

Steps 1 & 2: Scope and objectives

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Case Studies in Business Analytics – Group 2

etalab

National healthcare & drug consumption in France



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Executive Summary

Painpoint:
Vision of the
Issue

Context

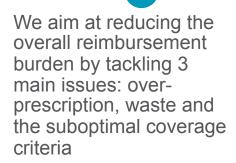
Ambition & Added value

Analysis Framework



Drug coverage constitutes a significant part of expenditure for French Social Security which records a deficit of €9.7bn in 2014





Our methods rely on a thorough analysis of the publicly available datasets we have, and a set of indicators that will evaluate our impact at different levels



Key Success Factors & KPIs

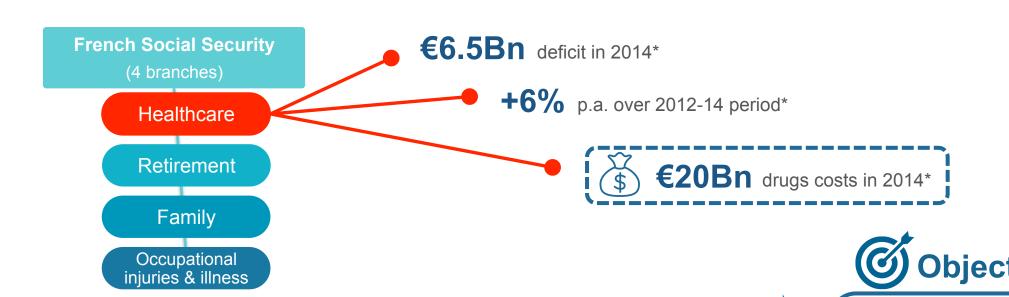
First analysis of data and limits





Drug coverage is a significant item of expenditure for the French Social Security, which records a deficit of €9.7Bn in 2014

Drugs in France can be over-prescribed, wasted and the coverage criteria are suboptimal



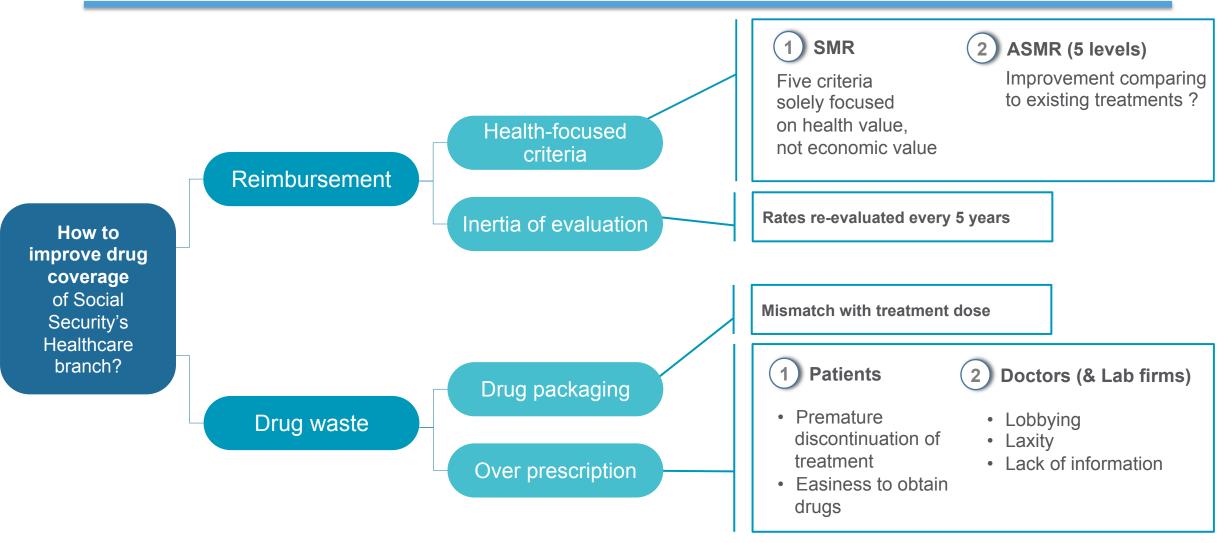
- 0 economic & social assessment for coverage criteria
- 1.5 kg of unused medicine are stored in each French Household*
- 90% of medical consultations result in drug prescriptions in France vs. 43% in the Netherlands*

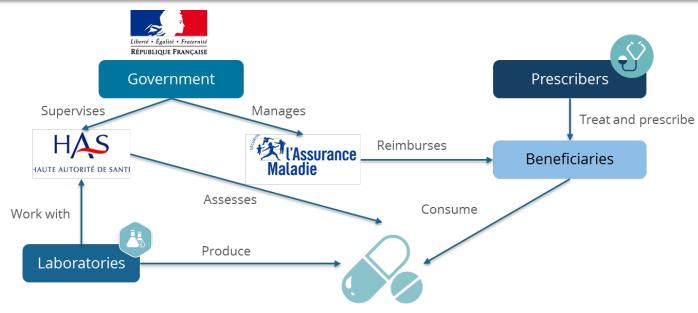
Improve government spending of the Healthcare branch

*Sources: Social Security Annual Report, Open Medic dataset, HAS, Vie-publique.fr (site officiel), Agence Nationale de Sécurité du Médicament



This could be optimized by leveraging different channels such as drug waste and coverage criteria





Various Assessment Criteria

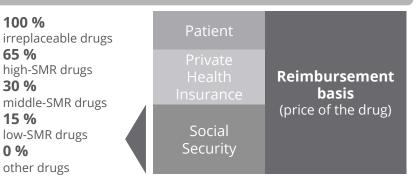
- SMR¹
- Severity of disease
- Drug efficiency
- Side effects
- Public health interest
- Therapeutic strategy
- 1. Service Médical Rendu

- ASMR²
 - 5 levels: "important"

"no improvement"

2. Amélioration du SMR

Reimbursement and Coverage



An ambitious project that adds economic and healthcare value to all stakeholders in the system

Stakeholder

Added Value

Expected impact

Government

- Curb the deficit of the Health Insurance branch
- Improve the Government's transparency and responsiveness



Patient

- Ensure the sustainability of the Public Health Insurance system
- Incentivize reasonable drug consumption



Health professionals

 Enhance public image of drug prescribers and laboratories



Global Ambition

Adding an economic standpoint to the coverage analysis while capitalizing on the Government's Health expertise

Reimbursement rate can be optimized and we identified patterns in wasted drugs

Improve drug reimbursement Coverage process

Drug waste

The reimbursement rate is only based on Health parameters (SMR, ASMR) and not on socio-economic ones

Some drugs are more prone to waste than others

Waste through packaging

Waste through prescription

Hypothesis Testing

- Identify economic factors and compare them to Beneficiary Data to adjust the reimbursement rates
- Look for the 10
 most wasted
 drugs in the past 3
 years and look for
 the patterns
 presented above
 or additional ones

 \Rightarrow

Hypothesis 1

The reimbursement rate could be **optimized** by taking into account **economic factors** in addition to health criteria:

- Generic substitution
- Spread among population
- Waste



Hypothesis 2

Some drugs are more prone to waste than others:

- Easily available
- High number per box
- High reimbursement rate



Hypothesis 3

These highly wasted drugs share common **patterns**:

- The 10 most wasted drugs account for a high percentage in the Health Insurance Deficit
- Drugs considered as wasted in the past should still be wasted in the future

A broad and mostly categorical dataset, with complex terminologies...

USAGE

AGGREGATES BY REFERENCES

OpenMedic (2014)

ATC1 Sex
ATC2 Region
ATC3 Prescriber
ATC4 Amount sourced

ATC4 Amount covered (€)

ATC5 Basis for reimbursement (€)

of boxes delivered

Generic Drug Group

Generic Group

ATC*X*

ATCX

ATCX

ATCX class

consumers

Region Amnt covered (€) Basis (€) # boxes

CIP13

CIP13

CIP13

CIP13
Region
Amnt covered (€)
Basis (€)
boxes

consumers

For each ATC $(1 \rightarrow 5)$ & each CIP13: all indicators are aggregated by Beneficiary variables (Age,

Sex or Region) and/or by Prescriber

Scale of our main dataset

- 1.8Mn+ rows
- 12,224 CIP13 references
- 1,138 ATC5 classes

REPAYMENT BY
PRESCRIBER
(self-employed or
salaried)

Medic'AM (2012-2014 and 1st semester 2015)

CIP7 ATC class
Name Basis (eac
Product # boxes (e

EphMRA code

Basis (each year) # boxes (each year)

Amount covered (each year)



... containing information about drugs, beneficiaries and prescribers

DRUGS Anatomical Therapeutic Chemical (ATC) Classification System Example N05BA01 Anatomical main group, from A to W Nervous system N Therapeutic main group, two digits psycholeptics N05 Therapeutic/pharmacol ogical subgroup, one anxiolytics NO5B Chemical/therapeutic/p N05BA harmacological subgroup, one letter benzodiazepine Chemical substance, two digits N05BA**01** Diazepam

CIP13

ID code for the pharmacological specialty (unique for each dose of each drug from each laboratory)
E.g. 3400935955838
CIP13 of "Doliprane comprimé 1g"

Generic Drug

Is this drug classified as a generic?

Generic Group

Number associated to a Generic molecule and a specific dose

BENEFICIARY

Age

4 age groups: 0-19, 20-59, 60+, Unknown

Sex

Male, Female, Unknown

Region

French Regions (14 references, Unknown)

PRESCRIBER

Type of prescriber

Self-employed (22 categories), salaried (mainly working in hospitals), others (dentists, laboratories, etc.), unknown

INDICATORS

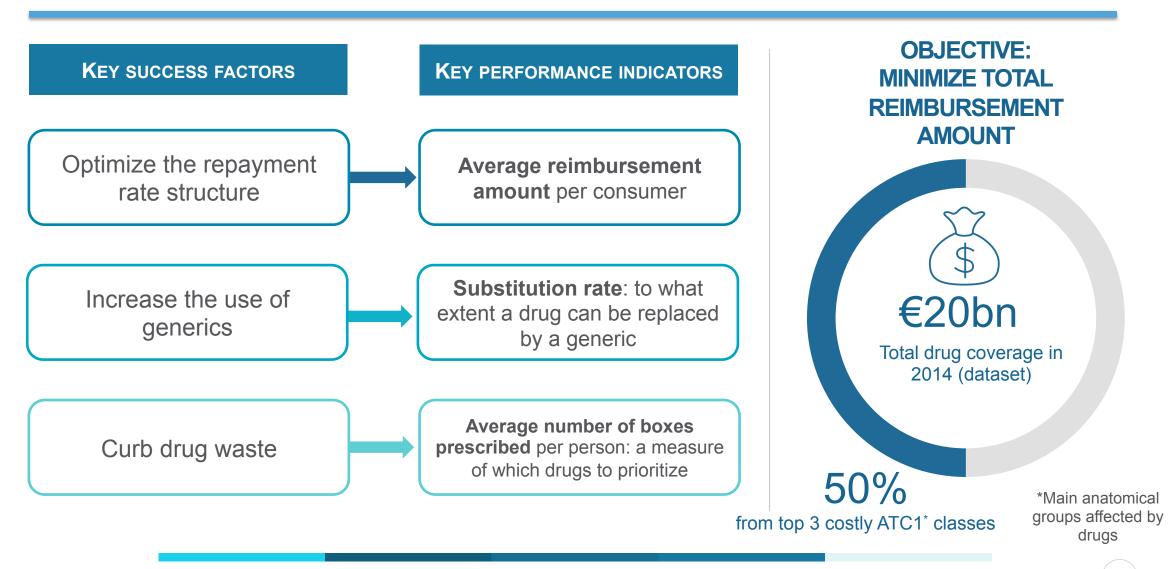
Amount covered by social security

Number of boxes delivered

Basis for reimbursement

Number of Consumers

Success is defined by 3 key factors that are measurable

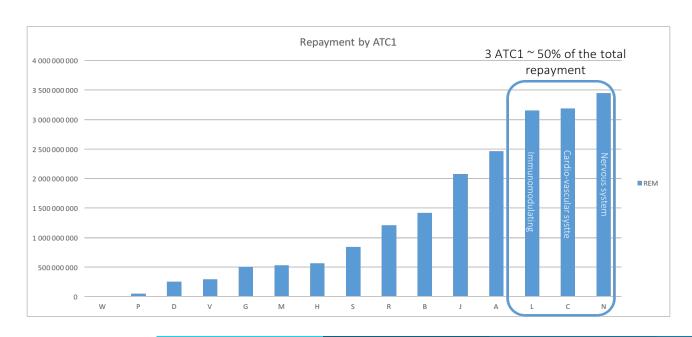


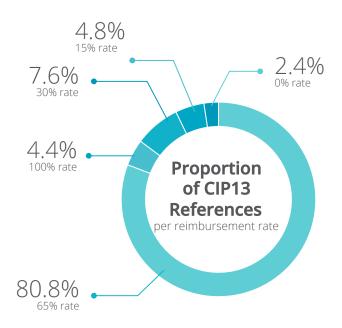
Big trends emerge from first analysis of Data...

Trends & Insights:

On average, over 5 boxes per prescription

- An average **32% substitution rate** to generics across the board, 18% among top 3 costly ATC1* Classes
- Average reimbursement per consumer of €58 excluding top 5% of beneficiaries, €4490 among top 5%





...even though some limits exist at different levels and can be partly addressed by documentation and meetings with industry experts

Limits

Data

- Need to use other data sources to complete the initial datasets
- Predominantly categorical data, hard to analyze

Knowledge

- Challenging topic with many technical aspects
- A lot of unknowns in the drug reimbursement evaluation and process
- Diseases and treatments specificity

Scope

 Inability to measure our full impact on health issues

How we are addressing these limits

- Desk research
- Exploratory data analysis on other sources
- Interviews done (1 general practitioner, 1 junior hospital doctor,
 1 pharmaceutical laboratory manager and 2 pharmacists so far)