

# Association Between Psychotropic and Cardiovascular Iatrogenic Alerts and Risk of Hospitalizations in Elderly People Treated for Dementia: A Self-Controlled Case Series Study Based on the Matching of 2 French Health Insurance Databases

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Association between psychotropic and cardiovascular iatrogenic alerts and risk of

hospitalizations in elderly people treated for dementia: A self-controlled case series

study based on the matching of two French Health Insurance Databases

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| 1  |        | ABSTRACT: 286 words   |
|----|--------|---|
| 2  |        |   |
| 3  | -      | Background: Elderly people are at risk of repeated hospitalizations, some being drug-related and            |
| 4  |        | preventable. In 2011, French experts selected 5 "Iatrogenic Alerts" (IAs), from the existing sets of        |
| 5  |        | explicit criteria, to assess the appropriateness of medication in elderly patients.                         |
| 6  | -      | <b>Objectives:</b> Our objective was to examine the association between hospitalizations and IAs in elderly |
| 7  |        | patients treated for dementia selected for their sensitivity to adverse drug events.                        |
| 8  | -      | Design: A two-year longitudinal national database study using an approach similar to the "self-             |
| 9  |        | controlled case series" between January 1, 2011 and December 31, 2012 was set up to analyze data on         |
| 10 |        | drug prescriptions and hospital stays. IAs were defined as: (1) long half-life benzodiazepine; (2)          |
| 11 |        | antipsychotic drugs in Alzheimer patients; (3) co-prescription of 3 psychotropic drugs or more, (4) co-     |
| 12 |        | prescription of 2 diuretics or more and (5) co-prescription of 4 antihypertensive drugs or more. Data       |
| 13 |        | were obtained from the matching of two French National Health Insurance Databases.                          |
| 14 | -      | Setting: France   |
| 15 | -      | Participants: All affiliates, aged 75 or more, in treatment for dementia, still alive on January 1st, 2011  |
| 16 |        | were included.  |
| 17 | -      | Measurements: We calculated the relative increase in the number of hospitalizations when IAs were           |
| 18 |        | dispensed. The analysis was performed over a period of 6 months.  |
| 19 | -      | Results: 10,754 patients were included. During the IA periods, compared to others periods,                  |
| 20 |        | hospitalization incidence increased by (0.23/year vs. 0.36/year) and the number of hospitalizations         |
| 21 |        | doubled (PFC=1.9, CI95%[1.8, 2.1]). We calculated that 22% (CI95% [20%, 23%]) of all                        |
| 22 |        | hospitalizations were associated with IAs, 80% of which were due to psychotropic IAs.                       |
| 23 | -      | Conclusion: IAs seem to be a simple and clinically relevant tool that enables the prescribing physicians    |
| 24 |        | to assess the appropriateness of the prescription in elderly patients treated for dementia.                 |
| 25 |        |   |
| 26 | Abbrev | riations in the text: ADE: Adverse Drug Event; PFC: Proportional Fold Change; IA: Iatrogenic Alert          |
| 27 | Keywo  | rds: Iatrogenic alert; Adverse drug event; Self-controlled analysis   |
| 28 | Runnin | g Title: Adverse drug hospitalizations and dementia   |

# INTRODUCTION

| 31 | Demographic ageing is associated with an increase in repeated hospital admissions (1-3).         |
|----|--|
| 32 | Reducing these hospitalizations is a priority for hospitals and national health plans.           |
| 33 | Identifying the modifiable factors that are associated with the risk of hospital admission in    |
| 34 | elderly people is of a major interest with the aim of conceiving risk minimization strategies.   |
| 35 | Five to 20% of all hospital admissions are known to be related to Adverse Drug Events            |
| 36 | (ADE) in people aged 65 (4-7) and over 40 to 70% of these ADE-related admissions would be        |
| 37 | preventable (6,8,9). This has prompted the development of criterion-based tools (explicit        |
| 38 | measures) to assess and correct inappropriate prescription in elderly people (10-15). However,   |
| 39 | the evidence that inappropriate prescription, as defined by explicit measures, is associated     |
| 40 | with adverse patient outcomes and notably hospitalizations, is mixed and contradictory           |
| 41 | (11,16,17). This could be explained by a too extensive approach of the appropriateness of the    |
| 42 | prescription inasmuch as these tools are concerned (the risk for serious ADE varying widely      |
| 43 | from a criterion to another in the context of the same tool) and/or a study population running a |
| 44 | too heterogeneous risk for hospitalization.  |
| 45 | In 2011, with a view to managing national health plan in order to improve medication in          |
| 46 | elderly people, the French National Authority for Health requested a panel of French health      |
| 47 | professionals to determine the most prominent criteria regarding cardiovascular and              |
| 48 | psychotropic drugs known to be involved in ADE-related admissions (4-7,9-12,14,15,18).           |
| 49 | According to literature data and its clinical practice, five "Iatrogenic Alerts" (IAs) were      |
| 50 | finally found to be easy to assess and clinically relevant to prevent serious ADE in the elderly |
| 51 | (19). There were 3 psychotropic IAs corresponding to (1) the prescription of a long half-life    |
| 52 | benzodiazepine; (2) the prescription of antipsychotic drugs in Alzheimer patients; and (3) the   |
| 53 | co-prescription of 3 or more psychotropic drugs; and 2 cardiovascular IAs with (4) the co-       |

54 prescription of 2 or more diuretics and (5) the co-prescription of 4 or more antihypertensive 55 drugs. The aim of our study is to validate this new screening tool of inappropriate prescriptions in 56 57 elderly people, by measuring the association between these IAs and the risk of 58 hospitalizations. We focused on patients treated for dementia because they have a high risk 59 for hospitalizations and because one of the IA is specific to this population (19-22). 60 Our main objective was to examine the association between hospitalizations, whatever their 61 leading cause, and IAs in elderly people treated for dementia, using a self-controlled case 62 series design. Second, we examined the association between the potentially ADE-related 63 hospitalizations and the IAs. 64 65 **METHODS** 66 A two-year longitudinal national database study using an approach similar to the "self-67 controlled case series" (23,24) between January 1, 2011 and December 31, 2012 was set up. 68 The study is reported according to the RECORD recommendation (25). It was divided into 4 69 consecutive six-month periods allowing the sequential analysis in the case of each patient 70 based on a moderate amount of data. Indeed, a monthly analysis would have produced 24 71 one-month periods for each patient making the analysis more complex with little benefit. 72 Conversely, an annual analysis, with only 2 one-year periods for each patient would not have 73 made possible a detailed analysis. The 6-month analysis seemed a good compromise to us. 74 **Databases** 75 Data were obtained from 2 French National Health Insurance Databases. The RSI' database 76 ("Régime Social des Indépendants" - social scheme for the self-employed) included data 77 from 6 million self-employed people, such as age, sex, social security numbers, all 78 ambulatory prescriptions and the prescriber and all hospitalizations in private hospitals (with

79 Major Diagnosis Category (MDC), corresponding to the leading cause of hospital admission 80 (26), Appendix 1). The SNIIRAM' database ("Système National d'Information Inter-81 Régimes de l'Assurance Maladie" – The French National Health Insurance Information System) which collects all individualized and anonymous healthcare claims reimbursed by the 82 French National Health Insurance covering the entire French population (27). In addition, this 83 84 database contains patient data such as sex, vital status and eligibility for a 100% health 85 insurance coverage for serious and costly long-term diseases (LTDs), encoded in the International Classification of Diseases, 10<sup>th</sup> revision (ICD 10) (28) and all hospitalizations in 86 87 public hospital with their MDC (26). 88 **Population selection (figure 1)** 89 All affiliates of the RSI aged 75 years or more on January 1st, 2011 with a diagnosis of 90 dementia and undergoing a specific treatment, were included. "Dementia with a specific 91 treatment" was defined by the WHOs ICD-10 code "Alzheimer's disease" (F00-F03\*) (26) 92 and by the prescription of a drug for Alzheimer disease (ATC "Anatomical Therapeutic 93 Chemical » code NO6D (29). All patients undergoing a specific treatment had an ICD-10 94 code. The Charlson comorbidity index (CCI) was calculated for each patient (missing 95 information was replaced by the default – least severe – value, see **Appendix 2**) (28,30,31). 96 **Databases matching (figure 1)** 97 SNIIRAM' and RSI databases have restricted access according to privacy laws (27). We 98 obtained the authorization to match the 2 databases anonymously. In the absence of a unique 99 patient identifier, the matching of the 2 databases was performed based on such criteria as 100 sex, the year of birth, the social security number, the prescriber and the specific Alzheimer's 101 drugs refunded during the first 6-month period (inclusion criteria). Authorizations were 102 obtained in respect of the French regulations (CNIL authorization n° 1537081). 103

- 104 Exposure
- For each drug delivery, the ATC class of the prescribed drug was available with a precision
- ranging from 3 to 5 digits (29).
- 107 We determined, for each patient and for each six-month period:
- the presence of an IA: the algorithm for identifying IAs is described in **Appendix 3** (19).
- It was developed from the ATC codes proposed by French National Authority for Health.
- The co prescription IAs was defined by the delivery of 2 or more different drugs over the
- course of the same six-month period.
- the delivery of a drug known to increase the risk of ADE-related hospitalization and not
- included in IAs (4,6): we included antiplatelet agents or anticoagulants (ATC: B01);
- Nonsteroidal anti-inflammatory drug (NSAID) (ATC: M01); oral antidiabetic drugs
- 115 (OADs) and insulin (ATC: A10); Digoxin (ATC: C01AA05).
- the occurrence of polypharmacy. This was the case when at least five drugs with different
- ATC codes were delivered during the same six-month period (4,6,32).
- Outcomes: Hospitalizations and Major Diagnosis Categories (MDC)
- The number of hospitalizations over a six-month period was calculated for each patient.
- Patients who had more than 10 hospitalizations during the same six-month period (N = 34 -
- 121 corresponding to chemotherapy, dialysis, reeducation sessions; Figure 1) were excluded
- because these repeated hospitalizations were planned and not related to IAs.
- The main outcome was the rate of all hospitalizations, whatever their leading cause.
- For a more detailed second analysis, according to our clinical experience and the literature
- (4,6,8,9,14,15,18,33,34), we analyzed the association between IAs and the risk of
- hospitalization, according to 3 pre-specified relevant MDC groups defined as "context",
- "potentially ADE-related" and "other" (**Table 1**).

- "Context" hospitalizations: hospitalizations the leading cause of which (MDC) was linked to a decompensated disease that could have led to the initial delivery of an IA. More precisely, this included "Diseases and Disorders of the nervous system" (MDC1) and "Mental Diseases and Disorders" (MDC19) for the 3 psychotropic IAs and "Diseases of the respiratory / circulatory system" (MDC 4/5) for the cardiovascular IAs.
- "Potentially ADE-related" hospitalizations were those compatible with ADE occurring with cardiovascular or psychotropic drugs. We included in this category hospitalizations related to "Trauma, allergies, poisoning" (MDC 8, 20, 21).
  - All other MDCs were classified in the "Other" category, with hospitalizations that were *a priori* unrelated to the cardiovascular and psychotropic drugs (initial delivery or leading cause of hospital admission): eye/ear/throat diseases (MDC2 and 3), tumors (MDC16-17), infectious diseases (MDC18)), digestive, hepatobiliary and pancreas system (MD6 and MD7); skin, subcutaneous tissue and breast (MD9); endocrine, nutritional and metabolic system (MD10); kidney and urinary tract (MDC11).

    However, some hospitalizations classified in "context" and "others" categories may be "potentially ADE-related" hospitalizations. Since the codes did not allow us to define it with certainty, we had chosen to classify only traumatic and poisoning hospitalizations in

### STATISTICAL ANALYSES

The association of each IA with hospitalizations (self-adjusted proportional fold change (PFC)) was investigated separately for all hospitalizations (whatever the leading cause) and then for the 3 pre-specified categories (context, potentially ADE-related, other). Analyses were also done for the occurrence of polypharmacy and other drugs of interest.

We used an approach similar to the "self-controlled case series" (23,24) (epidemiological study design for which individuals act as their own controls) to jointly analyze the number of

potentially ADE-related hospitalizations ("minimalist" approach).

hospitalizations throughout the six-month periods spanning each patient's follow-up, comparing each patient to themselves in a different period. Periods without an IA served as a control for periods with an IA for the same patient: the ratio of hospitalizations was determined by considering the 6-month periods where an IA was present ("at risk" periods) and the others ("non-risk" periods). Patients who had never been hospitalized over a period of 2 years did not provide any information to this analysis. Patients who either had a permanent IA or none throughout the four 6-month periods contributed to the estimation of the specific effect of the period. Patients who died during the study period were analyzed except for the final 6-month period of their life, as changes in prescription could occur in terminally ill people. For all statistical analysis, we used the statistical software R (version 3.1.0) with package multinomRob (http://CRAN.R-project.org/package=multinomRob). The details of the statistical analysis are described in appendix 4.

# **RESULTS**

### **Population**

The average age of the population was 85 ( $\pm$  5.0), the majority of them being women (61%). The average CCI was 5.5 ( $\pm$  1.0), with a large prevalence of cardiovascular diseases in 29% (hypertension, diabetes, heart failure, coronary failure, atrial fibrillation), neuropsychiatric diseases in 10% (Parkinson's disease, stroke, depression) and cancer in 12%. Over the span of 2 years, 2196 individuals died (death rate 10% per year). Patients who were hospitalized at least once had more comorbidities ( $1.0 \pm 0.9$  vs.  $0.8 \pm 0.8$ , p <0.001) and more medications (polypharmacy: 90.3% vs. 88.4%, p <0.0001) than patients never hospitalized, with no difference with age. The description of the population is summarized in **table 2**.

### **Exposure to Iatrogenic Alerts**

At least one IA was present in 35% of all six-month periods, psychotropic IAs were more common (30% of periods) than cardiovascular IAs (9% of periods). The prevalence of IAs per

180 6-month periods in the population was: 16.5% for IA antipsychotic drugs, 15.5% for IA  $\geq$  3 181 psychotropic drugs, 9.7% for IA long half-life benzodiazepine, 5.9% for IA  $\geq$  2 diuretics, 182 5.4% for IA  $\geq$  4 antihypertensive drugs (table 2). Patients could present several IAs in the 183 same period, but there was no correlation between the presence of psychotropic and 184 cardiovascular IAs (P=0.52). 185 **Hospitalizations** 186 The average number of hospitalizations for a six-month period was 0.27, with a slight 187 decreasing trend over time from 0.31 in early 2011 to 0.24 in late 2012. The average number 188 of hospitalizations for a six-month period decreased with age, from 0.29 in the 75-80 years 189 old to 0.26 in the >90 years old and increased with the CCI index, from 0.27 (CCI  $\leq$  7) to 0.38 190 (CCI > 7). Patients who were hospitalized at least once had more IAs (Long half-life 191 benzodiazepine: 10.3% vs. 8.8%, p < 0.0001; Antipsychotic: 17.5% vs. 15.3%, p < 0.0001;  $\geq$ 192 3 psychotropic drugs: 17.6% vs. 13%, p < 0.0001;  $\geq$  2 diuretics: 6.5% vs. 5.1%, p < 0.0001;  $\geq$ 193 4 antihypertensive drugs: 6.1% vs. 4.4%, p < 0.0001), more polypharmacy (90.3% vs. 88.4%, 194 p <0.0001), more antiplatelet and anticoagulant drugs (55.8% vs. 44.5%, p <0.0001), more 195 oral antidiabetic agents and / or insulin (12.1% vs. 10.6%, p = 0.002) and more digoxin (4.4%) 196 vs. 3.5%, p <0.0001) than patients never hospitalized (table 2). 197 **Outcomes** 198 Association between hospitalization rate and IAs 199 On average, there were 0.23 hospitalizations over a period of six months without IAs vs. 0.36 200 when at least one IA was present. The self-controlled analysis showed that the number of 201 hospitalizations was double for periods with an IA relative to others periods (PFC 1.9, CI95% 202 [1.8, 2.1]), with PFC ranging from 1.7 [1.5, 1.8] to 2.1 [1.8, 2.3] depending on the IA type. 203 We calculated that 22% (CI95% [20%, 23%]) of all hospitalizations were associated to IAs, 204 the 80% of which were due to psychotropic IAs. All results are shown in table 3.

205 Association between potentially ADE-related admissions and IAs 206 "Context" hospitalizations represented 28% of all hospitalizations and "potentially ADE-207 related" represented 18% of all hospitalizations. The impact of IAs changed with the type of 208 hospitalization (Figure 2, Table 3): the largest increase occurred for the "context" 209 hospitalizations (with PFC between 2.2 [1.8, 2.8] and 3.0 [2.6, 3.4] in the presence of an IA); 210 for "potentially ADE-related" hospitalizations the PFC ranged between 1.3 [0.8, 1.9] and 2.2 211 [1.8, 2.7]; and it ranged between 1.3 [1.1, 1.5] and 1.8 [1.6, 2.1] for "other" hospitalizations. 212 We calculated that 17% of "potentially ADE-related" hospitalizations were associated to 213 psychotropic IAs and 4% to cardiovascular IAs: this amounted, respectively, to 3% (=17% \* 214 18%) and 1% (=4%\*18%) of all hospitalizations. 215 Association between hospitalization rate and other drugs 216 Periods of six months in polypharmacy patients were associated with a large increase of all 217 hospitalization causes (proportional fold change, PFC: 3.6 [3.2, 4.0]), with hospitalizations for 218 "Endocrine, Nutritional & Metabolic System" (MDC10) increasing the most (PFC=10.1 [3.8, 219 26.5]). A similar increase was observed in periods of use of anticoagulant / antiplatelet drugs 220 (overall proportional fold change: 3.2 [2.9, 3.5]), NSAID (proportional fold change: 1.3 [1.2, 221 1.4]), oral anti-diabetic / insulin drugs (proportional fold change: 1.7 [1.4, 2.1]) and digoxin 222 (proportional fold change: 1.7 [1.4, 2.1]). The largest increase of MDCs hospitalization 223 changed according to the drugs was: "Circulatory System" (MDC5 – PFC 5.6 [4.5, 7.0]) for 224 anticoagulants, "Kidney And Urinary Tract" (MDC11 – PFC=1.6[1.1, 2.5]) for NSAID, 225 "Endocrine, Nutritional & Metabolic System" (MDC10 – PFC = 5.8 [2.4, 13.9]) for oral 226 antidiabetic drugs and "Respiratory system" (MDC4 – PFC = 2.6 [1.5, 4.7]) for digoxin. 227

### DISCUSSION

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229 The Iatrogenic Alerts (IAs) represent a restricted selection of explicit criteria developed by 230 French health professionals (19) from the existing sets (10-15) to assess the appropriateness 231 of prescription in elderly people. 232 To our knowledge, this is the first study to analyze the potential association between these IAs 233 and hospitalizations in a selected population known to be at risk for repeated admissions (the 234 elderly people treated for dementia). We found that IAs were closely linked to hospitalization, 235 since 22% of all hospitalizations (whatever the leading cause) in this population were 236 associated with cardiovascular and/or psychotropic IAs. In our secondary more accurate 237 analysis, we calculated that 17% of "potentially ADE-related" hospitalizations were 238 associated with psychotropic IAs and 4% with cardiovascular IAs. This estimate is in agreement with previous assessments that 5-20% of hospital admissions could be related to 239 240 drug side effects (5,6). 241 As expected, IAs were generally common with 40% of the population experiencing at least 242 one six-month period with an IA. But, a surprising finding was that an IA was present for 2 243 years (at all times) for 15% of the patients. This clearly shows the lack of information of 244 practitioners regarding the absence of benefice of some psychotropic and cardiovascular 245 drugs combinations given the potential risks and possibility of alternative treatment. 246 The population under study showed typical characteristics of elderly populations regarding 247 prescriptions and hospitalizations. The incidence of polypharmacy was significant, as was the 248 case with previous reports (4,6,32,35). The risk of hospitalization was typical of old age 249 (4,33), and it increased in the case of morbidity, polypharmacy, prescription of anticoagulant, 250 antidiabetic and digoxin, as previously described (4-7,32,35-37). These associations between 251 hospitalizations and drugs known to be the highest purveyors of ADE (anticoagulant /

antiplatelet drugs, oral anti-diabetic / insulin drugs, NSAID and digoxin) showed the validity of our analysis. We found an association between inappropriate prescribing as defined by the IAs (19) and hospitalizations in a large sample of older people treated for dementia, unlike the usual sets of explicit criteria focused on misuse and overuse (16,38,39). This could be explained first by the clinical relevance of the IAs. Indeed, the IAs do not encompass large number of drugs known to be inappropriate in elderly but are restricted to drugs of two classes known to be highly implicated in severe ADE in Western countries (4-7,9-15,18). Moreover, the IAs are mainly focused on the duplication of these drug classes, and so detect only prescribing with very high risk for ADE. Second, the choice of a study population both with high risk of inappropriate psychotropic exposure and of ADE could have facilitated the detection of this association. Interestingly, recent study from a longitudinal cohort found also an association between inappropriate drug use and hospitalizations in a population closed to ours (people with dementia according to DSM-III-R criteria) (40). Criteria defining inappropriate drug use in this study cross-referenced psychotropic IAs (use of 3 or more psychotropic drugs, use of long-acting benzodiazepines), suggesting that psychotropic IAs could be pertinent also in people suffered from dementia, with or without treatment. However, further studies are needed to explore the association between the whole of IAs and hospitalizations in patients with dementia whatever their treatment and in older population whatever their diseases. Moreover, the association between IAs and hospitalizations need also to be further studied to better understand if IAs are causes and/or consequences and/or independent markers of the risk of hospitalizations. Interventions studies assessing the impact of reduction of the IAs on hospitalizations rate would be especially desirable.

### Strengths of the study

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We chose to use an approach similar to the "self-controlled case series" (23,24), built on the change in exposure over time in the same patient, to reduce the bias of confusion. Indeed, it is well known that adjusting to differences between patients, besides the exposure of interest, is required in the analysis of observational data. This is why, comparing each patient to themselves is "the ultimate form of adjustment" (41). It automatically takes into account factors associated with hospitalization among the elderly: marital status, education, autonomy, place of living, tobacco or alcohol use (4,6,14,15). This was particularly relevant as such data are not available in databases primary purpose of which is either administrative or compensation (27). An additional feature was the inclusion of patients who either had an IA or not in the four 6-month periods under study, as it allowed further adjustment in hospitalization rates over time (estimation of the period specific effect), for example due to seasonal changes (winter /summer).

## Limits of the study

The population under study differed from the general elderly population with dementia in several aspects. First, it included only patients treated for dementia. To match the 2 databases (RSI and SNIIRAM) we had to exclude people without treatment (and 1408 patients with database matching unsuccessful). It is known that these patients are at greater risk of hospitalizations than the others and take more medications (20-22). This could lead to increased hospitalization rates compared to the rest of the elderly population with dementia and increased prevalence of IAs. Second, the sample was selected from retired self-employed persons (RSI' database), limiting the relevance of the population. However, the population of the study benefits from the same general practitioners and hospitals as the rest of the population, so eventually this should not affect the results.

For our secondary analysis, defining causes of hospitalizations that are likely due to ADEs was a difficult task without proper coding. For example, epilepsy might be related to

psychotropic side effects, acute renal failure to diuretics, and so on. We adopted a "minimalist" approach, considering only poisoning and trauma as "potentially ADE-related" and more likely to be affected by change in prescriptions. The maximum impact of reducing the prevalence of the IAs is therefore likely to be in the range defined by the "avoidable part" (3% of all hospitalizations) and the "attributable part" (22% of all hospitalizations).

Finally, the analysis of six-month periods could have led to the categorization of periods with sequential prescription of several drugs as periods when a combination of drugs was present, increasing the occurrence of periods with an IAs. However, this condition should only lead to underestimating the strength of association of IAs with hospitalization; it should not challenge our results. A last aspect of this grouping is that it was not possible to tell whether the iatrogenic alert took place before, during or after the hospitalization within the same semester.

### **CONCLUSION**

The present study provides the first evaluation of the association between IAs and hospitalizations. We showed that the risk of hospitalization nearly doubled in elderly patients in treatment for dementia when they were exposed to psychotropic and/or cardiovascular latrogenic Alerts. These latrogenic Alerts, resulting from a selection of existing explicit criteria by French experts, are a promising simple way of reducing serious ADE in this vulnerable population. Interventional studies are now needed to explore if the reduction of theses IAs can be associated with better clinical outcomes and notably with reduction of hospital admissions.

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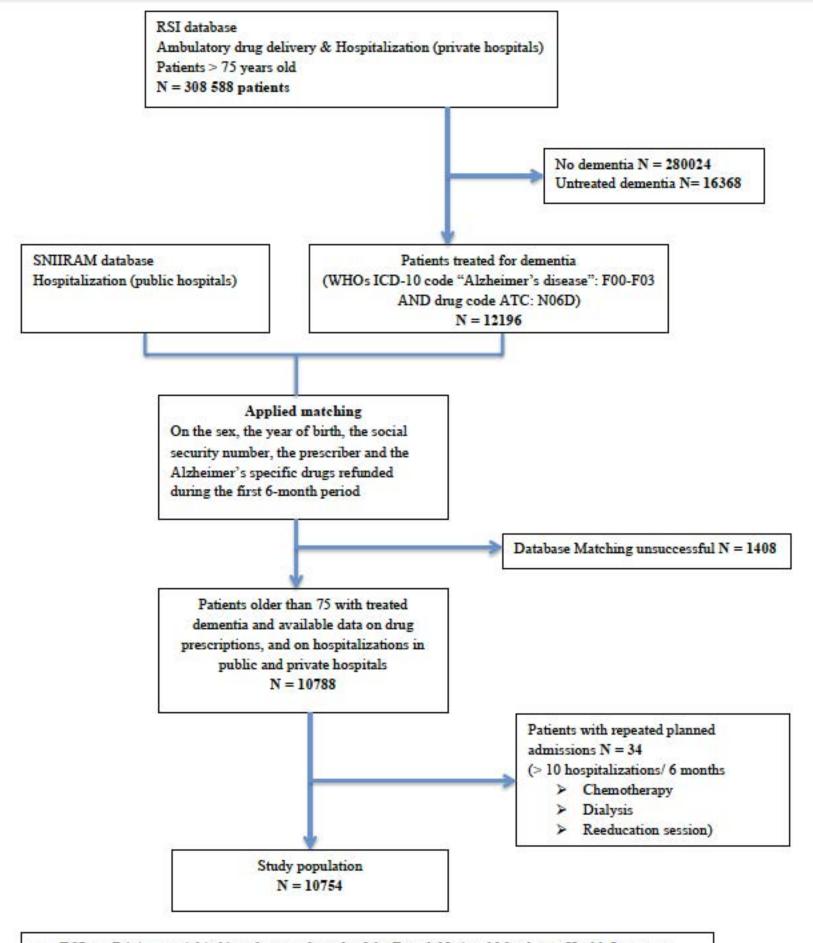
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| 460 | • | FIGURE 1: Flow Chart of patient selection from Health Insurance databases.        |
|-----|---|---|
| 461 |   |   |
| 462 | • | TABLE 1: Classification of hospitalization with Major Diagnostic Categories (MDC) |
| 463 |   | by relevance with Cardiovascular and Psychotropic drug prescriptions              |
| 464 |   |   |
| 465 | • | TABLE 2: Patients characteristics and Iatrogenic Alerts                           |
| 466 |   |   |
| 467 | • | TABLE 3: Proportional Fold Change in the number of hospitalizations per six-      |
| 468 |   | month period by iatrogenic alert and hospitalization type.                        |
| 469 |   |   |
| 470 | • | FIGURE 2: Proportional Fold change in the number of hospitalizations (using       |
| 471 |   | Major Diagnostic Categories) per six-month period with the presence of an IA      |
| 472 |   | (Iatrogenic Alert)  |
| 473 |   |   |
| 474 |   |   |



- RSI = « Régime social indépendant », a branch of the French National Mandatory Health Insurance System for self-employed individuals
- SNIIRAM = The French National Health Insurance Information System, database with information on all beneficiaries of the French National Mandatory Health Insurance System.
- ATC = Anatomical Therapeutic Chemical

|   | Psychotropic        | Cardiovascular      |
|---|---------------------|---------------------|
|   | IAs**               | IAs**               |
| Leading primary cause of hospitalization                        |                     |                     |
| By major diagnosis categories (MDC*)                            | CTXT<br>ADE<br>OTHR | CTXT<br>ADE<br>OTHR |
| Nervous system (1)  | <b>*</b>            | <b>*</b>            |
| Mental Diseases and Disorders (19)                              | •                   | <b>•</b>            |
| Respiratory System (4)  | •                   | •                   |
| Circulatory System (5)  | •                   | •                   |
| Musculoskeletal System And Connective Tissue (8)                | •                   | <b>•</b>            |
| Alcohol/Drug Use or Induced Mental Disorders (20)               | •                   | <b>•</b>            |
| Injuries, Poison And Toxic Effect of Drugs (21)                 | <b>•</b>            | <b>•</b>            |
| Eye (2)   | •                   | <b>•</b>            |
| Ear, Nose, Mouth And Throat (3)                                 | •                   | <b>•</b>            |
| Digestive System (6)  | •                   | <b>•</b>            |
| Hepatobiliary System And Pancreas (7)                           | •                   | <b>•</b>            |
| Skin, Subcutaneous Tissue And Breast (9)                        | •                   | <b>•</b>            |
| Endocrine, Nutritional And Metabolic System (10)                | •                   | <b>•</b>            |
| Kidney And Urinary Tract (11)                                   | <b>*</b>            | <b>•</b>            |
| Blood and Blood Forming Organs and Immunological Disorders (16) | <b>*</b>            | <b>*</b>            |
| Poorly Differentiated Neoplasms (17)                            | <b>•</b>            | •                   |
| Infectious and Parasitic Diseases & Disorders (18)              | •                   | •                   |

<sup>\*</sup> MDC 12-15 (reproduction & newborns), 22-25 (Burns, Multiple Trauma, HIV), MDC 26 (Severe multiple trauma), MDC 27 (organ transplants), MDC 28 and 90 (Errors and other unclassifiable stays) were not present in the database \*\* CTXT: Context; ADE: potentially ADE related; OTHR: Other.

|                                | Overall        | Hos            | pitalization   | P-value  |
|--------------------------------|----------------|----------------|----------------|----------|
|                                |                | Never          | Once or more   |          |
|                                | N = 10754      | N = 4396       | N = 6358       |          |
| Age (years, mean $\pm$ SD)     | $85.0 \pm 5.0$ | $85.1 \pm 5.1$ | $85.0 \pm 5.0$ | 0.40     |
| Sex (% Female)                 | 61%            | 66%            | 58%            | < 0.001  |
| Charlson index (mean $\pm$ SD) | $5.5\pm1.0$    | $5.4 \pm 0.9$  | $5.5 \pm 1.0$  | <0.001   |
| Comorbidities (mean $\pm$ SD)  | $0.9 \pm 0.9$  | $0.8 \pm 0.8$  | $1.0 \pm 0.9$  | <0.001   |
| Parkinson disease              | 5.2%           | 4.3%           | 5.8%           | 0.001    |
| Depression                     | 0.4%           | 0.2 %          | 0.5%           | 0.02     |
| Arterial hypertension          | 11.3%          | 11.0%          | 11.6%          | 0.28     |
| Diabetes                       | 11.0%          | 10.0%          | 11.8%          | 0.003    |
| Atrial fibrillation            | 4.4%           | 3.5%           | 5.1%           | 0.001    |
| Heart failure                  | 4.3%           | 3.5%           | 4.9%           | 0.006    |
| Cancer                         | 11.5 %         | 9.6%           | 13.0%          | <0.001   |
| <b>Death</b> (%)*              | 4.6%           | 3.1%           | 5.7%           | <0.001   |
| <b>Iatrogenic alerts</b> (%)*  |                |                |                |          |
| Long half-life benzodiazepine  | 9.7%           | 8.8%           | 10.3%          | <0.0001  |
| Antipsychotic                  | 16.5%          | 15.3%          | 17.5%          | <0.0001  |
| ≥ 3 psychotropic drugs         | 15.5%          | 13.0%          | 17.6%          | <0.0001  |
| ≥ 2 diuretics                  | 5.9%           | 5.1%           | 6.5%           | <0.0001  |
| ≥ 4 antihypertensive drugs     | 5.4%           | 4.4%           | 6.1%           | <0.0001  |
| Other drugs (%)*               |                |                |                |          |
| Anticoagulant / Antiplatelet   | 51.0%          | 44.5%          | 55.8%          | <0.0001  |
| NSAID                          | 9.6%           | 9.5%           | 9.7%           | 0.15     |
| Oral anti-diabetic / Insulin   | 11.4%          | 10.6%          | 12.1%          | 0.002    |
| Digoxin                        | 4.0 %          | 3.5%           | 4.4%           | <0.0001  |
| Polypharmacy (%)*              | 89.5 %         | 88.4%          | 90.3%          | < 0.0001 |

\*Percentage per 6-month periods NSAID: Nonsteroidal anti-inflammatory drug

|                                     |                 |     | ]              | Hospitali | zation type    |           |                |     |
|-------------------------------------|-----------------|-----|----------------|-----------|----------------|-----------|----------------|-----|
|                                     | All             |     | Contex         | ĸt        | Potentially AD | E-related | Other          |     |
| <b>Iatrogenic Alerts</b>            | PFC             | AR  | PFC            | AR        | PFC            | AR        | PFC            | AR  |
| Any                                 | 1.95 [1.8, 2.1] | 22% |                |           |                |           |                |     |
| Long half-life benzodiazepine       | 1.65 [1.5, 1.8] | 5%  | 2.3 [1.9, 2.7] | 8%        | 1.7 [1.3, 2.3] | 6%        | 1.3 [1.1, 1.5] | 3%  |
| Antipsychotic in Alzheimer patients | 1.79 [1.7, 1.9] | 9%  | 2.7 [2.4, 3.1] | 23%       | 2.1 [1.7, 2.5] | 19%       | 1.5 [1.4, 1.7] | 12% |
| ≥ 3 psychotropic drugs              | 2.04 [1.9, 2.2] | 12% | 3.0 [2.6, 3.4] | 16%       | 2.2 [1.8, 2.7] | 13%       | 1.6 [1.4, 1.8] | 9%  |
| ≥ 2 diuretics                       | 1.73 [1.5, 2.0] | 3%  | 2.2 [1.8, 2.8] | 5%        | 1.3 [0.8, 1.9] | 2%        | 1.6 [1.3, 1.9] | 3%  |
| ≥ 4 antihypertensive drugs          | 2.08 [1.8, 2.3] | 5%  | 2.8 [2.3, 3.4] | 6%        | 1.4 [1.0, 2.0] | 3%        | 1.8 [1.6, 2.1] | 4%  |

PFC: Proportional Fold Change, AR = Attributable ratio

ADE: adverse drug event

**APPENDIX 1: Major Diagnostic Categories (MDC)** 

| MDC 1 | Nervous system   |
|-------|--|
| MDC2  | Eye  |
| MDC3  | Ear, Nose, Mouth And Throat                                |
| MDC4  | Respiratory System   |
| MDC5  | Circulatory System   |
| MDC6  | Digestive System   |
| MDC7  | Hepatobiliary System And Pancreas                          |
| MDC8  | Musculoskeletal System And Connective Tissue               |
| MDC9  | Skin, Subcutaneous Tissue And Breast                       |
| MDC10 | Endocrine, Nutritional And Metabolic System                |
| MDC11 | Kidney And Urinary Tract                                   |
| MDC12 | Male Reproductive System                                   |
| MDC13 | Female Reproductive System                                 |
| MDC14 | Pregnancy, Childbirth And Puerperium                       |
| MDC15 | New-born And Other Neonates (Perinatal Period              |
| MDC16 | Blood and Blood Forming Organs and Immunological Disorders |
| MDC17 | Myeloproliferative DDs (Poorly Differentiated Neoplasms)   |
| MDC18 | Infectious and Parasitic DDs                               |
| MDC19 | Mental Diseases and Disorders                              |
| MDC20 | Alcohol/Drug Use or Induced Mental Disorders               |
| MDC21 | Injuries, Poison And Toxic Effect of Drugs                 |
| MDC22 | Burns  |
| MDC23 | Factors Influencing Health Status                          |
| MDC24 | Multiple Significant Trauma                                |
| MDC25 | Human Immunodeficiency Virus Infection                     |
| MDC26 | Severe multiple trauma                                     |
| MDC27 | Organ transplants  |
| MDC28 | Sessions   |
| MDC90 | Errors and other unclassifiable stays                      |

MDC in italic were not present in our database

**APPENDIX 2: ICD-10 Coding Algorithms for Charlson Comorbidities** 

| Comorbidities                          | ICD-10 codes  | Points |
|--|---|--------|
| Myocardial infarction                  | I21.x, I22.x, I25.2                                     | 1      |
| Congestive heart failure               | 109.9, 111.0, 113.0, 113.2, 125.5, 142.0,               | 1      |
| Peripheral vascular disease            | 170.x, 171.x, 173.1, 173.8, 173.9, 177.1, 179.0, 179.2, | 1      |
|  | K55.1, K55.8, K55.9, Z95.8, Z95.9                       |        |
| Cerebrovascular disease                | G45.x, G46.x, H34.0, I60.x-I69.x                        | 1      |
| Dementia                               | 100% of patients (included on the ATC code N06D)        | 1      |
| Chronic pulmonary disease              | 127.8, 127.9, J40.x-J47.x, J60.x-J67.x, J68.4, J70.1,   | 1      |
|  | J70.3   |        |
| Rheumatic disease                      | M05.x, M06.x, M31.5, M32.x-M34.x, M35.1,                | 1      |
|  | M35.3, M36.0  |        |
| Peptic ulcer disease                   | K25.x-K28.x   | 1      |
| Mild liver disease                     | B18.x, K70.0-K70.3, K70.9, K71.3-K71.5, K71.7,          | 1      |
|  | K73.x, K74.x, K76.0, K76.2-K76.4, K76.8, K76.9,         |        |
|  | Z94.4   |        |
| Diabetes without chronic complication  | E10.0, E10.1, E10.6, E10.8, E10.9, E11.0, E11.1,        | 1      |
|  | E11.6, E11.8, E11.9, E12.0, E12.1, E12.6, E12.8,        |        |
|  | E12.9, E13.0, E13.1, E13.6, E13.8, E13.9, E14.0,        |        |
|  | E14.1, E14.6, E14.8, E14.9                              |        |
| Diabetes with chronic complication     | E10.2-E10.5, E10.7, E11.2-E11.5, E11.7, E12.2-          | 2      |
|  | E12.5, E12.7, E13.2-E13.5, E13.7, E14.2-E14.5,          |        |
|  | E14.7   |        |
| Hemiplegia or paraplegia               | G04.1, G11.4, G80.1, G80.2, G81.x, G82.x, G83.0-        | 2      |
|  | G83.4, G83.9  |        |
| Renal disease                          | I12.0, I13.1, N03.2-N03.7, N05.2-N05.7, N18.x,          | 2      |
|  | N19.x, N25.0, Z49.0-Z49.2, Z94.0, Z99.2                 |        |
| Any malignancy, including lymphoma and | C00.x-C26.x, C30.x-C34.x, C37.x-C41.x, C43.x,           | 2      |
| leukemia, except malignant neoplasm of | C45.x-C58.x, C60.x-C76.x, C81.x-C85.x, C88.x,           |        |
| skin                                   | C90.x-C97.x   |        |
|  |   |        |
| Moderate or severe liver disease       | 185.0, 185.9, 186.4, 198.2, K70.4, K71.1, K72.1,        | 3      |
|  | K72.9, K76.5, K76.6, K76.7                              |        |
| Metastatic solid tumor                 | C77.x-C80.x   | 6      |
| AIDS                                   | B20.x-B22.x, B24.x                                      | 6      |
| Age:                                   | 71-80 years   | 3      |
|  | 81-90 years   | 4      |
|  | More than 90 years                                      | 5      |

APPENDIX 3: ATC Coding Algorithms for identifying IAs

| Any prescription of a long half-life benzodiazepine         N05BA01, N05BA05, N05BA08, N05BA09, N05BA11, N05BA16, N05BA18, N05CD02, N05CD03, N03AE01           Antipsychotic in Alzheimer patients         N05AA01, N05AA02, N05AA06, N05AB02, N05AB03, N05AC01, N05AC02, N05AC04, N05AD01, N05AD05, N05AD08, N05AE04, N05AF05, N05AG03, N05AG02, N05AH05, N05AH1, N05AH2, N05AH3, N05AH4, N05AL01, N05AL02, N05AL03, N05AL03, N05AL05, N05AX08, N05AX12, N05AX13, N07XX06           3 or more psychotropic drugs         N03AE01, N05AA01, N05AA02, N05AA06, N05AB02, N05AB03, N05AC01, N05AC02, N05AC04, N05AD01, N05AD05, N05AD08, N05AE04, N05AF01, N05AF05, N05AG02, N05AG03, N05AH05, N05AH1, N05AH2, N05AH3, N05AH4, N05AL01, N05AL02, N05AL03, N05AL05, N05AX08, N05AX12, N05AX13, N05BA01, N05BA01, N05BA04, N05BA05, N05BA08, N05BA09, N05BA11, N05BA12, N05BA01, N05BA01, N05BA01, N05BA01, N05BA02, N05CD02, N05CD03, N05CD04, N05CD06, N05CD07, N05CD11, N05CF01, N05CF02, N06AA02, N06AA04, N06AB06, N06AB09, N06AB10, N06AB08, N06AB10, N06AB01, N06AB03, N06AB06, N06AB08, N06AB10, N06AB01, N0 |
|--|
| Antipsychotic in Alzheimer  N05AA01, N05AA02, N05AA06, N05AB02, N05AB03, N05AC01, N05AC02,  N05AC04, N05AD01, N05AD05, N05AD08, N05AE04, N05AF05, N05AG03,  N05AG02, N05AH05, N05AH1, N05AH2, N05AH3, N05AH4, N05AL01, N05AL02,  N05AL03, N05AL05, N05AX08, N05AX12, N05AX13, N07XX06  N03AE01, N05AA01, N05AA02, N05AA06, N05AB02, N05AB03, N05AC01,  N05AC02, N05AC04, N05AD01, N05AD05, N05AD08, N05AE04, N05AF01,  N05AF05, N05AG02, N05AG03, N05AH05, N05AH1, N05AH2, N05AH3, N05AH4,  N05AL01, N05AL02, N05AL03, N05AL05, N05AX08, N05AX12, N05AX13,  N05BA01, N05BA04, N05BA05, N05BA08, N05BA09, N05BA11, N05BA12,  N05BA16, N05BA18, N05BA21, N05BA56, N05BB01, N05BB02, N05BC01, N05BE01,  N05BX03, N05CD02, N05CD03, N05CD04, N05CD06, N05CD07, N05CD11,  N05CF01, N05CF02, N06AA02, N06AB04, N06AB06, N06AB09, N06AB10, N06AB01, N06AB01, N06AB03, N06AB04, N06AB05, N06AB06,  N06AB08, N06AB10, N06AG02, N06AF03, N06AF05, N06AX03, N06AX11,  |
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| N05AL03, N05AL05, N05AX08, N05AX12, N05AX13, N07XX06  3 or more psychotropic drugs  N03AE01, N05AA01, N05AA02, N05AA06, N05AB02, N05AB03, N05AC01, N05AC02, N05AC04, N05AD01, N05AD05, N05AD08, N05AE04, N05AF01, N05AF05, N05AG02, N05AG03, N05AH05, N05AH1, N05AH2, N05AH3, N05AH4, N05AL01, N05AL02, N05AL03, N05AL05, N05AX08, N05AX12, N05AX13, N05BA01, N05BA04, N05BA05, N05BA08, N05BA09, N05BA11, N05BA12, N05BA16, N05BA18, N05BA21, N05BA56, N05BB01, N05BB02, N05BC01, N05BE01, N05BX03, N05CD02, N05CD03, N05CD04, N05CD06, N05CD07, N05CD11, N05CF01, N05CF02, N06AA02, N06AA04, N06AA06, N06AA09, N06AA12, N06AA16, N06AA17, N06AA21, N06AB03, N06AB04, N06AB05, N06AB06, N06AB08, N06AB10, N06AG02, N06AF03, N06AF05, N06AX03, N06AX11,  |
| 3 or more psychotropic drugs  N03AE01, N05AA01, N05AA02, N05AA06, N05AB02, N05AB03, N05AC01, N05AC02, N05AC04, N05AD01, N05AD05, N05AD08, N05AE04, N05AF01, N05AF05, N05AG02, N05AG03, N05AH05, N05AH1, N05AH2, N05AH3, N05AH4, N05AL01, N05AL02, N05AL03, N05AL05, N05AX08, N05AX12, N05AX13, N05BA01, N05BA04, N05BA05, N05BA08, N05BA09, N05BA11, N05BA12, N05BA16, N05BA18, N05BA21, N05BA56, N05BB01, N05BB02, N05BC01, N05BE01, N05BX03, N05CD02, N05CD03, N05CD04, N05CD06, N05CD07, N05CD11, N05CF01, N05CF02, N06AA02, N06AA04, N06AA06, N06AA09, N06AA12, N06AA16, N06AA17, N06AA21, N06AB03, N06AB04, N06AB05, N06AB06, N06AB08, N06AB10, N06AG02, N06AF03, N06AF05, N06AX03, N06AX11,  |
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| N05BX03, N05CD02, N05CD03, N05CD04, N05CD06, N05CD07, N05CD11, N05CF01, N05CF02, N06AA02, N06AA04, N06AA06, N06AA09, N06AA12, N06AA16, N06AA17, N06AA21, N06AB03, N06AB04, N06AB05, N06AB06, N06AB08, N06AB10, N06AG02, N06AF03, N06AF05, N06AX03, N06AX11,  |
| N05CF01, N05CF02, N06AA02, N06AA04, N06AA06, N06AA09, N06AA12, N06AA16, N06AA17, N06AA21, N06AB03, N06AB04, N06AB05, N06AB06, N06AB08, N06AB10, N06AG02, N06AF03, N06AF05, N06AX03, N06AX11,   |
| N06AA16, N06AA17, N06AA21, N06AB03, N06AB04, N06AB05, N06AB06, N06AB08, N06AB10, N06AG02, N06AF03, N06AF05, N06AX03, N06AX11,  |
| N06AB08, N06AB10, N06AG02, N06AF03, N06AF05, N06AX03, N06AX11,   |
|  |
| N064X14 N064X16 N064X17 N064X21 N06X22 N07XX06   |
| 1100AA17, 1100AA10, 1100AA21, 1100A22, 110/AA00  |
| Any combination of 2 or C02LA01, C03AA02, C03AA03, C03AA05, C03AB04, C03BA11, C03BX03, C03CA01,  |
| more diuretics (some of them C03CA02, C03CA03, C03CA04, C03DA01, C03DA02, C03DA04, C03DB01,  |
| are already a combination of 2 C03EA01*, C03EA04*, C03EB01*, C03EB02*, C07BA02, C07BB02, C07BB03,  |
| diuretics*. For the algorithms, C07BB07, C07BB12, C07CA03, C07DA06, C09BA01, C09BA02, C09BA03, C09BA04,  |
| these drugs were considered as C09BA05, C09BA06, C09BA07, C09BA09, C09BA15, C09DA01, C09DA02, C09DA03,   |
| a sum of 2 drugs.) C09DA04, C09DA06, C09DA07, C09DA08, C09DX01, C09DX03, C09XA52,  |
| C09XA54  |
| 4 or more antihypertensive C02LA01*, C02AB02, C02AC01, C02AC02, C02AC04, C02AC05, C02AC06,   |
| <b>drugs</b> (some of them are C02CA01, C02CA03, C02CA06, C03AA02, C03AA03, C03AA04, C03AA05,  |
| already a combination of 2* or C03BA10, C03BA11, C03BX03, C03CA01, C03CA02, C03CA03, C03CA04, C03CB02,   |
| 3** antihypertensive drugs. For C03DA01, C03DA02, C03DA04, C03DB01, C03EA01*, C03EA04*, C03EB01,   |
| the algorithms, these drugs C07AA02, C07AA03, C07AA06, C07AA07, C07AA12, C07AA15, C07AA16,   |
| were considered as a sum of 2 C07AB02, C07AB03, C07AB04, C07AB05, C07AB07, C07AB08, C07AB09, C07AB12,  |
| or 3 drugs *) C07AG01, C07AG02, C07BA02*, C07BB02*, C07BB03*, C07BB07*, C07BB12*,  |
| C07CA03*, C07DA06**, C07FB02*, C07FB03*, C08CA01, C08CA02, C08CA03,  |
| C08CA04, C08CA05, C08CA06, C08CA07, C08CA08, C08CA11, C08CA12, C08CA13,  |
| C08DA01, C08DB01, C08EA02, C08EX02, C09AA01, C09AA02, C09AA03, C09AA04,  |
| C09AA05, C09AA06, C09AA07, C09AA08, C09AA09, C09AA10, C09AA11,   |
| C09AA13, C09AA15, C09AA16, C09BA01*, C09BA02*, C09BA03*, C09BA04*,   |
| C09BA05*, C09BA06*, C09BA07*, C09BA09*, C09BA15*, C09BB02*, C09BB04*,  |
| C09BB10*, C09DA01*, C09DA02*, C09DA03*, C09DA04*, C09DA06*, C09DA07*,  |
| C09DA08*, C09DB01*, C09DB02*, C09DB04*, C09DX01**, C09DX03**   |

### **APPENDIX 4: Statistical analysis**

More precisely, we assumed that the number  $H_{ij}$  of hospitalizations in patient i and six-month period j had average  $\lambda_i \exp(\beta_{AI} \, a_{ij} + \beta_j)$  where  $\lambda_i$  was a patient specific rate - including the effect of all factors that do not change significantly over 2 years' time (sex, age, ...),  $\beta_j$  was a (6-month) period specific effect adjusting for time trends in hospitalization and  $\beta_{AI}$  was the IA specific effect of interest ( $a_{ij} = 1$  if an IA occurs in period j for patient i). The coefficient PFC =  $\exp(\beta_{AI})$  quantifies the self-adjusted proportional fold change (PFC) in the number of hospitalizations over a 6-month period depending if an IA is present. Conditionally on the total number of hospitalizations, the joint distribution of  $(H_{Ii}, H_{i2}, H_{i3}, H_{i4})$  was multinomial with parameters  $\{\exp(\beta_{AI} \, a_{ij} + \beta_j)/\sum_{k=1}^4 \exp(\beta_{AI} \, a_{ik} + \beta_k)\}$  for  $1 \le j \le 4$ , where the patient-specific rate of hospitalization  $\lambda_i$  had been cancelled out and was not estimated. Finally, we calculated the population-level fraction of hospitalizations attributable to an iatrogenic alert as  $AF = \sum_{i,j} h_{ij} \left(1 - \exp(-\beta_{AI} a_{ij})\right)/\sum_{i,j} h_{ij}$ , i.e. the fraction of hospitalization avoided had no IA occurrence.