



Recherche dans un entrepôt de données de santé

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Avertissement

Cette présentation n'engage que mon point de vue et ne reflète pas la position de l'AP-HP ou d'une autre institution

Hôpital Européen Georges Pompidou (HEGP)

Ouverture en
2000



HIMMS niveau 6
(<http://www.himss.eu/node/1116>)

Clinical Data Warehouse

Electronic Health Record
(EHR)

Clinical Data Warehouse
(CDW)

Diagnosis
Clinical items
Billing codes
Biology (lab)
Nurse transmission
Imaging reports
Pathology reports
Drug prescription
Chemotherapy

Standardized format
Queryable

Biobank

Radiotherapy

Clinical Data Warehouse at HEGP

Concept	# observations
EHR concepts	176,524,243
Biology (Laboratory)	155,173,140
Nursing transmission	22,001,856
Billing (disease) codes	4,846,602
Rx prescription	91,251,062
Text reports	5,343,224
Imaging reports	1,650,027
Pathology codes	1,434,803

 Unstructured data: transformation is needed before reuse

RGPD

RGPD


Pourquoi les entrepôts ?

- Données de “**vraie vie**”
 - Populations différentes des essais cliniques
 - Populations âgées ou pédiatriques
 - Des problèmes complexes et combinés
- Des données **exhaustives**
 - Nombreuses modalités
 - ***Contextualisées***
- Granularité fine
- ...

Cas d'usage : Phénotypage à haut débit

Research | Open Access

Next generation phenotyping using narrative reports in a rare disease clinical data warehouse

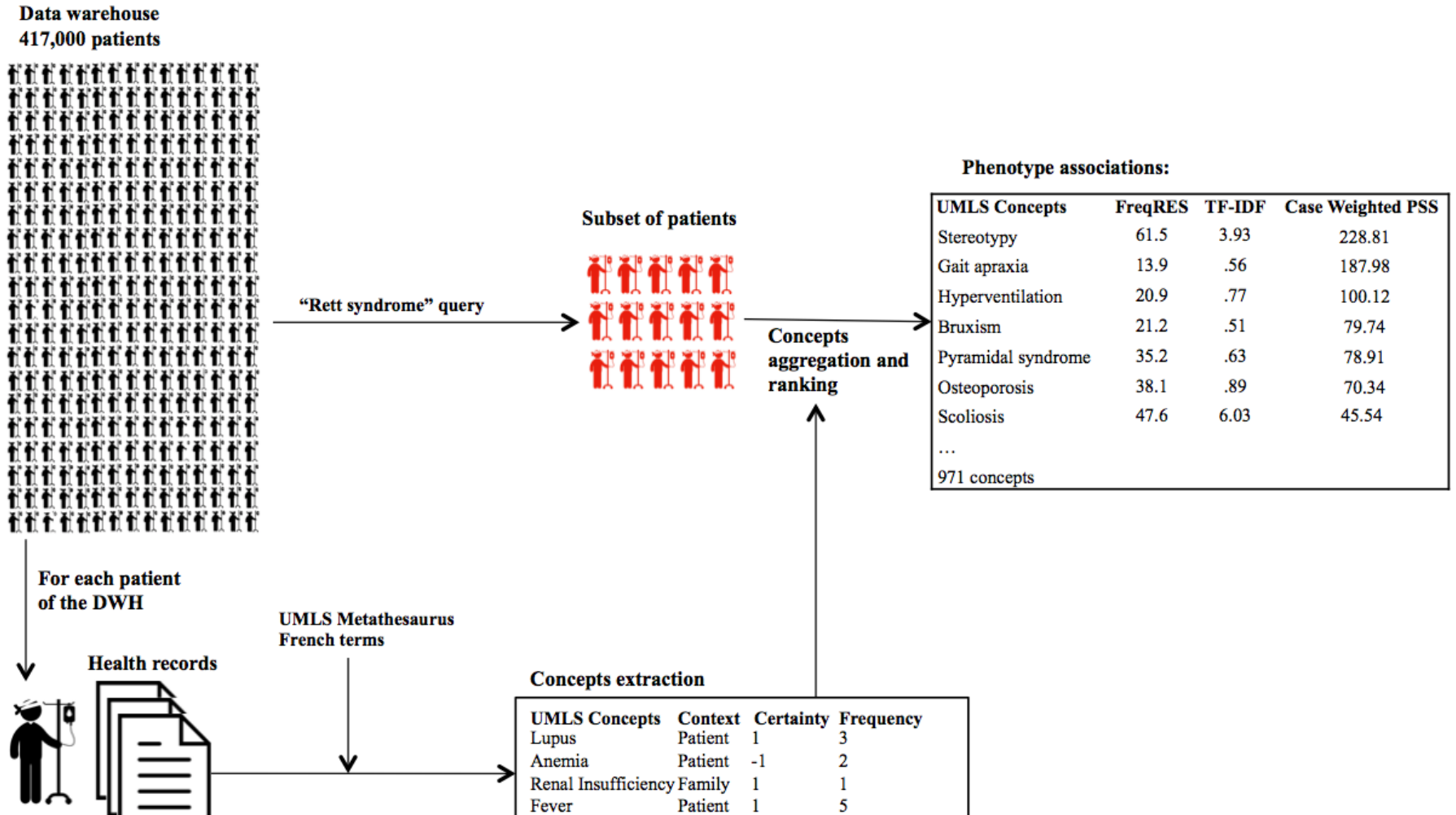
[Nicolas Garcelon](#)  , [Antoine Neuraz](#) , [Rémi Salomon](#) , [Nadia Bahi-Buisson](#) , [Jeanne Amiel](#) , [Capucine Picard](#) , [Nizar Mahlaoui](#) , [Vincent Benoit](#) , [Anita Burgun](#) and [Bastien Rance](#)

Orphanet Journal of Rare Diseases 2018 13:85

<https://doi.org/10.1186/s13023-018-0830-6> | © The Author(s). 2018

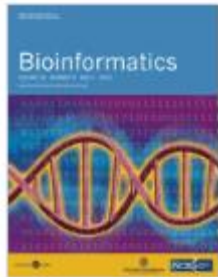
Received: 4 October 2017 | Accepted: 23 May 2018 | Published: 31 May 2018

Cas d'usage : Phénotypage à haut débit



Next generation phenotyping using narrative reports in a rare disease clinical data warehouse. Garcelon et al. *Orphanet Journal of Rare Diseases*

Cas d'usage : PheWAS



Volume 26, Issue 9
1 May 2010

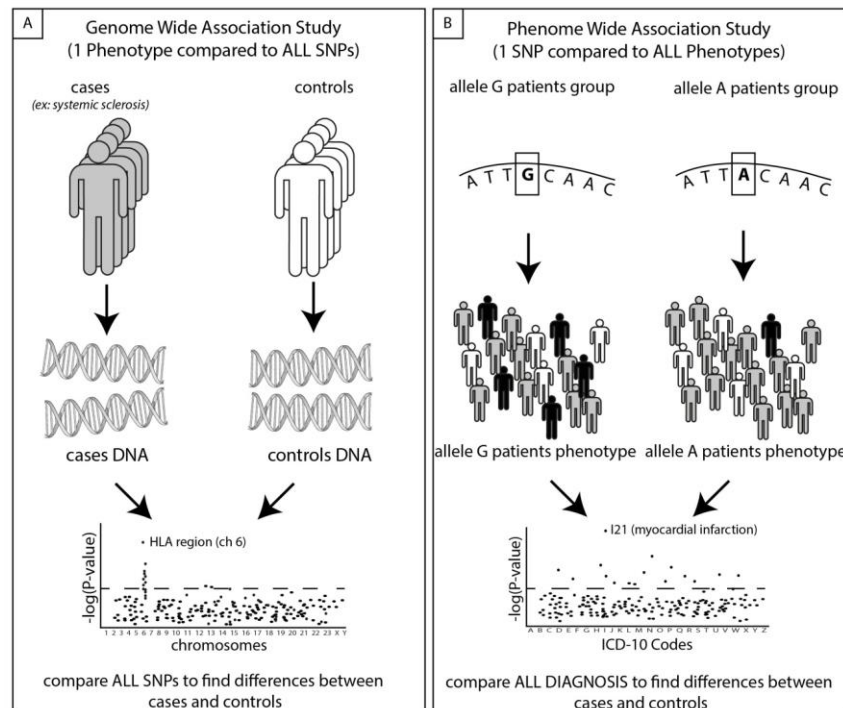
PheWAS: demonstrating the feasibility of a phenome-wide scan to discover gene-disease associations

Joshua C. Denny ✉, Marylyn D. Ritchie, Melissa A. Basford, Jill M. Pulley, Lisa Bastarache, Kristin Brown-Gentry, Deede Wang, Dan R. Masys, Dan M. Roden, Dana C. Crawford

Bioinformatics, Volume 26, Issue 9, 1 May 2010, Pages 1205–1210,

<https://doi.org/10.1093/bioinformatics/btq126>

Published: 24 March 2010 Article history ▼



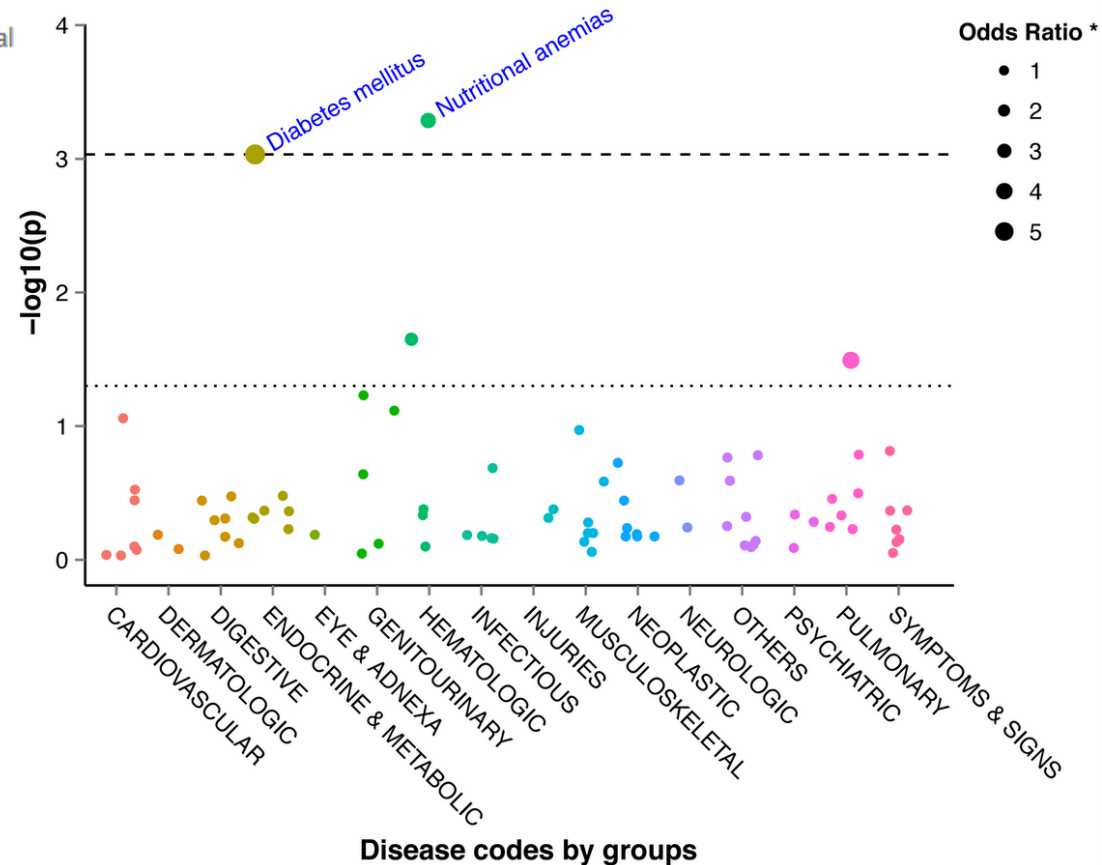
McCarthy et al, Nature Reviews Genetics, 2008 / Denny et al, Bioinformatics 2010

Cas d'usage : PheWAS

Phenome-Wide Association Studies on a Quantitative Trait: Application to TPMT Enzyme Activity and Thiopurine Therapy in Pharmacogenomics

Antoine Neuraz, Laurent Chouchana, Georgia Malamut, Christine Le Beller, Denis Roche, Philippe Beaune, Patrice Degoulet, Anita Burgun, Marie-Anne Lorient, Paul Avillach 

Published: December 26, 2013 • <https://doi.org/10.1371/journal>



Cas d'usage : Études cliniques diverses

Journal of Biomedical Informatics 52 (2014) 28–35



ELSEVIER

Contents lists available at ScienceDirect

Journal of Biomedical Informatics

journal homepage: www.elsevier.com/locate/yjbin



Secondary use of clinical data: The Vanderbilt approach

Ioana Danciu^{a,b,*}, James D. Cowan^a, Melissa Basford^a, Xiaoming Wang^a, Alexander Saip^a, Susan Osgood^a, Jana Shirey-Rice^a, Jacqueline Kirby^a, Paul A. Harris^{a,b}



Since its inception, the SD has provided infrastructure and support for various infrastructure projects that resulted in **87 papers published between 2010 and 2013** [21,23,26,27,32–37,39–42,45–115], with **61 first authors from 18 different departments**

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I. Danciu et al. / Journal of Biomedical Informatics 52 (2014) 28–35

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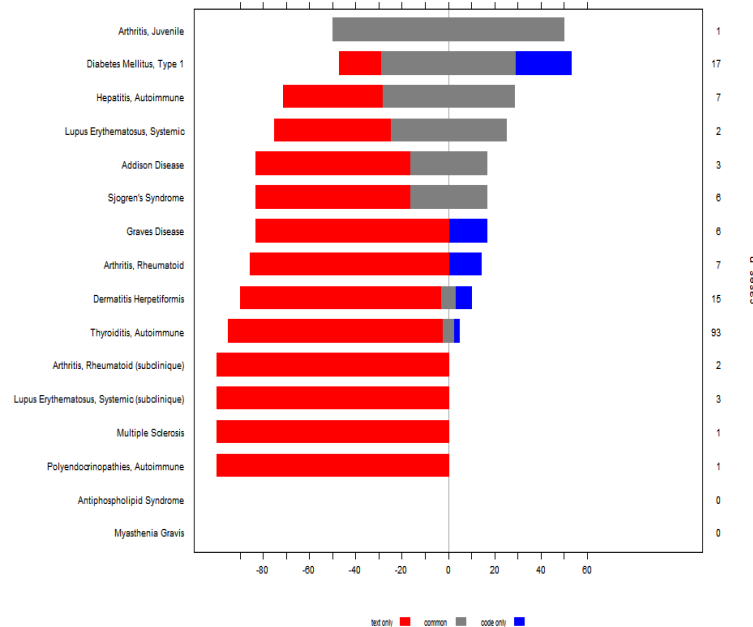
Quelles données dans les entrepôts ?

Des données **très hétérogènes**

- Structurées
 - E.g.:
 - Code diagnostics
 - Code de procédures médicales
- Non-structurées
 - Textes narratifs cliniques (comptes rendus)
 - Imagerie

Les trésors textuels

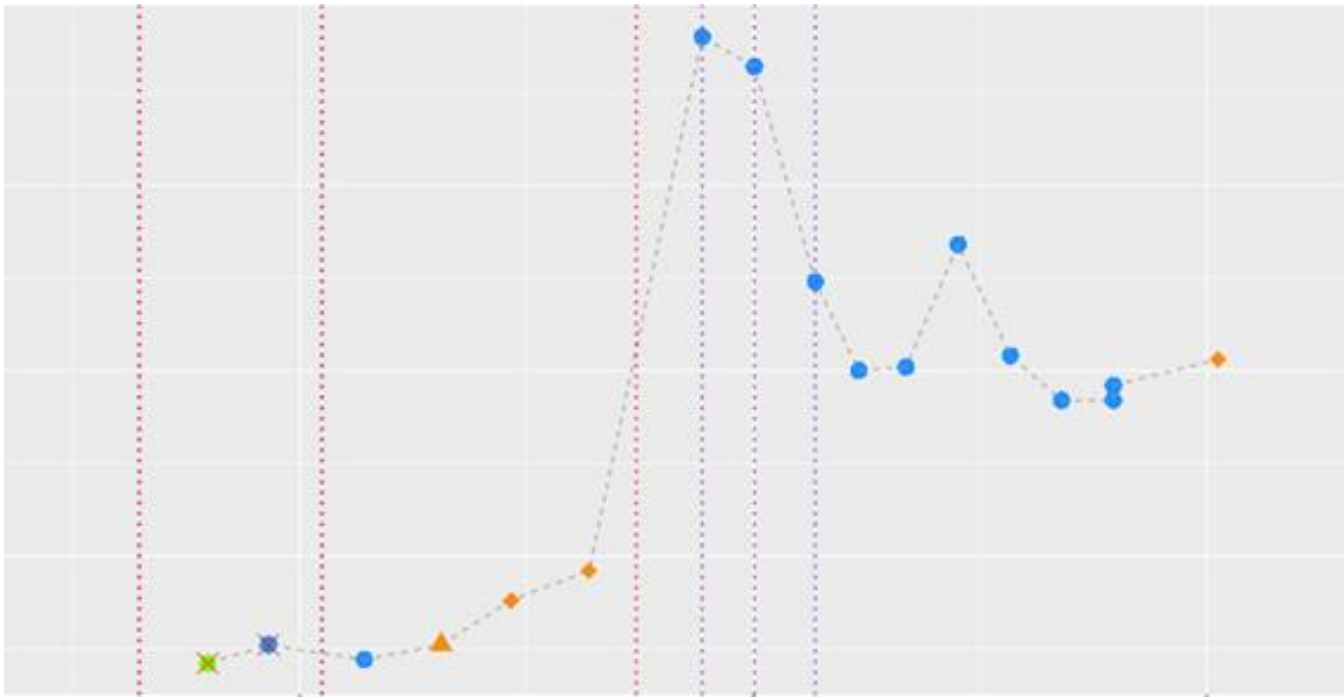
80 à
90%



de l'information médicale est contenue
uniquement dans les textes libres

Séries temporelles

Horodatage de toutes les données



Sémantique du temps : Saisonnalité

“Sens” de la métadonnées (un dosage biologique à 3h du matin \neq dosage à 8h)

Génomiques et environnement



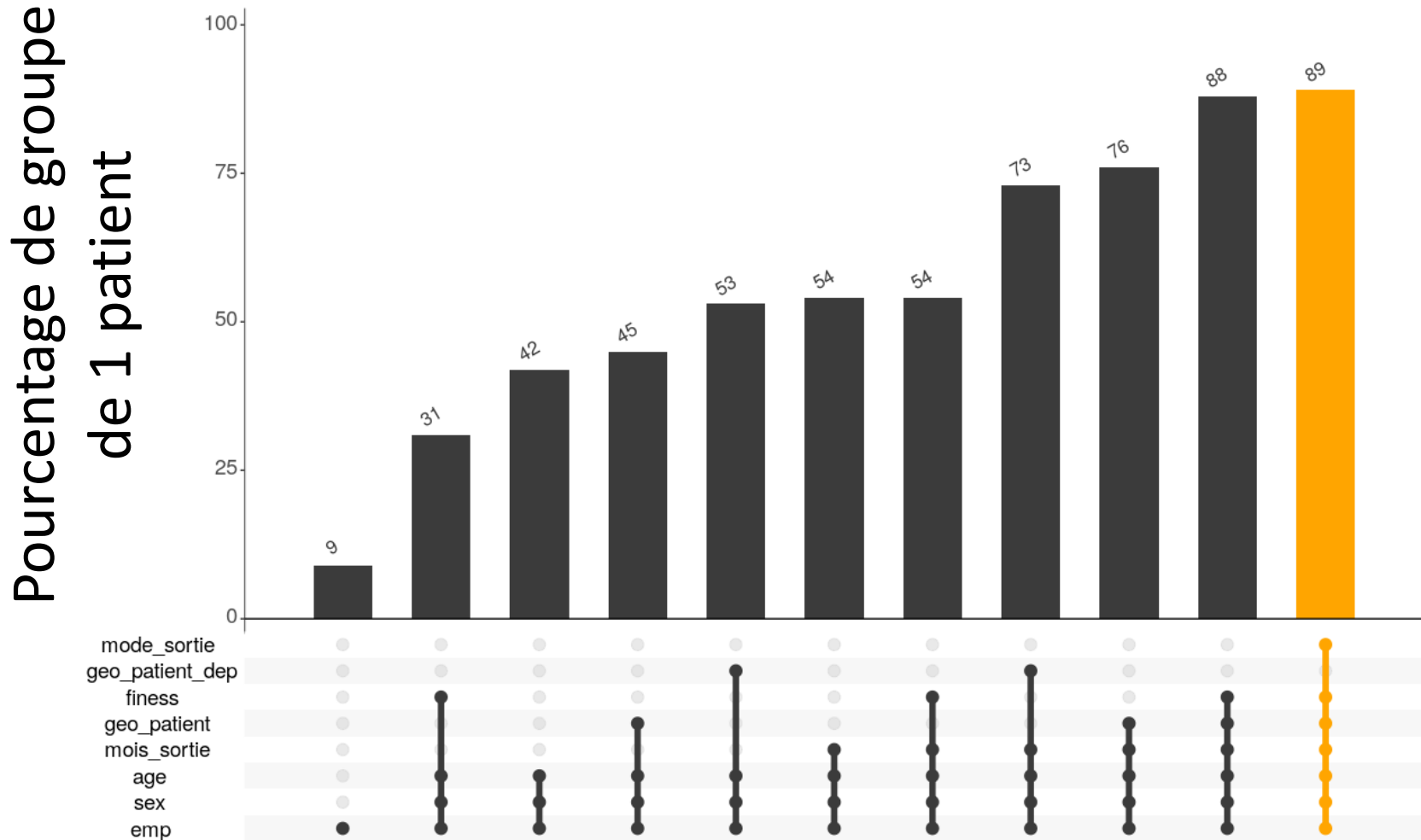
Partiellement ou pas encore dans les entrepôts,
mais probablement indispensable

Exposome - Trajectoires de vie



Partiellement ou pas encore dans les entrepôts,
mais probablement indispensable

L'anonymat dans les bases médicales

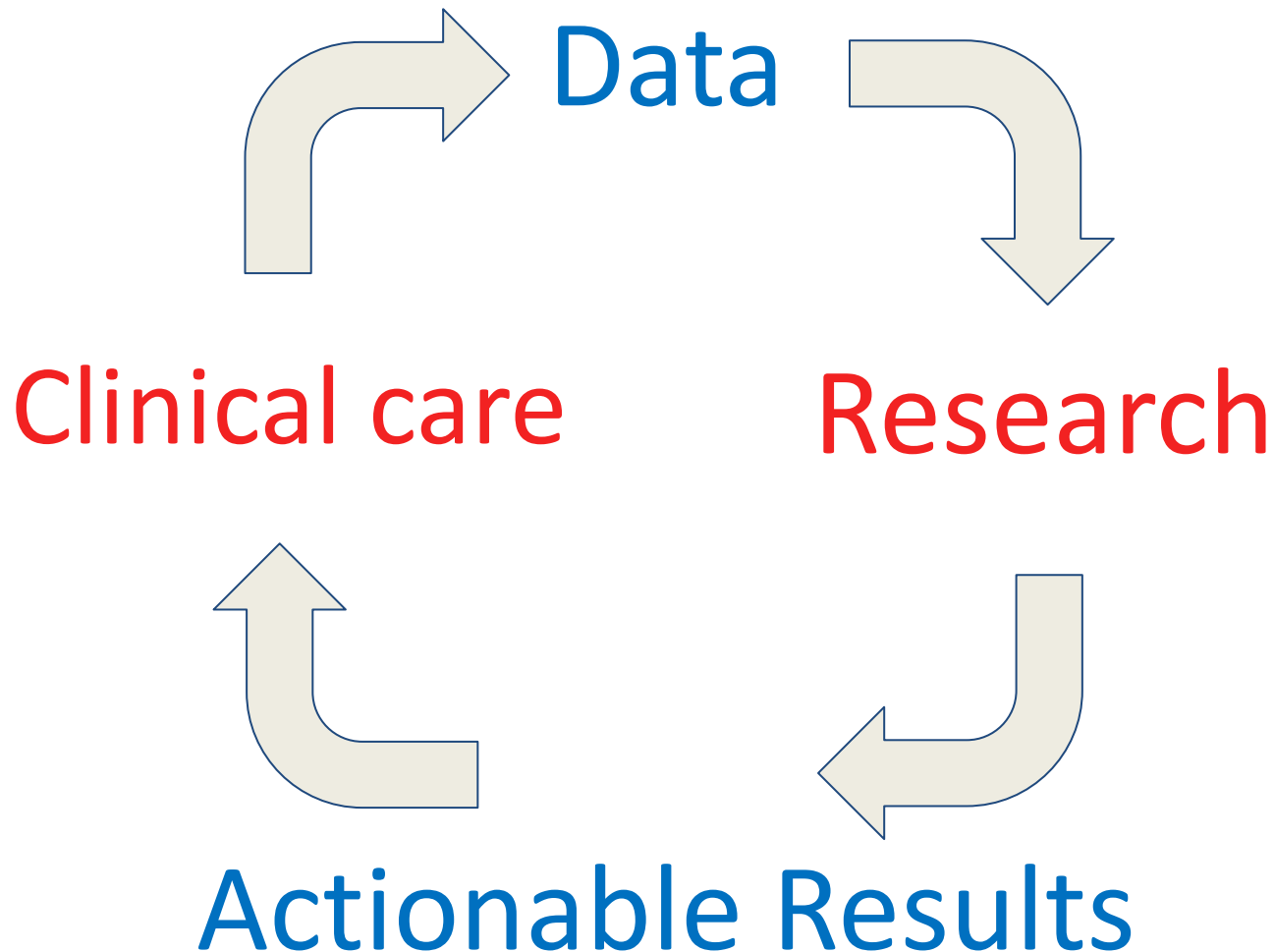


Anonymat du patient dans le PMSI : quel leurre est-il ? Blum D. *EMOIS* 2011

Les limites des entrepôts; besoin du retour aux sources

- Données **incomplètes** et volatiles
 - Besoin de contrôle
- **Hétérogène** dans la qualité
- Contexte pour la validation et **compléter** l'information
- Biais induits par les algorithmes d'extractions

Vers une recherche translationnelle



Vers une recherche translationnelle

- **Porosité** croissante entre soin et recherche
- Découvertes fortuites
- Evolution des connaissances
 - Données figées, mais amélioration des savoirs
- Maladies rares et essais thérapeutiques
 - **Médecine de précision**
 - Stratification des cohortes



Evidence-Based Medicine in the EMR Era

Jennifer Frankovich, M.D., Christopher A. Longhurst, M.D., and Scott M. Sutherland, M.D.

Results of Electronic Search of Patient Medical Records (for a Cohort of 98 Pediatric Patients with Lupus) Focused on Risk Factors for Thrombosis Relevant to Our 13-Year-Old Patient with Systemic Lupus Erythematosus.*

Outcome or Risk Factor	Keywords Used to Conduct Expedited Electronic Search	Prevalence of Thrombosis <i>no./total no (%)</i>	Relative Risk (95% CI)
Outcome — thrombosis	“Thrombus,” “Thrombosis,” “Blood clot”	10/98 (10)	Not applicable
Thrombosis risk factor			
Heavy proteinuria (>2.5 g per deciliter)			
Present at any time	“Nephrosis,” “Nephrotic,” “Proteinuria”	8/36 (22)	7.8 (1.7–50)
Present >60 days	“Urine protein”	7/23 (30)	14.7 (3.3–96)
Pancreatitis	“Pancreatitis,” “Lipase”	5/8 (63)	11.8 (3.8–27)
Antiphospholipid antibodies	“Aspirin”	6/51 (12)	1.0 (0.3–3.7)

« We made the decision on the basis of the best data available »
 « in the light of experience as guided by intelligence. »

Découvertes fortuites et incidentalomes

**Natural language processing of radiology reports
for the detection of thromboembolic diseases and
clinically relevant incidental findings**

Anne-Dominique Pham [†]✉, Aurélie Névéol [†], Thomas Lavergne, Daisuke Yasunaga, Olivier Clément,
Guy Meyer, Rémy Morello and Anita Burgun

BMC Bioinformatics

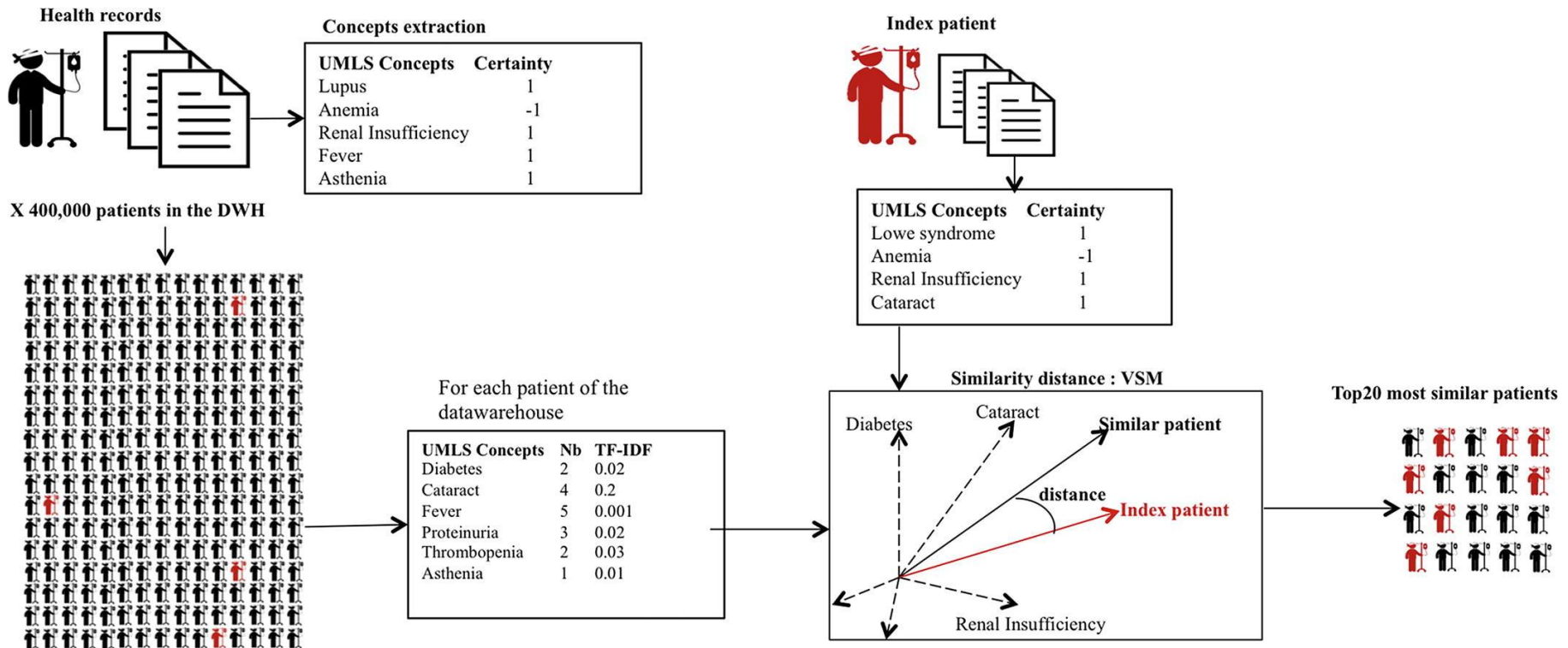
<https://doi.org/10.1186/1471-2105-15-266>



Finding patients using similarity measures in a rare diseases-oriented clinical data warehouse: Dr. Warehouse and the needle in the needle stack



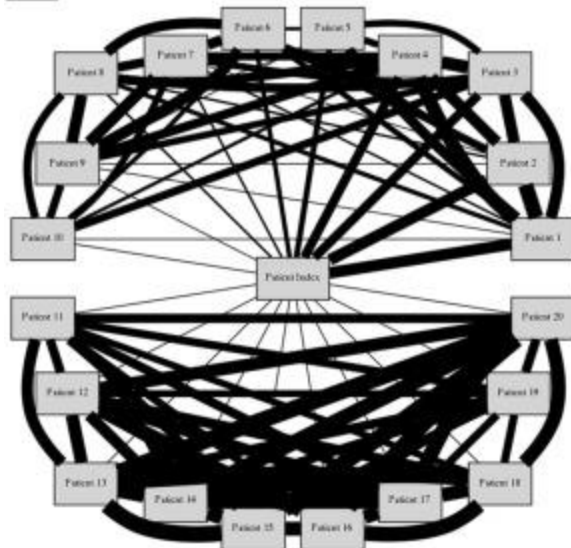
Nicolas Garcelon^{a,b,c,*}, Antoine Neuraz^{c,d}, Vincent Benoit^{a,b}, Rémi Salomon^{a,b,e}, Sven Kracker^{a,b,f}, Felipe Suarez^{a,b,g}, Nadia Bahi-Buisson^{a,b,h}, Smail Hadj-Rabia^{a,b,i}, Alain Fischer^{a,b,j,k,l}, Arnold Munnich^{a,b,m,n}, Anita Burgun^{c,d,o}



Patient F,
47 ans

Documents | Biologie | TimeLine | Parcours | Cohorte | Concepts | Similarité

limiter aux patients avec ces termes dans les comptes rendus : Nb patients :
 Exclure les patients avec ces termes dans les comptes rendus :
 Exclure certains codes UMLS pour le calcul de similarité (Pour évaluation) :
 Nb minimum de concepts par patient : 10
 Limite nombre de patients similaires : 20
 Anonymiser :
 Exclure cette cohorte des résultats :



Patient	Similarité	Concepts communs	Concepts patient
Patient 1 (statut cohorte AP05 : 1) (statut cohorte AP02 : 1) (statut cohorte S01 Incls CEREDH : 1) <input type="button" value="Afficher le comparateur"/>	81	Conjunctivite, Toux, DYSPHAGIE, dyspnee, Fievre, Hyperplasie, deficit immunitaire, Lymphopenie, mycose, Otitis, Douleur, Sinusite, syndrome d'apnee du sommeil, Surtinfection, Sinusite chronique, Larmoiement, Rhinorrhée purulente, syndrome hyper Igm, Adenopathie, Intervention chirurgicale, Gene respiratoire, rhinosinusite, Cicatrice, Recidive	Vegetation, stenose pharyngee , Gaz, Epanchement, Retrait, hypertrophie des amygdales, suppuration, p3k, Thrombus, deficit immunitaire humoral, Psois, Croute, septicemie, dacryocyste, hypertrophie, Observation, obstruction laryngee, Bouton, Respiration, Aphte, tor, Complication, Thrombose, hernie inguinale bilaterale, obstruction chronique des voies aeriennes, nutrition, Stenose laryngee, Oedeme, Hypopnee, vesicule, obstruction nasale bilaterale, Deficit en igt, Agnee, Obstruction, Lésions muqueuses, nodule, SAOS, Circulation collaterale, Douleurs abdominales, adhérence, hypertrophie des végétations adénoïdes, apds, appareil respiratoire
Patient 2 (statut cohorte AP05 : 1) (statut cohorte AP02 : 1) (statut cohorte S01 Incls CEREDH : 1) <input type="button" value="Afficher le comparateur"/>	80	Anorexie, Athénie, dilatation des bronches, rhinite, Infection, Conjunctivite, Toux, Fievre, gastroentérite, cephalées, Hyperplasie, deficit immunitaire, Lymphopenie, Otitis, Douleur, syndrome d'apnee du sommeil, Surtinfection, baisse, Sinusite chronique, Adenopathie cervicale, Tolérance, Ecoulement, Rhinorrhée purulente, syndrome hyper Igm, Adenopathie, Parosinuosé, Rhinorrhée, Cicatrice, Recidive	Eruésie, bruits, Aphte, Hypopnee, J A, bronchite chronique, Ptsis, Toux nocturne, Hypogammaglobulinémie, somnolence diurne, déviation de la cloison nasale, Gastro-entérite aigue, ANEMIE MICROCYTAIRE, Diphtérie, Apnee, 3-4, Anémie, Injection intraveineuse, baisse de l'acuité visuelle, Conjunctivite chronique , Rachi, crispants, deficit de l'immunité humorale, Conjunctivite purulente, pal, lymphoprolifération, erytheme localise, Infections respiratoires, PK3k1, cauchemars, ronflement, Obstruction, Eruésie nocturne, Gynecomastie, hypertrophie, Urgences, endormissement, Epistaxis, Rhinite chronique, pi3k apds , Irritable, bronchite, Agitation, Prise de poids, Toux chronique, Toux d'antcarci, cavite, vomissement, Sueurs nocturnes, SAOS, Frequence cardiaque maximale, sommeil agité, Respiration buccale, Toux peritranche
Patient 3 (statut cohorte S01 Incls CEREDH : 1) (statut rhinite A04A : 1)		Balaieur abdominale, Atrésie, ATELECTASIE, dilatation des bronches, rhinite, Infection, Toux, Diarrhée,	Vegetations, distension, Diarrhée chronique, hypertrophie, rétrocessionement, CD31, Purpura, apds , ANEMIE MICROCYTAIRE, considération, eruption, fenetre aorto-pulmonaire, Adenopathies bilaires, Sequestration splénique, positive, Hematome, douleur dentaire, Hypersplenisme, Cytolyse hépatique, Infection virale, Toux nocturne, Moelle riche, DHPHYSEME, Hypogammaglobulinémie, selles glaireuses, malformation pulmonaire, Respiration, Sueurs nocturnes, 70K, Pancytopenie, p3k, Detresse

Anonymiser les données ?

Besoin de pouvoir **retourner** :

- Au patient
- A son dossier

Données **profondément identifiantes** (souvent indirectement)

Equité devant les méthodes d'anonymisation ?

- Pseudonymisation (quelles données d'entraînement)

Anonymiser les données ?

Besoin de pouvoir **retourner** :

- Au patient
- A son dossier

Données **profondément identifiantes** (souvent indirectement)

Equité devant les méthodes d'anonymisation ?

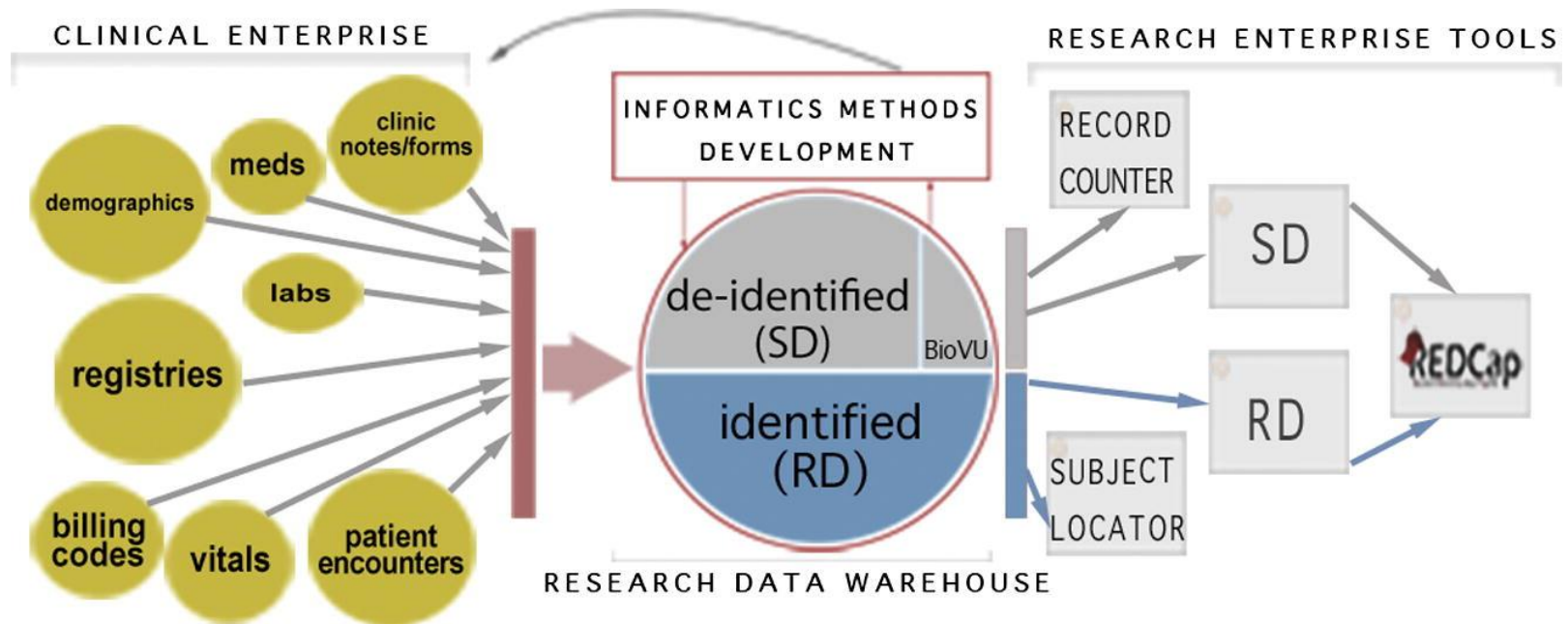
- Pseudonymisation (quelles données d'entraînement)

Difficile de garantir un résultat absolu

Comment protéger les données ?

- Contrôles techniques, organisationnels, et réglementaires
- Les données **restent** sur le lieux de génération
- Les actions sur les données sont journalisées

Moyens techniques



Secondary use of clinical data: The Vanderbilt approach. Journal of Biomedical Informatifs. Danciu et al. 2014

Moyens organisationnels

Dr Warehouse 



HEGP; AP-HP

- Refus de participations, suppression des données
- Textes dé-identifiés (recherche par les noms et prénoms d'un patient impossible)
- Profils selon les utilisateurs
 - Médecins du service de prise en charge
 - Autres utilisateurs





Moyens organisationnels



ids)"

nat (Excel/CSV, SAS, SPSS, R, Stata) and if you wish to perform de-identification

Basic Rights

-  Project Design and Setup
-  Manage Survey Participants
-  Calendar
-  Data Export Tool

De-identification options (optional)

The options below allow you to limit the amount of sensitive information that you are exporting out of the project. Check all that apply.

Known Identifiers:

- Remove all tagged Identifier fields (tagged in Data Dictionary)
- Hash the Record ID field (converts record name to an unrecognizable value)

Free-form text:

- Remove unvalidated Text fields (i.e. Text fields other than dates, numbers, etc.)
- Remove Notes/Essay box fields

Date and datetime fields:

- Remove all date and datetime fields

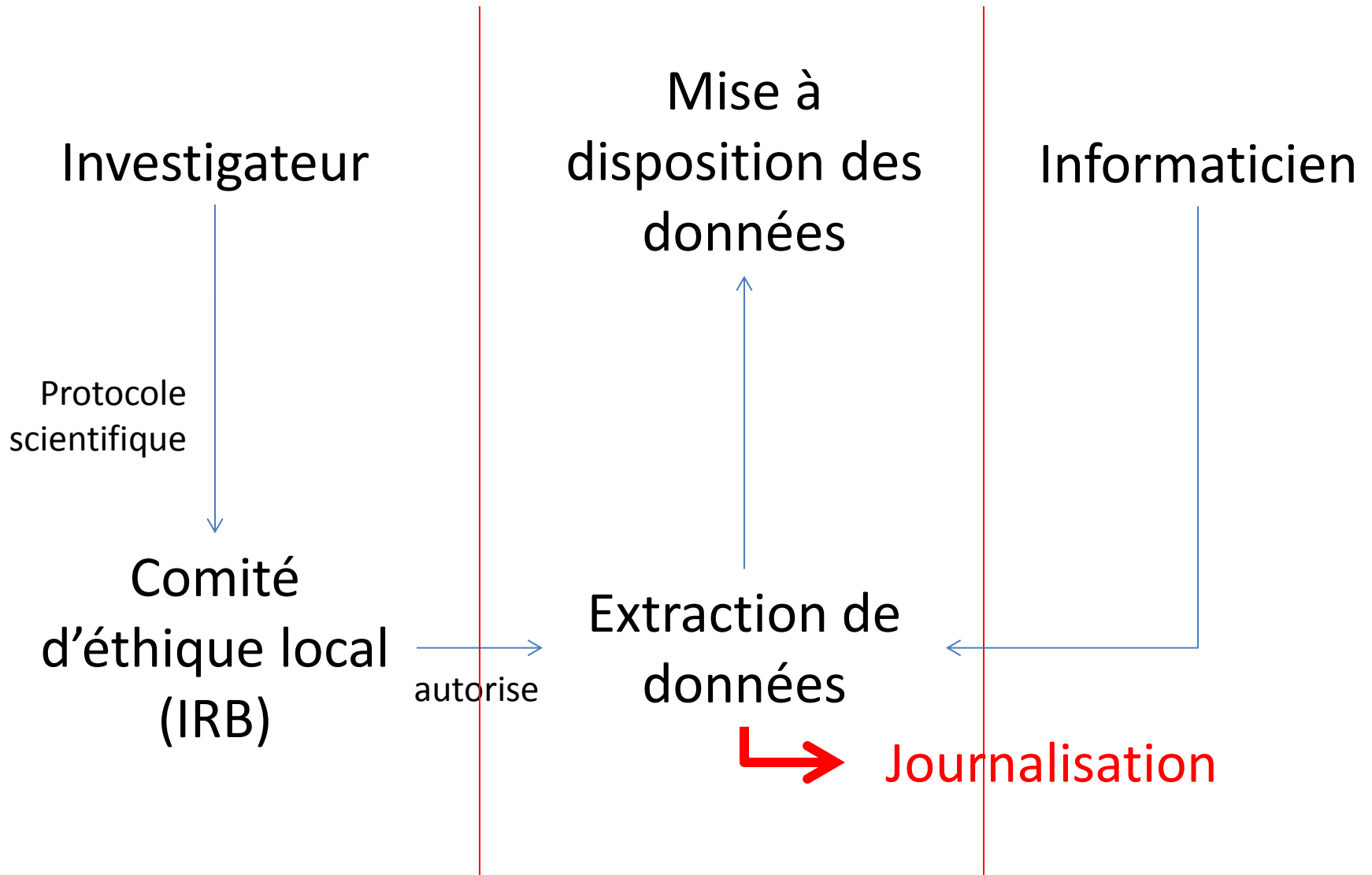
— OR —

- Shift all dates by value between 0 and 364 days
(shifted amount determined by algorithm for each record)

[What is date shifting?](#)

[Deselect all options](#)

Moyens réglementaires : circuits d'accès aux données



Renforcer les aspects de formation et responsabilité des acteurs

Exemple : accès à la base MIMIC III

Required Modules		
	Date Completed	Score
Belmont Report and Its Principles (ID: 1127)	Incomplete	0/0 (0%)
History and Ethics of Human Subjects Research (ID: 498)	Incomplete	0/0 (0%)
Basic Institutional Review Board (IRB) Regulations and Review Process (ID: 2)	Incomplete	0/0 (0%)
Records-Based Research (ID: 5)	Incomplete	0/0 (0%)
Genetic Research in Human Populations (ID: 6)	Incomplete	0/0 (0%)
Populations in Research Requiring Additional Considerations and/or Protections (ID: 16680)	Incomplete	0/0 (0%)
Research and HIPAA Privacy Protections (ID: 14)	Incomplete	0/0 (0%)
Conflicts of Interest in Human Subjects Research (ID: 17464)	Incomplete	0/0 (0%)
Massachusetts Institute of Technology (ID: 1290)	Incomplete	0/0 (0%)

Challenges

Patients **partenaires**

- Mieux impliquer
- Fournisseurs de données (M.J. Fox Foundation, associations de parents...)

Expérience du **CARPEM** (Site intégré de rech. sur le cancer de l'Univ. Paris Descartes)

- Comité des patients
 - Population générale et population en situation de maladie

Partage des données, SNDS, Health Data Hub...

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Public Preferences About Secondary Uses of Electronic Health Information FREE

David Grande, MD, MPA^{1,2}; Nandita Mitra, PhD³; Anand Shah, MD, MSHP⁴; Fei Wan, MS³; David A. Asch, MD, MBA^{1,2,5}

Willingness to share data (1: low, 10: high)

Respondent Willingness to Share Personal Health Information by Conjoint Scenario (unadjusted means)

Sensitivity	Conjoint Scenario		Overall	Willingness to Share Personal Health Information (1=low, 10=high)			
	Use	User		Non-Hispanic African-American	Non-Hispanic White	Hispanic	P-values*
Low	Research	University Hospital	6.82	6.58	6.38	6.98	0.04
High	Research	University Hospital	6.72	6.60	6.50	6.73	0.84
Low	Research	Drug Company	5.90	5.71	5.92	5.94	0.84
High	Research	Drug Company	5.86	5.79	5.79	5.90	0.86
Low	Research	Public Health Dept.	6.10	6.23	6.14	6.06	0.84
High	Research	Public Health Dept.	6.18	6.07	6.12	6.22	0.84

High sensitivity
University Hospital
Research

Willingness **6.72**

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Patient Perspectives on Sharing Anonymized Personal Health Data Using a Digital System for Dynamic Consent and Research Feedback: A Qualitative Study

Karen Spencer^{1*}, PhD ; Caroline Sanders^{2*}, PhD ; Edgar A Whitley³, PhD ; David Lund⁴, PhD ; Jane Kaye⁵, PhD ; William Gregory Dixon^{1,6,7}, MRCP(UK), PhD 

JAMA Internal Medicine

Secondary Use of Health Information Are We Asking the Right Question?

Isaac S. Kohane, MD, PhD¹

Remerciements

HEGP - Necker

Informatique médicale

- A. Neuraz
- A. Burgun

Institut Imagine

- N. Garcelon

HEGP

Informatique médicale

- AS. Jannot
- M. Wack
- E. Zapletal
- H. Countouris
- W. Digan
- D. Baudoin