



Machine Learning and Health at NICTA

Architectures and Analytics to Improve Human Performance

Research, business & teaching on application and evaluation of machine learning for health in Australia and Europe



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Researcher, PhD

Machine Learning Research Group

Health Business Team

2010-2 + 2012-5



Australian Government

Department of Broadband, Communications and the Digital Economy

Australian Research Council

NICTA Funding and Supporting Members and Partners



Australian National University



UNSW
THE UNIVERSITY OF NEW SOUTH WALES



NSW
GOVERNMENT Trade & Investment



State Government
Victoria



THE UNIVERSITY OF
MELBOURNE



THE UNIVERSITY OF
SYDNEY



Queensland
Government



Griffith
UNIVERSITY

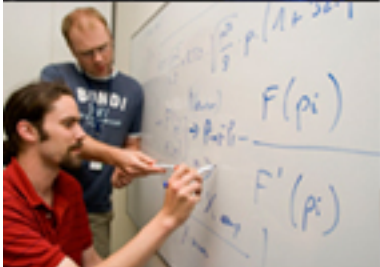


QUT
Queensland University of Technology



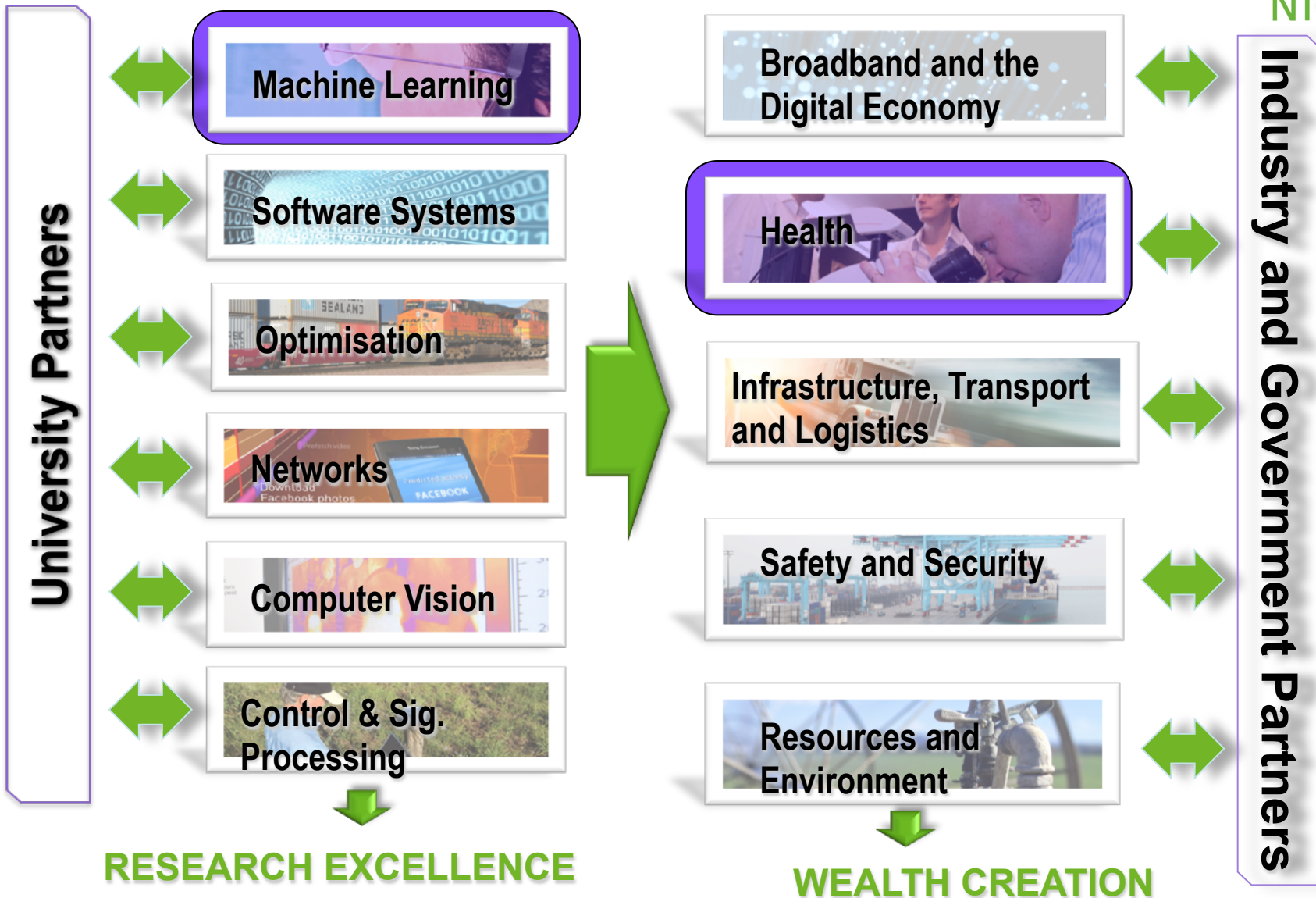
THE UNIVERSITY OF
QUEENSLAND
AUSTRALIA

G'Day Mates from NICTA



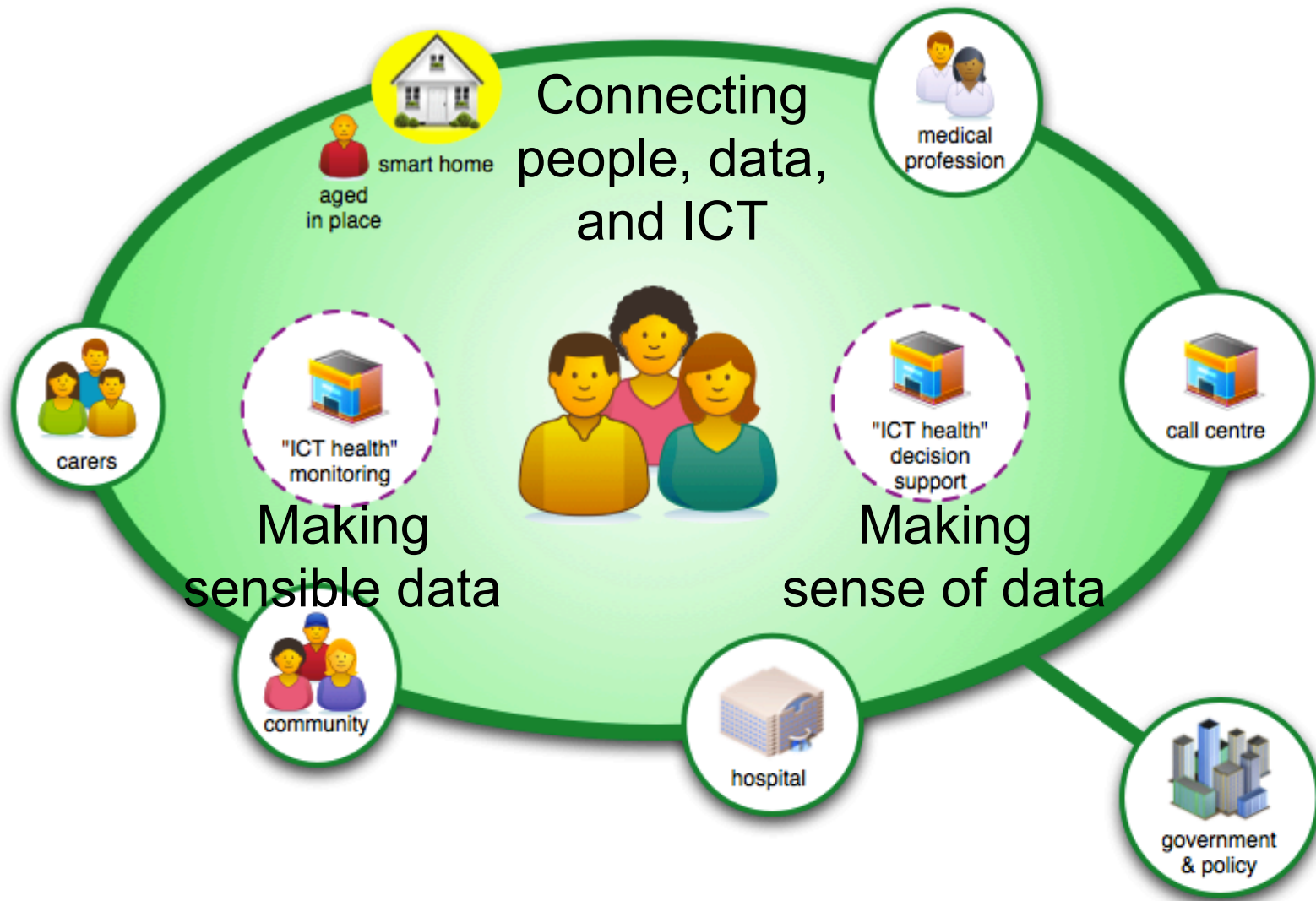
- Australia's National Centre of Excellence in Information and Communications Technology
- Five research labs in Brisbane, Canberra, Melbourne, and Sydney
- 700 staff including 270 PhD students
- Budget: ~\$80M p.a. from Fed and State Govt.
- ~600 research papers/year
- ~100 patents and > 500 patent submissions
- > 190 prizes and awards

Research and Outcomes

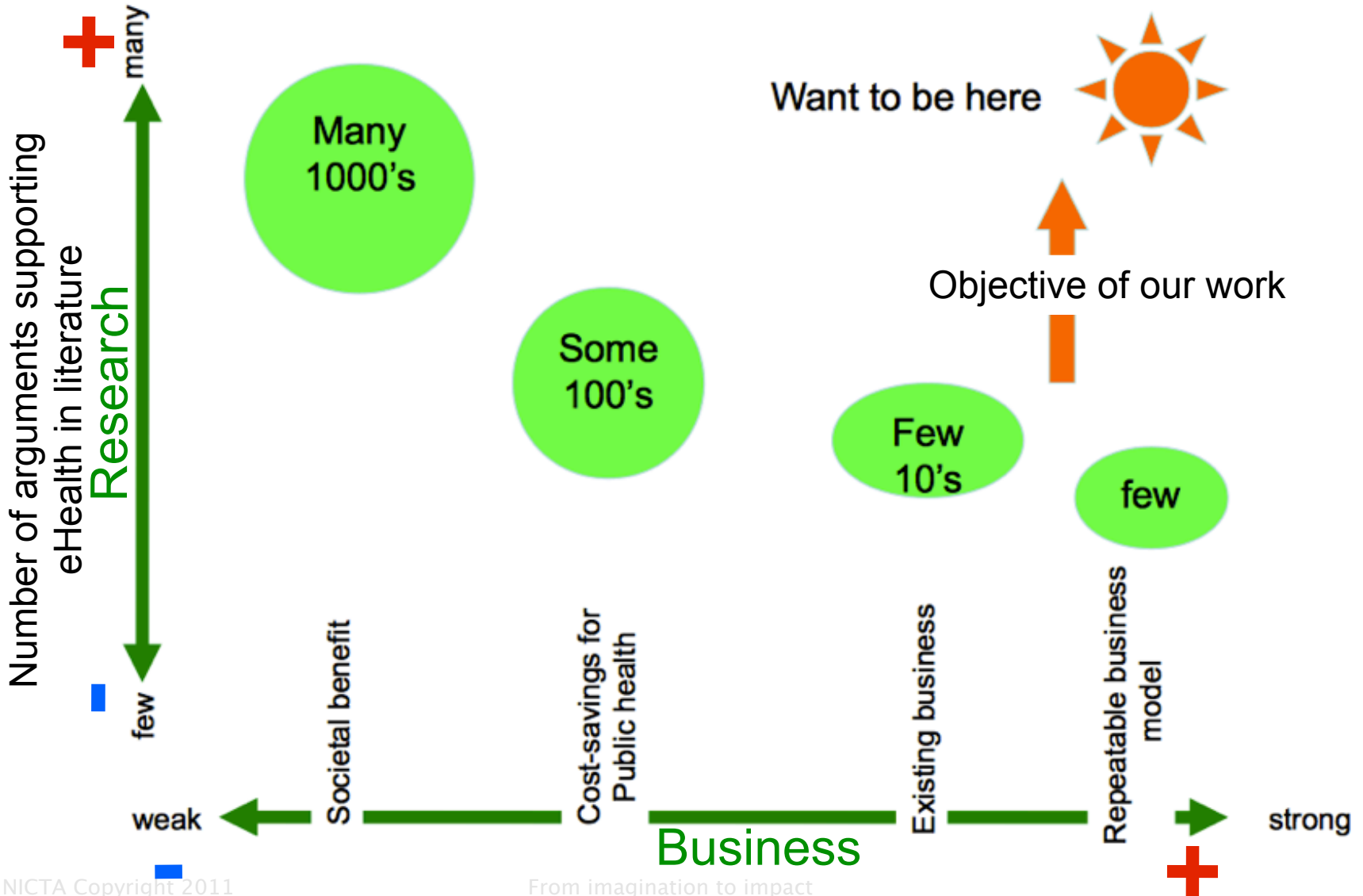


Data and Value Chain are the Key

eHealth is the use of ICT for health. -> Paradigm Shift. WHO



Approach



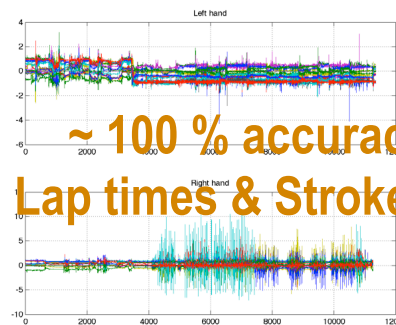
Outcomes

Partnerships



www.ehealthcluster.org.au

Real-life applications



**~ 100 % accuracy in
Lap times & Stroke types**



Text REtrieval Conference (TREC)

...to encourage research in information retrieval from large text collections.

2011 Medical Track

Overview

Frequently Asked Questions

Publications

Data

Information for Active Participants

Past TREC Results

Contact Information



Awards

Research & Commercialisation Grants

Clinical Handover



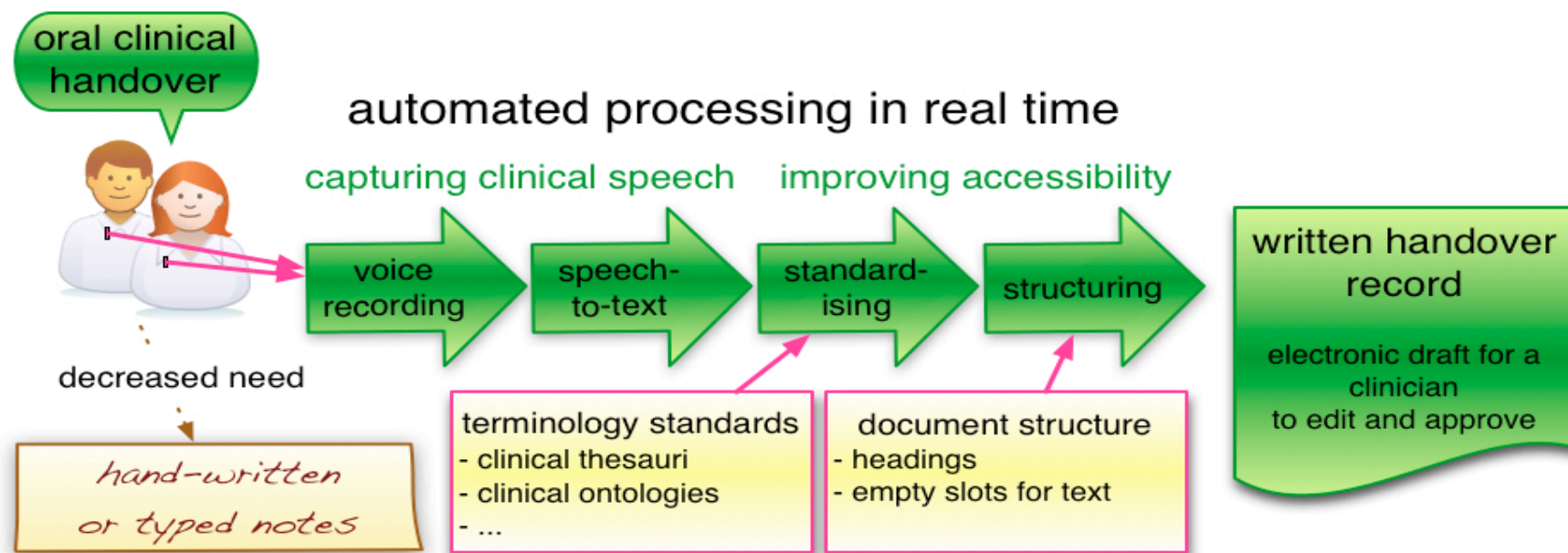
Failures in information flow from clinical handover are:

- The leading cause of sentinel events in the USA
- Associated in Australia with
 - ~ 50% of all adverse events
 - > 10% of preventable adverse events

Verbal handover provides a good picture of patient care.

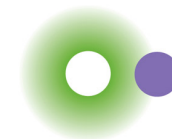
But after 3-5 shifts, this information is lost or transferred incorrectly if notes are not taken or taken by hand.

Let Us Take Notes Automatically via Clinical Speech to Text



The suitability of this structure has been shown by introducing a template to be populated by typing. Its implementation across 4 major teaching hospitals in Sydney is nearing completion.

Example



In **13B** we've got **Dorothy Dickson**. She's an **86** year old **lady**. She came in **acopia** and **acute confusion**. She's got a history of **hypertension**, **non-insulin dependent diabetic**, **obsessive compulsive disorder** and **osteoarthritis**. This lady is on **bd obs**, **her vitals and bd sugar level** and the last reading of **sugar level was 4.9**. She is on **diet control**, **diabetic** and she's written for **Lorazepam prn**. The **vitals are stable** and **she's on a diabetic diet**. **Nil known allergies**. **She has a new IVC IDC**. **Pleasant, cooperative, needs minimal assistance...and she's showering and dressing herself**. But I think we are **preparing her for discharging home** after her **OT kitchen assessment** and **social worker review**.

Name, Age, Gender, DOB, Bed, AMO, Alerts/Risks:

- Dorothy Dickson
- 86 yo.
- female
- Dr: A. Quack
- nil allergies known

Clinical Presentation:

- acute confusion
- difficulty coping at home (? acopia)

Clinical History:

- hypertension
- non-insulin dependent diabetes
- diet controlled diabetes
- obsessive compulsive disorder
- osteoarthritis

Clinical Status:

- [to be filled manually]

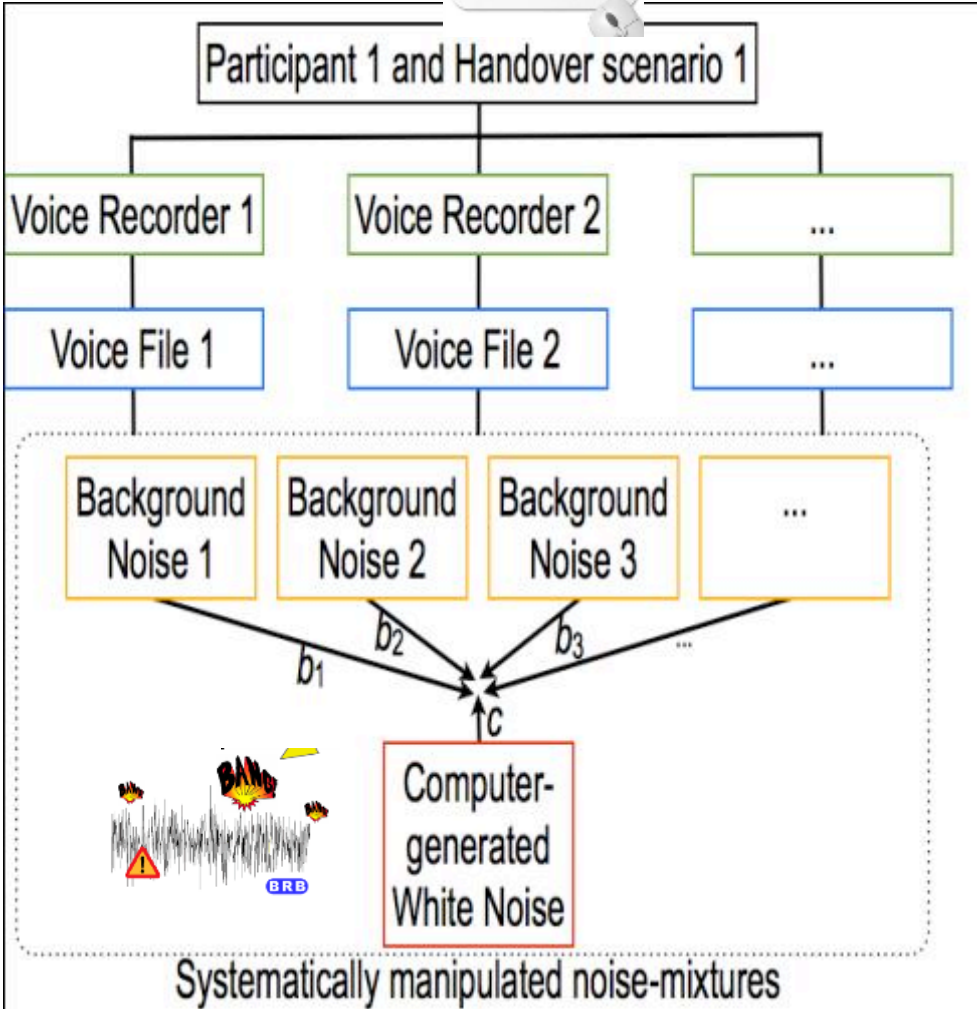
Care Plan:

- bd obs
- bd sugar level
- vitals
- lorazepam prn
- diabetic diet
- new IVC
- new IDC
- pleasant,
- cooperative,
- requires minimal assistance.
- showering self
- dressing self
- preparing for discharge (possible)

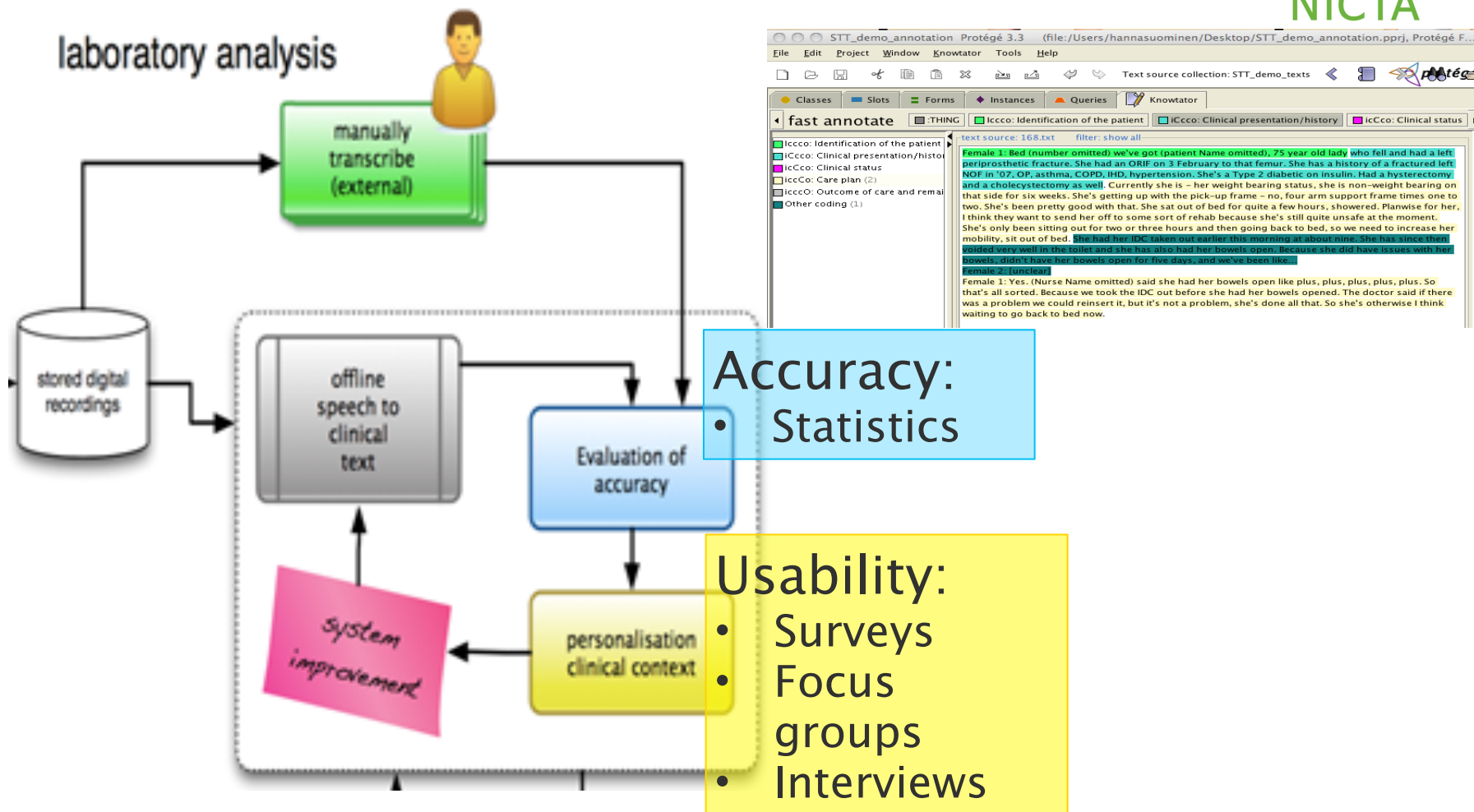
Outcomes and Goals of Care:

- bsl 4.9
- vitals stable
- OT kitchen review
- social worker review

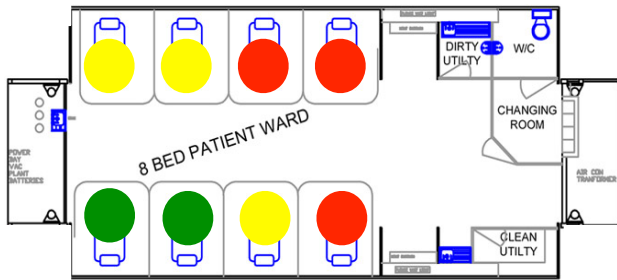
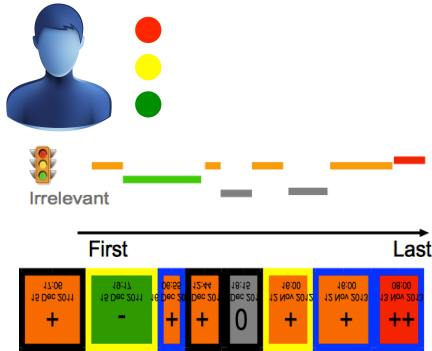
Current Status



Current Status



In-Hospital Surveillance System



You Tube
Broadcast Yourself
<http://youtu.be/TuqQvvFnJSw>

Home | Browse/Edit databases | Create databases | [Logout](#) | User ID: aspergillosis_demo_user

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[Back to query page](#)

Database name: aspergillosis2; Document ID: RMH_101_1_r

Risk Indicator for Patient RMH_101: ; DiagTime!FforNone: [2011, 6, 26, 0, 0, 0]

Reports for the selected patient: RMH_101		Content of the Selected Report: RMH_101_1_r																															
Click a tag below to display a report		Select a tag to highlight important text: <input type="text" value="Mich_grade_3"/>																															
<table border="1"> <tr> <td>ReportType</td> <td>r</td> <td>Hospital_name</td> <td>RMH</td> <td>Patient_ID</td> <td>RMH_101</td> </tr> </table>		ReportType	r	Hospital_name	RMH	Patient_ID	RMH_101	<table border="1"> <tr> <td>Final_report</td> <td>Yes</td> <td>Result_date</td> <td>[2011, 6, 27, 19, 42, 0]</td> </tr> <tr> <td>Result_title</td> <td>CTCHEHI</td> <td>Result_type</td> <td>CT Chest HI Resolution</td> </tr> <tr> <td>Result_status</td> <td>Modified</td> <td>Encounter_info</td> <td>RMH, Inpatient, 23/06/11 - 29/06/11</td> </tr> <tr> <td>Reported_by</td> <td>Dr Marcus Scott</td> <td>Reporting_date</td> <td>[2011, 6, 27]</td> </tr> <tr> <td>Reporting_time</td> <td>[19, 42, 0]</td> <td>Performed_by</td> <td>Contributor_system, PARIS-ALF on 27 June 2011 19:42</td> </tr> <tr> <td>Verified_by</td> <td colspan="3">Contributor_system, PARIS-ALF on 27 June 2011 19:42</td> </tr> </table>		Final_report	Yes	Result_date	[2011, 6, 27, 19, 42, 0]	Result_title	CTCHEHI	Result_type	CT Chest HI Resolution	Result_status	Modified	Encounter_info	RMH, Inpatient, 23/06/11 - 29/06/11	Reported_by	Dr Marcus Scott	Reporting_date	[2011, 6, 27]	Reporting_time	[19, 42, 0]	Performed_by	Contributor_system, PARIS-ALF on 27 June 2011 19:42	Verified_by	Contributor_system, PARIS-ALF on 27 June 2011 19:42		
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Current Performance



288 IFD and 291 control patients from 3 hospitals in Melbourne.

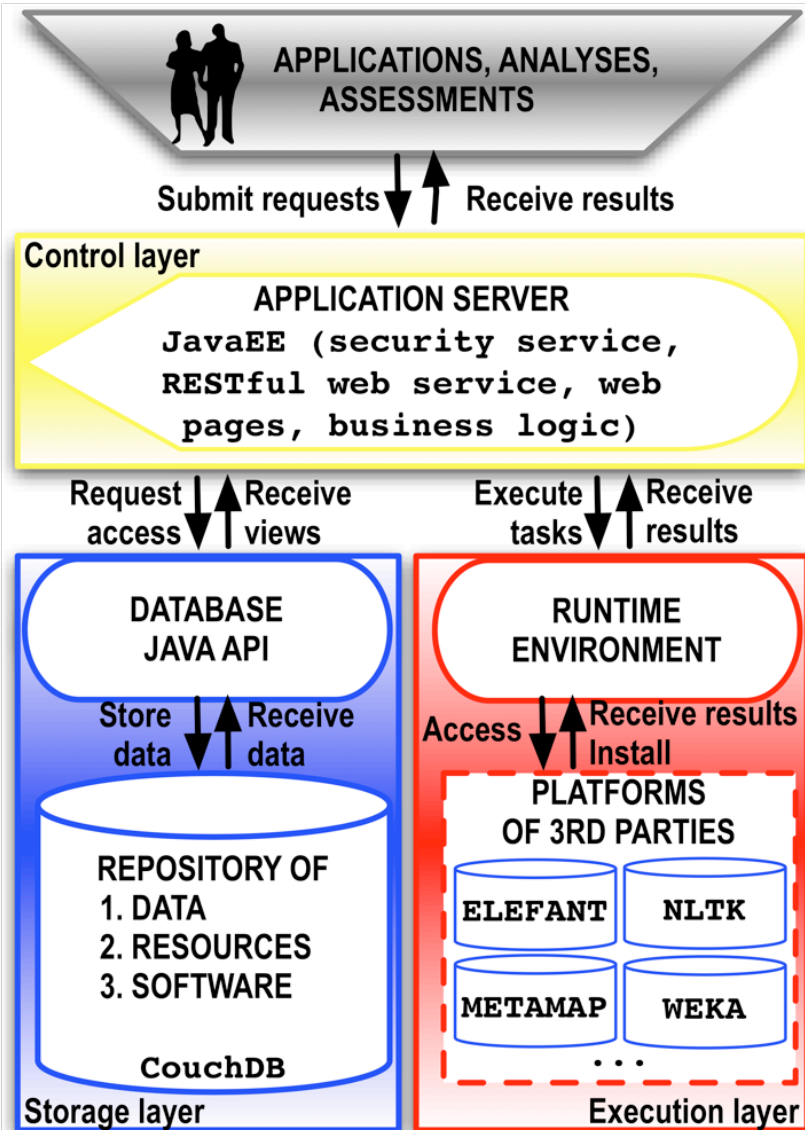
Annotated sample of 73 IFD and 59 control patients.

The expert annotators' agreement over IFD-positive and IFD-negative sentences was 0.64 and 0.58 respectively, using Cohen's kappa.

Level	Sensitivity	Specificity	Positive PV	Negative PV
Report	0.94	0.76	0.83	0.91
Patient	1.0	0.51	0.73	1.0

Table 1. Performance at the report and patient levels. PV = predictive value

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Please select a task.

1. Browse databases

2. Edit databases (Needs special privilege)

2.1 Save multiple web pages from a root URI

2.2 Save one web page from a URI

2.3 Add documents by uploading a bulk file

2.4 Manually create and add a document

2.5 Create a new database

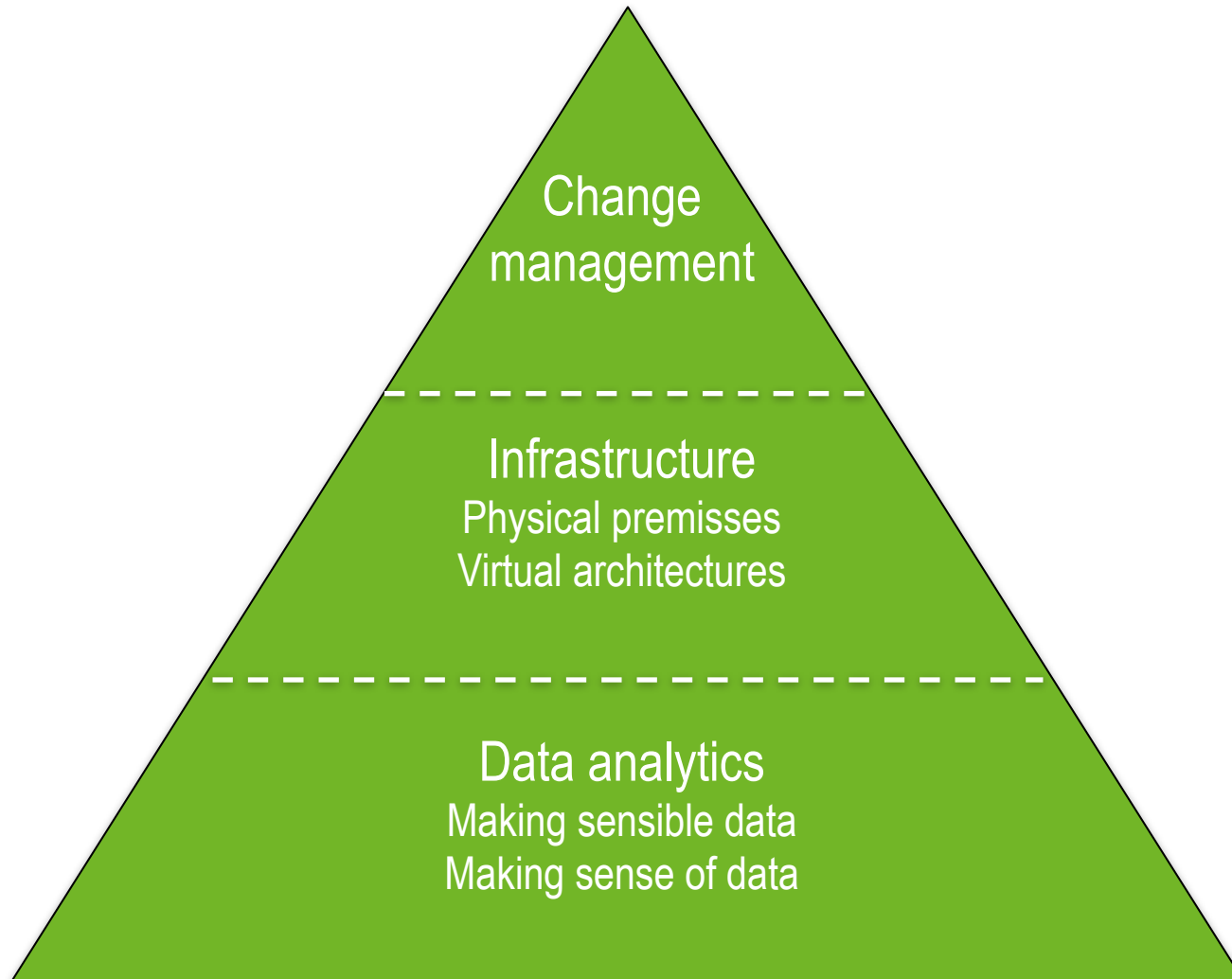
3. Database analysis

4. Patient Report Demo (Needs special privilege)

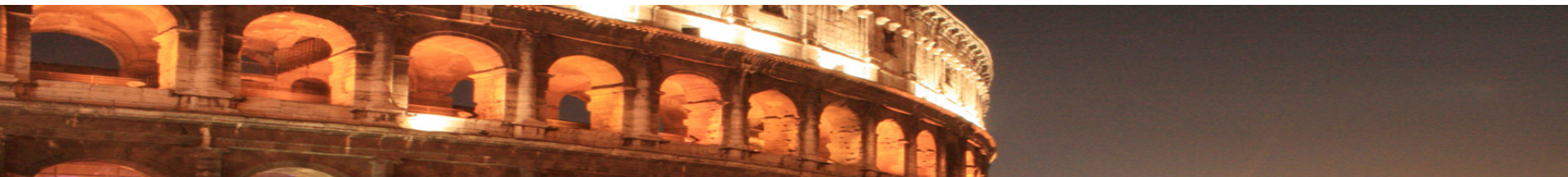
Change password

Log Out

eHealth pyramid



Thank you!



1. Workshop



Rome, Italy; 17-20 Sep 2012

2. Summer School & Workshop



The 4th International Workshop on Health Document Text Mining and Information Analysis
www.nicta.com.au/louhi2013 Sydney, NSW, Australia 11-12 February 2013



6 pp. by 15 Oct 2012
Sydney, NSW; 4-8 + 11-12 Feb 2013

3. Special Issue

