computing in healthcare
- Communication standards
- Digital Imaging and Communication in Medicine (DICOM)
- Formal methods & workflow modeling
- Health Level 7 (HL7)
- Logical Observation Identifier Names and Codes (LOINC)
- Medical multimedia
- Mobile computing in medicine
- Personal Health Record (PHR)
- Picture Archiving and Communication System (PACS)
- Software as a Service (SaaS)
- Systems architecture
- Unified Modeling Language (UML)

TU Learning Goals: At the end of this 10th lecture you ...

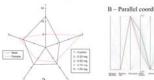
HCI-KDD -

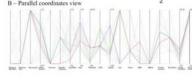
HCI-KDD &

- have an overview about workflows and workflow modeling in health care;
- got an overview of typical architectures of hospital information systems for patient records as already discussed in lecture 4;
- have understood the principles of Picture Archiving and Communication PACS-Systems;
- know how important multimedia for medicine is:
- have a basic understanding of DICOM and HL 7;
- are aware of the constraints of open source software in the medical domain:
- have got an idea of possible future systems solutions;

TU Warm-up Quiz Q HCI-KDD-















Dimension b

(b) Dims b & c

TU Unsolved: Data Integration, Data Fusion, Data Mapping

⊕HCI-KDD /

01 Information Systems Challenges

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Distributed Information Processing

between distributed computations in



How to combine these different data types together to obtain a unified view of the activity in the cell is one of the major challenges of systems biology

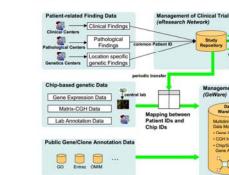


Navlakha, S. & Bar-Joseph, Z. 2014. Distributed information processing in biological and computational systems. *Commun. ACM*, 58, 11, 94-102, doi:10.1145/2678280.

TU Example Data Integration Architecture

PHCI-KDD ☆

HCI-KDD :



Kirsten, T., Lange, J. & Rahm, E. 2006. An integrated platform for analyzing molecular-biological data within clinical studies. Current Trends in Database Technology–EDBT 2006. Heidelberg: Springer, pp. 399-410, doi:10.1007/11896548_31.

Goal: Unified View, one single workflow, Workflow continuity,

(a) Dims a & b

Workflow continuity, no media gaps (DE: Medienbruch)

Holzinger, A. & Jurisica, I. 2014. Knowledge Discovery and Data Mining in Biomedical Informatics: The future is in Integrative, Interactive Machine Learning Solutions In: Lecture Notes in Computer Science LNCS 8401. Heidelberg, Berlin: Springer, pp. 1-18, doi:10.1007/978-3-662-43968-5_1.

001.10.1001/376-3-002-45300-3_1.

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TU Not only a problem at cell level ...

HCI-KDD :

(c) Dims a & c

HCI-KDD :

Biomedical data (e.g. clinical trial data *omics data)

Clinical patient data (e.g. EPR, images, lab, reports, medication, etc.)

Weakly structured, highly fragmented, with low integration

Health business data (e.g. costs, utilization, etc.) Private patient data (e.g. AAL, monitoring, sensor data, social network

Manyika, J., Chui, M., Brown, B., Bughin, J., Dobbs, R., Roxburgh, C. & Byers, A. H. (2011) Big data: The next frontier for innovation, competition, and productivity. Washington (DC), McKinsey Global Institute.

TU Slide 10-1 Key Challenges

Lack of Integrated Approaches

Clinical Workplace efficiency

 Cloud Computing (Privacy, Security, Safety, Data Protection...)

 Useful, Useable Service oriented computing (as electricity is already!)

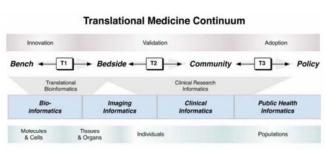
Holzinger, A. & Jurisica, I. 2014. Knowledge Discovery and Data Mining in Biomedical Informatics: The future is in Integrative, Interactive Machine Learning Solutions In: Lecture Notes in Computer Science LNCS 8401. Heidelberg, Berlin: Springer, pp. 1-18, doi:10.1007/978-3-662-43968-5_1.

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TU Translational Health Informatics Continuum

HCI-KDD 1

HCI-KDD 1



Biomedical Informatics Continuum

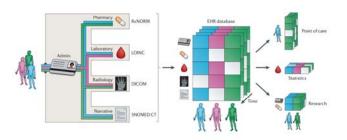
Sarkar, I. 2010. Biomedical informatics and translational medicine. Journal of Translational Medicine, 8, (1), 2-12.

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TU Example: Data Integration via health card

HCI-KDD 1

RxNorm is a US-specific terminology that contains all medications available on the US market, part of UMLS.



Jensen, P. B., Jensen, L. J. & Brunak, S. 2012. Mining electronic health records: towards better research applications and clinical care. Nature Reviews Genetics, 13, (6), 395-405.

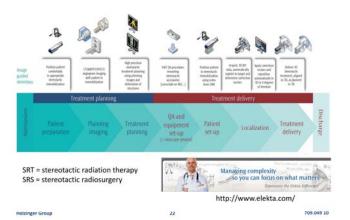
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Zhong, N., Yau, S. S., Ma, J., Shimojo, S., Just, M., Hu, B., Wang, G., Oiwa, K. & Anzai, Y. 2015. Brain Informatics-Based Big Data and the Wisdom Web of Things. Intelligent Systems, IEEE, 30, (5), 2-7.

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Tylide 10-2 Typical Workflow in a hospital: Example Radiology

HCI-KDD 1



TU Slide 10-5 Workflow modeling in a nutshell

HCI-KDD :

- Workflow modeling is the process of <u>simplifying</u> the real-world;
- Modeling is based on facts gathered during <u>observations</u> and we need to accept that this representation can never be perfect;
- Expectations from a model should be <u>limited</u> to the intentions with which it is designed for, be it problem solving or understanding of system intricacies (=elaborately complex details);

Malhotra, S., Jordan, D., Shortliffe, E. & Patel, V. L. (2007) Workflow modeling in critical care: Piecing together your own puzzle. *Journal of Biomedical Informatics*, 40, 2, 81-92.

02 Clinical Pathways and Workflows

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TU Slide 10-3 Workflow > Interaction > Decision > Action

HCI-KDD 1



Colaert (2010): The Pain Points in Health Care and the Semantic Web, Advanced Clinical Application Research Group, Agfa HealthCare

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TU Slide 10-6 Example: Formal workflow modeling 1/2

HCI-KDD 1

- A workflow is defined as a process that contains tasks T, and the respective rules on how those tasks are executed:
- Workflow W:= (T, P, C, A, S₀) where
 - $T = \{T_1, T_2, ... T_m\}$ A set of tasks, $m \ge 1$
 - P = (p_{ii})_{m × m} Precedence matrix of the task set
 - C = (c_{ii})_{m × m} Conflict matrix of the task set
 - A = (A(T₁), A(T₂), ...,A(T_m)) Pre-Condition set for each task
 - $S_0 \in \{0, 1, 2, 3\}_m$ is the initial state

J. Wang, D. Rosca, W. Tepfenhart & A. Milewski (2006) Dynamic Workflow Modeling and Analysis, Monmouth University

Acute Coronary Syndrome pathway

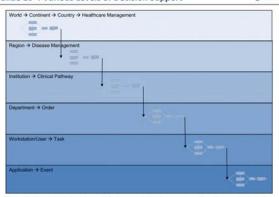


http://www3.gehealthcare.co.uk/~/media/images/specialty/cardiology/acute-caronary-syndrome-pathway.jpg

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TU Slide 10-4 Various Levels of Decision Support

HCI-KDD 1

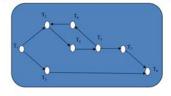


Colaert (2010): The Pain Points in Health Care and the Semantic Web, Advanced Clinical Application Research Group, Agfa HealthCare

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TU Slide 10-7 Example: Formal workflow modeling 2/2

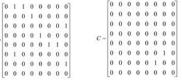
HCI-KDD 1



$$\begin{split} &A(T_1) = \emptyset, A(T_2) = \{\{T_1\}, \{T_6\}\}, A(T_3) = \{\{T_1\}\}, \\ &A(T_4) = \{\{T_2\}\}, A(T_5) = \{\{T_4\}\}, \\ &A(T_6) = A(T_7) = \{\{T_5\}\}, A(T_8) = \{\{T_3, T_7\}\}. \end{split}$$

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 $T = \{T_1, T_2, ..., T_8\},\$



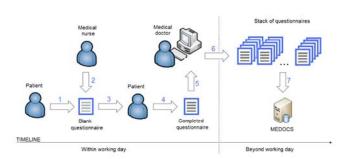
J. Wang, D. Rosca, W. Tepfenhart & A. Milewski (2006) Dynamic Workflow Modeling and Analysis, Monmouth University

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Holzinger, A., Dorner, S., Födinger, M., Valdez, A. C. & Ziefle, M. (2010) Chances of Increasing Youth Health Awareness through Mobile Wellness Applications. In: Lecture Notes in Computer Science (LNCS 6389). Berlin, Heidelberg, Springer, 71-81.

TU Slide 10-10 Example Clinical Workflow

HCI-KDD 1



Holzinger, A., Kosec, P., Schwantzer, G., Debevc, M., Hofmann-Wellenhof, R. & Frühauf, J. (2011) Design and Development of a Mobile Computer Application to Reengineer Workflows in the Hospital and the Methodology to evaluate its Effectiveness. Journal of Biomedical Informatics, 44, 6, 968-977.

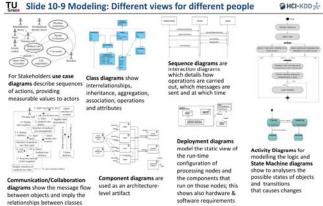
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Bude 10-13 Important: Macrolevel - the view of the Manager

HCI-KDD 1

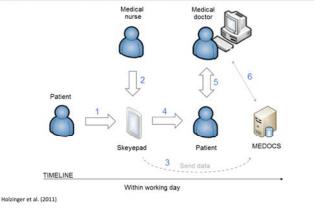
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Arcatt Patienten/Tag	. 30	30	Kosten Personal Entwicklung	€ 28.000
Zermedarf pro Fragebogen in min.	10	7	Investigation pro Geran	€1,500
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Jahreskosten Personal	€ 55,000	€ 10.625	Kosten Geräte	€ 3.200
evaluation and evaluation of the second	-	-	Summe Entwicklungskosten	€ 31.200
mit MoCoMed (Szenario 2)			Kosten pro Personermonat Wartung und Betrieb	€4.000
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Gesamtkosten McCoMediJahr	€ 9.800	€ 9.800		
Jahreskosten TOTAL	€ 17.675	€ 13.838		
Erpebnis				
Logitomia		Scheedenaft bow		
Eingebendes Personal	Acre	Schalter .		
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Einsparungspotential/Jahr in Std. unter den oa. Annahmen:	848	147		

Holzinger, A., Kosec, P., Schwantzer, G., Debevc, M., Hofmann-Wellenhof, R. & Frühauf, J. (2011) Design and Development of a Mobile Computer Application to Reengineer Workflows in the Hospital and the Methodology to evaluate its Effectiveness. Journal of Biomedical Informatics, 44, 6, 968-977.



Juan, Y. C., Ma, C. M. & Chen, H. M. (2005) Applying UML to the development of medical care process management system for nursing home residents. International Journal of Electronic Business Management, 3, 4, 322-330.

TU Slide 10-11 Example: WF-Optimization with mobile comp HCI-KDD :



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TU Slide 10-14 MoCoMED-Graz in operation

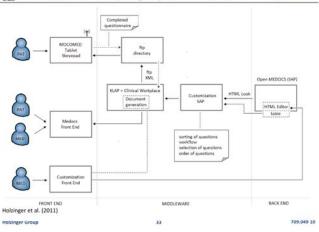
HCI-KDD 1





TU Slide 10-12 Mobile Computing Project MoCoMed-Graz

HCI-KDD :



TU Slide 10-15 MoCoMedGraz Project - Benefit Summary

HCI-KDD 1

- This project was evaluated from a three level perspective: patients - doctors - managers
- Theoretical Background: Bronfenbrenner model
- Project demonstrates how both workflows and information quality can be optimized;
- thereby raising both medical quality and patient empowerment;
- Success factors for applications within the hospital include: simplicity, usability, reliability

Holzinger, A., Kosec, P., Schwantzer, G., Debevc, M., Hofmann-Wellenhof, R. & Frühauf, J. (2011) Design and Development of a Mobile Computer Application to Reengineer Workflows in the Hospital and the Methodology to evaluate its Effectiveness. Journal of Biomedical Informatics, 44, 6, 968-977.

HCI-KDD -

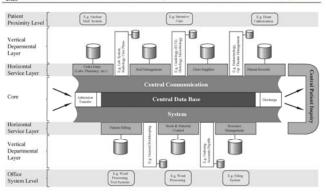
- A data-driven procedure consisting of one or more transformation processes -> nodes;
- Can be represented as a directed graph;
 - Direction is time i.e. the order of transformations;
 - A set of transformation rules;
- The data flow origins from a source to a destination (or result) via a series of data manipulations;
- The specification is designed in a Workflow Design System (modeling component) and then run by a Workflow Management System (execution component).

Hasan, S., Daugelat, S., Rao, P. S. S. & Schreiber, M. (2006) Prioritizing genomic drug targets in pathogens: application to Mycobacterium tuberculosis. PLoS Computational Biology, 2, 6, e61.

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Tulide 10-18 Remember: Classic Conceptual Model of a HIS

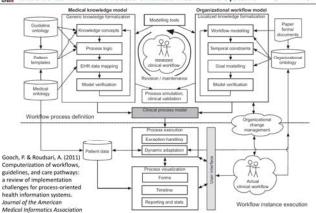
HCI-KDD :



Reichertz, P. L. (2006) Hospital information systems - Past, present, future. International Journal of Medical Informatics, 75, 3-4, 282-299.

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TU Slide 10-21 Model of Process Oriented Health Info Systems



Def.: WMS = a system that defines, creates and manages the execution of workflows. Its main components include:

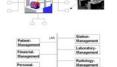
- 1) a graphical interface for composing workflows, entering data, watching execution, displaying results;
- 2) an data archive to store workflow descriptions, results of executions and related traces;
- 3) a registry of available services, either local or remote,
- 4) a scheduler able to invoke services included in the workflow at the appropriate time,
- 5) a set of programming interfaces able to dialogue with remote services,
- 6) a monitor tool for controlling the execution of the
- workflow.
- 7)a set of visualization capabilities for displaying different types of results.

Romano, P. (2008) Automation of in-silico data analysis processes through workflow management systems. Briefings in Bioinformatics, 9, 1, 57-68.

TU Slide 10-19 Architectures of Hospital Information Systems

O HCI-KDD -d-

1970+ "Vertical Approach" - monolithic mainframes Central computer systems mainly for accounting, typical "data processing" ("EDV")



1985+ "Horizontal Approach" - evolutionary systems Departmental clinical information systems, local area networks, distributed systems



Hospital Intranets, electronic patient/health record, mobile computing, "information quality focus"

Holzinger, A. (2002) Basiswissen IT/Informatik Band 1: Informationstechnik. Das Basiswissen für die Informationsgesellschaft des 21. Jahrhunderts. Wuerzburg, Vogel Buchverlag.

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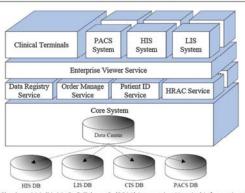
Q HCI-KDD-5-

Multimedia Data in the Hospital: PACS

03 **Hospital Information** Systems (HIS)

TU Slide 10-20 Basic architecture of a standard HIS

HCI-KDD :



El Azami, I., Cherkaoui Malki, M. O. & Tahon, C. (2011) Integrating Hospital Information Systems in Healthcare Institutions: A Mediation Architecture. Journal of Medical Systems, (in print), 1-12.

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TU Slide 10-22 Multimedia throughout the Hospital

HCI-KDD :



Bellon, E., Feron, M., Deprez, T., Reynders, R. & Van den Bosch, B. (2011) Trends in PACS architecture. European Journal of Radiology, 78, 2, 199-204.

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O HCI-KDD -d-

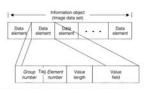
Huang, H. K. (2011) Short history of PACS (USA). European Journal of Radiology, 78, 2, 163-176.

TU HCI-KDD :

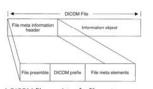
05 **Data Standards for Communication and** Representation

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Bude 10-28 DICOM Object containing multiple data elements



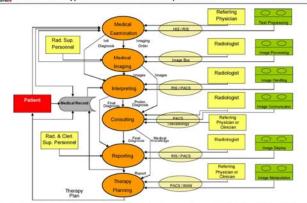
Each data element is uniquely identified by its corresponding tag composed of a group number and an element number. Pixel data of the image is stored in element 0010 within group 7FE0.



HCI-KDD :

A DICOM file consists of a file metainformation header and an information object (image data set). The file meta-information header is made of a file preamble, a DICOM prefix, and multiple file meta-elements.

Wong, A. & Lou, S. L. (2009) Medical Image Archive, Retrieval, and Communication. In: Isaac, N. B. (Ed.) Handbook of Medical Image Processing and Analysis (Second Edition), Burlington, Academic Press, 861-873.



Lemke, H. (2011) Short history of PACS (Europe). European Journal of Radiology, 78, 2, 177-183.

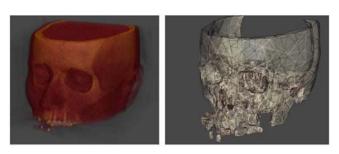
TU Slide 10-26 Data Standards for Comm. & Representation

- DICOM 3.0 Digital Imaging and Communication in Medicine (1993)
 - 1) a set of protocols for network communication;
 - 2) a syntax and semantics for commands and info;
 - 3) a set of media storage services (standard compliant);
- HL 7 Health Level 7
 - 1) HL 7 v2.x messaging protocol, to provide exchange of textual healthcare data between hospital information systems:
 - 2) Reference Implementation Model (RIM) contains data types, classes, state diagrams, use case models, ant terminology to derive domainspecific information models;
 - 3) Clinical Document Architecture (CDA) is a document markup standard to specify structure and semantics of clinical documents in XML;
- LOINC Logical Observation Identifier Names and Codes
 - 1) Laboratory data (e.g. molecular pathology observations used for identification of genetic mutations, tumor genes, gene deletions, etc.
 - 2) Clinical Observations (e.g. non-laboratory diagnostic studies, critical care, nursing measures, patient history, instrument surveys, etc.
 - . 3) Claims attachments (e.g. handles the definition of new LOINC terms and codes to manage claims-related data

Bui, A. A. T. & Taira, R. K. (2010) Medical Imaging Informatics. New York, Heidelberg, London, Springer.

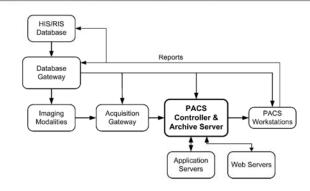
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TU Slide 10-29 DICOM instances allowing the storage of meshes SHCI-KDD &



Lemke, H. U. & Berliner, L. (2011) PACS for surgery and interventional radiology: Features of a Therapy Imaging and Model Management System (TIMMS). European Journal of Radiology, 78, 2, 239-242.

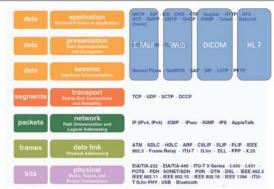
TU Slide 10-25 Generic PACS components and data flow



Huang, H. K. (2011) Short history of PACS (USA). European Journal of Radiology, 78, 2, 163-176.

TU Slide 10-27 DICOM and HL 7

HCI-KDD :



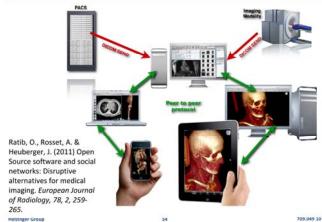
Williams, R. (2011) Network Concepts.

In: An Introduction to Trading in the Financial Markets. San Diego, Academic Press, 201-225.

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TU Slide 10-30 Image distribution workflow

HCI-KDD :



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Result delivered by Dr. Howard H. Hippocrates. The lab test was ordered by Dr. Patricia Primary for patient Eve E. Everywoman. The use case takes place in the US Realm.



Examples: http://www.ringholm.com/docs/04300_en.htm

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TU Slide 10-34 Example: OsiriX integrated RIS-PACS interface

HCI-KDD 1



Faggioni, L., Neri, E., Castellana, C., Caramella, D. & Bartolozzi, C. (2011) The future of PACS in healthcare enterprises. *European Journal of Radiology*, 78, 2, 253-258.

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→ HCI-KDD

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06 Towards Open ...



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TU Slide 10-35 Example: Application of VR in medical imaging SHCI-KDD &



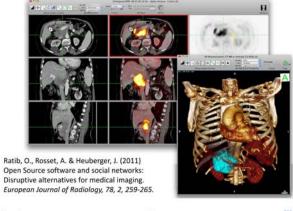
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TU Two historical samples for the success of open data





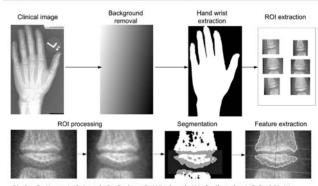
HCI-KDD 1



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TU Slide 10-36 Bone age assessment DSS workflow

HCI-KDD 1



Piętka, E., Kawa, J., Spinczyk, D., Badura, P., Więcławek, W., Czajkowska, J. & Rudzki, M. (2011) Role of radiologists in CAD life-cycle. European Journal of Radiology, 78, 2, 225-233.

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Where do we get the data sets from?

HCI-KDD 1

 Billions of biological data sets are openly available, here only some examples:



- General Repositories:
 - GenBank, EMBL, HMCA, ...
- Specialized by data types:
 - UniProt/SwissProt, MMMP, KEGG, PDB, ...
- Specialized by organism:
 - WormBase, FlyBase, NeuroMorpho, ...
- Details: http://hci-kdd.org/open-data-sets

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Jurisdiction

Silent Silent

Braun, M. L. & Ong, C. S. 2014. Open Science in Machine Learning. Implementing Reproducible Research, 343.

Silent

Silent PR

Holzinger, A. 2010. Process Guide for Students for Interdisciplinary Work in Computer Science/Informatics. Second Edition, Norderstedt, BoD.

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Slide 10-38 Open Source: Legal and regulatory constraints



California

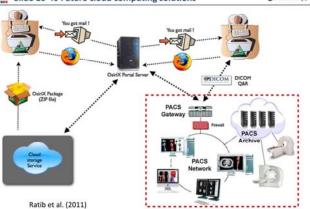
- Attention: Medical certifications such as FDA in the US and CE marking in Europe do not apply to Open Source software;
- These certifications require a legal commercial entity to be identified as the owner of the product and warrant the legal liability of its distribution and commercial support.
- Open Source software being often developed outside commercial enterprises; such as academic groups or university research labs, do not have the proper legal structure to apply for such certifications.
- Also, most Open Source products being distributed free of charge lack the legal binding between the provider and the user that is required for software distribution under FDA and CE certification.

Ratib et al. (2011)

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TU Slide 10-40 Future cloud computing solutions

HCI-KDD 1



Grand Challenges in this area:

- Draduction of Ones Data Sat
- Production of Open Data Sets
- Synthetic data sets for learning algorithm testing
- Privacy preserving machine learning
- Data leak detection
- Data citation
- - Differential privacy
- Anonymization and pseudonymization
- Evaluation and benchmarking

Please visit:

http://hci-kdd.org/privacy-aware-machine-learning-for-data-science/

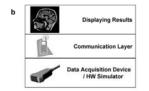
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Conclusion and Future Outlook

TU Slide 10-41 Future System Architecture: Cloud Ultrasound



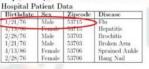


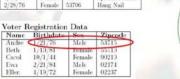


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HCI-KDD 1

Meir, A. & Rubinsky, B. (2009) Distributed Network, Wireless and Cloud Computing Enabled 3-D Ultrasound; a New Medical Technology Paradigm. *Plos One*, 4, 11, e7974. 87 % of the population in the USA can be uniquely re-identified by Zip-Code, Gender and date of birth







Samarati, P. 2001. Protecting respondents identities in microdata release. IEEE Transactions on Knowledge and Data Engineering, 13, (6), 1010-1027, doi:10.1109/69.971193.

Sweeney, L. 2002. Achieving k-anonymity privacy protection using generalization and suppression. International Journal of Uncertainty, Fuzziness and Knowledge-Based Systems, 10, (05), 571-588.

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TU Slide 10-39 Future outlook

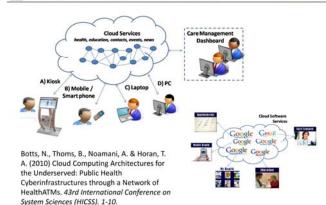
HCI-KDD :

- 1) the world (even the hospital world ;-) of tomorrow will be mobile ...
- 2) the data will be stored in the cloud as well as software-as-a-service will be used (Key problem: Privacy, Security, Safety and Data Protection).
- 3) Search tools will be integrated within the clinical workplace to provide a quick overview first, and then zoom and filter on demand ...
- 4) Integrated ML will enable knowledge discovery with the doctor-in-the-loop ...

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TU Slide 10-42 Future: Software as a Service (SaaS)

HCI-KDD 1



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TU Sample Questions (1)

HCI-KDD 1

- How is a workflow defined?
- How can a workflow be described formally?
- Why is workflow modeling important in health care?
- Please describe the different tools of the Unified Modeling Language (UML) on some medical examples!
- Which benefits can be gained by optimization of workflows?
- Which three stakeholders have which interests within an Hospital?
- Please describe the basic idea of a typical bioinformatics workflow management system!
- What is the difference of system quality versus information quality?
- What are the advantages/disadvantages of the three basic system architecture approaches of hospital information systems?
- Which functional parts does the classic conceptual model of a HIS
- In which aspects does the process-oriented health information systems model differ from the classic conceptual model?
- Please describe the typical workflows within a PACS System?
- What are the typical modalities of a PACS System?

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TU Appendix: Bioinformatics Workflow Management Systems

- BioExtract = for creating and customizing workflows; you can query online sequence data, analyze it using an array of informatics tools, create and share custom workflows for repeated analysis, and save the resulting data and workflows in standardized reports; http://www.bioextract.org
- CellProfiler = onen source modular image analysis software developed at the Broad Institute: algorithms for image analysis; http://www.cellprofiler.org
- Discovery Net = was one of the earliest examples of scientific workflow systems (e-Science project by the Imperial College London), having many features, e.g. chemical compounds represented in the widely used SMILES (Simplified molecular input line entry specification) format can be imported and rendered using three-dimensional representation or the structural formula,
- http://www.computer.org/portal/web/csdl/doi/10.1109/HPDC.2002.1029946
- . Ergatis = to create, run, and monitor reusable computational analysis pipelines, contains pre-built components for common bioinformatics analysis tasks. These components can be arranged graphically to form highly-configurable pipelines. Each analysis component supports multiple output formats, including the Bioinformatic Sequence Markup Language (BSML), http://ergatis.sourceforge.net
- GenePattern = genomic analysis platform that provides access to 150+ tools for gene expression analysis, proteomics. SNP analysis, flow cytometry. RNA-seq analysis as well as standard data processing tasks. A web-based interface provides easy access to these tools and allows the creation of multi-step analysis pipelines that enable reproducible in silico research. http://www.broadinstitute.org/cancer/software/genepattern
- Triana = open source problem solving environment developed at Cardiff University that combines Tradam - pper soul rice process that powerful data analysis tools. Already used by scientists for a range of task such as the state of the sound to the state of source problem solving environment developed at Cardiff University that combines an intuitive visual interface with powerful data analysis tools; http://www.trianacode.org



Thank you!

TU Sample Questions (2)

Q HCI-KDD -

What are the generic PACS components and the respective

- What are the typical advantages/disadvantages of the six PACS implementation models?
- Why are communication standards important for biomedical informatics?
- Please describe the purpose and advantages of DICOM?
- What is the basic idea of HL7?
- Why is open source software problematic in the medical
- What are the advantages/disadvantages of cloud computing
- What are the advantages/disadvantages of the paradigm "Software as a Service"?
- What is an electronic Personal Health Record?
- Which is still the biggest problem of such PHRs?

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TU Some useful links

HCI-KDD :

- http://www.gimias.org/download/sampledata (some useful sample
- https://www.biomedtown.org/biomed_town/MSV/reception/wikis/Dat a (on-line community open and free to anyone has a professional or educational interest in biomedical research & practice)
- http://rad.usuhs.edu/medpix/index.html (Medical Image Database)
- http://www.incits.org (International Committee for Information Technology Standards)
- http://medical.nema.org (about DICOM)
- http://www.aycan.de/main/lp/dicom-bilder-zum-download.html DICOM examples for download)
- http://www.ringholm.com/docs/04300 en.htm (HL7 Message
- http://www.openehr.org (Open HER good UML examples)
- http://www.sparxsystems.com/uml-tutorial.html (UML 2.0 Tutorial)
- http://www.agilemodeling.com/essays/umlDiagrams.htm (Excellent description of UML diagrams)
- http://www.wfmc.org (Workflow Management Coalition)

Questions

HCI-KDD :

Appendix

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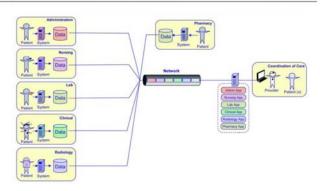
TU Appendix: Open Source in medical imaging

HCI-KDD :





http://www.idoimaging.com

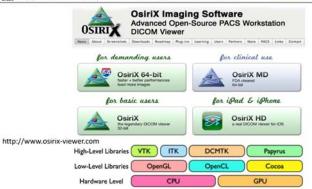


MITRE (2006) Electronic Health Records Overview. McLean (Virginia), National Institutes of Health National Center for Research Resources.

Holzinger Group 82 709.0

TU Appendix: OsiriX Open Source component architecture

HCI-KDD :



Rosset, A., Spadola, L. & Ratib, O. (2004) OsiriX: an open-source software for navigating in multidimensional DICOM images. *Journal of Digital Imaging*, 17, 3, 205-216.

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TU Quality - Quality - Quality

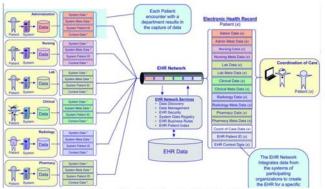
HCI-KDD 1

- Experts consider health IT key for improving efficiency and quality of health care processes.
- Please, carefully determine between:
- Quality of Systems and



- Quality of Data
- Quality of Information
- Quality of Knowledge
- Quality of Action

Chaudhry, B., Wang, J., Wu, S. Y., Maglione, M., Mojica, W., Roth, E., Morton, S. C. & Shekelle, P. G. (2006) Systematic review: Impact of health information technology on quality, efficiency, and costs of medical care. *Annals of Internal Medicine*, 144, 10, 742-752.

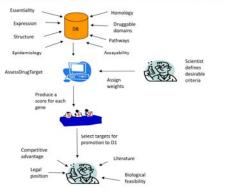


MITRE (2006) Electronic Health Records Overview. McLean (Virginia), National Institutes of Health National Center for Research Resources.

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TU Example: Drug Target Identification

HCI-KDD :



Hasan, S., Daugelat, S., Rao, P. S. S. & Schreiber, M. (2006) Prioritizing genomic drug targets in pathogens: application to Mycobacterium tuberculosis. *PLoS Computational Biology*, 2, 6, e61.

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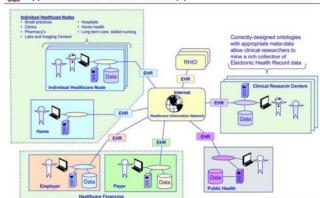
PACS R&D Progress and R&D Topics

HCI-KDD :



 CR = Computed Radiography (vs. Direct Radiography (DR)); MRI = Magnetic resonance imaging; CT = Computed Tomography; US = Ultrasonography; WS = Web services; ACR= American College of Radiology; NEMA = National Electrical Manufacturers Association;

Huang, H. K. (2011) Short history of PACS (USA). European Journal of Radiology, 78, 2, 163-176.



MITRE (2006) Electronic Health Records Overview. McLean (Virginia), National Institutes of Health National Center for Research Resources.

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Bioinformatics Workflow Management System

AHCI-KDD 1/2



http://screencast.g2.bx.psu.edu/pacBio-demo

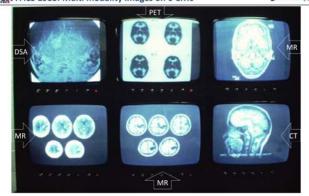
Goecks, J., Nekrutenko, A., Taylor, J. & Team, T. G. (2010) Galaxy: a comprehensive approach for supporting accessible, reproducible, and transparent computational research in the life sciences. Genome Biology, 11, 8, R86.

Blankenberg, D., Kuster, G. V., Coraor, N., Ananda, G., Lazarus, R., Mangan, M., Nekrutenko, A. & Taylor, J. (2010) Galaxy: A Web-Based Genome Analysis Tool for Experimentalists. Current Protocols in Molecular Biology. John Wiley & Sons, Inc.

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Tust PACS 1985: Multi modality images on 6 CRTs

HCI-KDD :



Huang, H. K. (2011) Short history of PACS (USA). European Journal of Radiology, 78, 2, 163-176.

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ASP = application service provider model

Lemke & Berliner (2011)

Huang, H. K. (2011) Short history of PACS (USA). European Journal of Radiology, 78, 2, 163-176.

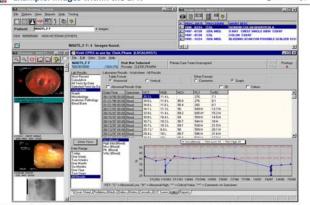
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Therapy Imaging and Model Management System: TIMMS Informatics platform/infrastructure for Model Guided Therapy Therapymaging and Model Management System (TIMMS) Therapymaging and Model Management System (TIMMS) Therapylmaging and Model Management System (TIMMS)

TU Degree of Integration

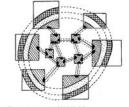
records

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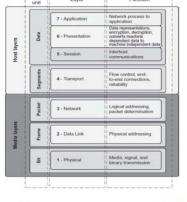
Huang, H. K. (2011) Short history of PACS (USA). European Journal of Radiology, 78, 2, 163-176.

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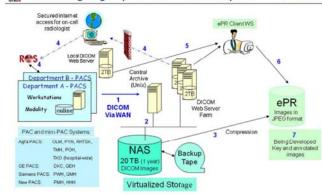


Zimmermann, H. (1980) OSI reference model-The ISO model of architecture for open systems interconnection. *IEEE Transactions on Communications*, 28, 4, 425-432.

Paulsen, K. (2011) Networked Storage. Moving Media Storage Technologies. Boston, Focal Press, 429-467.



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Huang, H. K. (2011) Short history of PACS (USA). European Journal of Radiology, 78, 2, 163-176.

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TU Big Fact: Personal Health Records: Poor Usability

HCI-KDD :

- 300+ different systems in the US
- Only 1% of the US population have access (2008)
- "Most EHR are 100 % bad." (Forrester Research, 2008)
- Biggest obstacles:
- Cost factorsPoor usability
- Need for UCD
- Need for proactive wellness management

Alagoez, F., Valdez, A. C., Wilkowska, W., Ziefle, M., Dorner, S. & Holzinger, A. (2010) From cloud computing to mobile Internet, from user focus to culture and hedonism: The crucible of mobile health care and Wellness applications. 5th International Conference on Pervasive Computing and Applications (ICPCA). IEEE, 38-45.



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