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## **THERAPIES**

# **HEADING: PHARMACOEPIDEMIOLOGY**

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# The value of a health insurance database to conduct pharmacoepidemiological studies in oncology

Pharmacoepidemiological study in oncology using claims database

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### Abbreviations

- ALD: affection de longue durée
- CepiDC: centre d'épidémiologie sur les causes médicales de décès

CMS: centers for Medicare & Medicaid services

CNODES: Canadian Network for Obervational Drug Effect Studies

DDD: defined daily dose

EMA: European Medicne Agency

ICD-10: international statistical classification of diseases and related health problems 10<sup>th</sup> revision

LTD: long term disease

M-CAHPS: Medicare consumer assessment of healthcare providers and systems

MPR: medication possession ratio

NCI: National Cancer Institute

NorPEN: Nordic PharmacoEpidemiological Network

OMOP: observational medical outcomes partnership

OTC: over-the-counter

PIC: personal identity code

PMSI: French hospital discharge database (programme de medicalisation des systèmes d'information)

PROTECT: pharmacoepidemiological research on outcomes of therapeutics

SEER: surveillance, epidemiology and end results program

SNDS: French national health insurance database (système national des données de santé)

#### Summary

Some concerns have emerged about the evidence of benefits on survival outcomes or quality of life of new anticancer drugs. In parallel, the decreased cancer mortality leads to an increased number of patients exposed to cancer-treatment-related consequences. In this context, pharmacoepidemiology is crucial to assess anti-cancer drug use, effectiveness and safety in real life conditions. We aimed to describe strengths, limitations and considerations associated with the use of the French national health insurance database (système national des données de santé [SNDS]) to conduct pharmacoepidemiological studies in oncology. The SNDS represents a powerful tool in pharmacoepidemiology owing to its extensive coverage, accurate description and quantification of drug exposure and individual data on patients. The main limitations of this database ensue from the administrative nature resulting in technical difficulties in its management and gaps in availability of data. Another limitation is the lack of accurate identification of diseases, comorbidities or outcomes and potential confounding with notably the lack of data regarding cancer stage, prognosis or risk factors. Finally, the accurate identification of the nature of chemotherapy received by patients is sometimes complex. To minimize these limitations, several approaches and statistical methods could be used as highlighted by national or international initiatives. First, the SNDS may be linked with cancer registry or clinical data. Then, several data sources could be combined using metaanalytical methods. The development of methodological tools and the use of standardized methods are crucial to enhance the quality of studies that can impact clinical practice and guide public decision. Pharmacoepidemiological approaches and pharmacovigilance represent an important cornerstone in oncology for signal detection or long-term follow up of cancer patients. In this context, validated methods to identify cancer patients and to describe chemotherapy regimens within these data should be promoted and remain too scarce despite international guidelines. Moreover, limits and strength of each data sources should be systematically discussed according to the research question. Optimized and framed use of claims database represents a future challenge in onco-pharmacoepidemiology.

#### **KEYWORDS**

Pharmacoepidemiology; Oncology; Electronic claims databases; Electronic health care databases; Anticancer drugs; Safety; Benefit; Utilization

#### Introduction

Nearly 40 % of men and women will be diagnosed with cancer of any site at some point during their lifetime with a median age at diagnosis of 66 years. Breast, bronchopulmonary, prostate and colorectal cancers account for approximately half of all new cancer cases. Cancer represents the leading cause of death for patients less than 65 years of age. The five year relative survival rate varies between 4 and 98% according to cancer types [1]. Cancer can be treated with systemic cytotoxic chemotherapy and/or with a new heterogeneous group of anticancer drugs presented as "targeted" (monoclonal antibodies, protein-kinase inhibitors). This group represented 60% of anticancer drugs' marketing authorizations between 2012 and 2015 [2]. These drugs' marketing authorizations are based on results of randomized controlled trials with strict selection criteria, low number of exposed patients and limited duration of exposure [3–7]. In addition, concerns have emerged about evidence of benefits on survival outcomes or quality of life of anticancer drugs. From 2009 to 2013, the European Medicines Agency (EMA) approved the use of 48 anticancer drugs in 68 indications while only 51% of them showed a significant improvement on survival or quality of life [8]. In parallel, there is an average decreased of death rates of 1.5 % each year over 2006-2015 with an increased number of patients exposed to treatment cancer-related consequences [1]. Adverse drug reactions, potential misuse, second cancer, polypharmacy and drug-drug interactions with cancer specific drugs or non-cancer specific drug are examples of these adverse outcomes. Therapeutic progresses have led to the development of new paradigms in the management of some cancer types considered today as chronic diseases. In this context, most of patients are now essentially treated as outpatients with the development of oral anticancer drugs. Taking into account the above considerations, pharmacoepidemiological studies became crucial in oncology to describe patterns of use and to assess benefits and harms of anticancer drugs in real life conditions during the active treatment phase of cancer but also during survivorship. Owing to numerous advantages, health insurance administrative databases are frequently used to conduct pharmacoepidemiological studies and to guide public decision in many countries [9–17]. The French "système national des données de santé" (SNDS) is one of the largest health insurance databases in the World. This database contains anonymous claims from outpatients and inpatients care linked with the French hospital discharge database (programme de médicalisation des systèmes *d'information* [PMSI]). The SNDS has been also recently implemented with cause of death by the linkage with death registry (centre d'épidémiologie sur les causes médicales de décès [CepiDC]). It may be used as a pertinent and complementary tool for onco-pharmacoepidemiology studies because of several strengths that can minimize classic bias related to other sources. However, some biases and technical difficulties need to be acknowledged before widely using these complex and administrative data developed for management purpose. In this way, reflections in future challenge and perspectives are needed to compensate these limits and to improve reliability of future studies. Moreover, validated and standardized methods remain scarce and need to be developed to improve validity of future onco-pharmacoepidemiology studies.

In this context, we aimed:

1) To describe methodological tools, strengths, limits and considerations related to the use of the SNDS to conduct pharmacoepidemiological studies in oncology;

2) To present international initiatives proposed to optimize the use of a health insurance database and minimize potential biases.

#### The système national des données de santé (SNDS)

#### **Exhaustive coverage**

The SNDS has been described in details elsewhere [14,18–21]. This national database provides extensive data encompassing a population of more than 65 million inhabitants. It provides anonymous and individual data on patient characteristics with demographic data, long-term chronic diseases (long term disease [LTD] so called in French: *affections de longue durée* [ALD]) and vital status. The access to ambulatory health care consumption (reimbursed drugs and medical acts) and the linkage with data from the national hospital database (medical information systems programme, so called in French: *programme de médicalisation des systèmes d'information* [PMSI]) gives a complete overview of patients care pathway for several years all over France [14,18–21]. The large

number of patient recorded in this database allows increasing statistical power of analyses especially when studying rare cancer [22–24]. Moreover, completeness of the data could minimize selection bias related to the constitution of specialized cancer center's cohorts and attrition bias related to long-term follow-up. Selection bias is an important issue with results not always transposable to the target population. However, it seems crucial to understand that SNDS provides exhaustive data on all reimbursement of care but not exhaustive data for the identification of prevalent and incident cancer cases as highlighted in the literature.

#### Identification of incident cases of cancer

Accurate and exhaustive identification of incident cases of cancer has been studied in oncology in order to estimate cancer incidence even in areas were no cancer registry exists. In this context, validation studies have been performed using cancer registries or medical records as gold standard. Performance of algorithms detection varies between 30% and 94% for sensitivity and between 20% and 90% for predictive positive value according to type of cancer, type of sources used and type of codes used to detect cases. It is important to note that some algorithms gave incidence close to those from registries, but this is due to the fact that false-negatives and false-positives have similar frequencies and counterbalanced each other [22,25-35]. Table 1 and table 2 summarize validated algorithms of incident cancer patient selection in the SNDS available in the literature. We identified only five validation studies for solid tumors conducted before 2006. Yet, PMSI data reliability improved after 2007 and we can assume that the results of these studies would be different today. Heterogeneity in performances of detection can be explained by the heterogeneity of cancer care pathway and questioned on the relevance of the use of PMSI data to select new cases in certain cancer subtypes. For example, some hematologic malignancies such as chronic lymphocytic leukemia are non-progressive at diagnosis and do not require active treatment and related hospitalization. When exploratory analyses were conducted, they showed that cancer patients not detected as incident or identified in the PMSI database are more likely to be old, with localized stage of cancer [22,28]. These results suggest that sensitivity analyses including only treated cancer patients would have been of interest but this information is often lacking in cancer registry database. Hence, false-negatives may concern patients never hospitalized for their cancer because of different disease management and/or a gap between diagnosis and treatment. Moreover, the use of ICD-10 to classify cancer by subtypes often lacks of precision and is sometimes ambiguous because of the multiplicity of codes. Finally, coding errors could be another reason of misclassification. Therefore, sources of detection are of primary importance. The use of LTD data alone for identifying cancer patients in claims database resulted in poor performances with sensitivity lower than 50% for many cancers [27]. Despite these limits, the SNDS remains a source of interest in onco-pharmacoepidemiology for many cancer types notably with regard to precise quantification of drug exposure. In fact, exhaustive data is not needed in pharmacoepidemiology but only representative sample of patients requiring drug therapy. Moreover, exhaustive data are not available in other data sources and some rare cancers such as Hodgkin lymphoma are well detected using these databases.

#### **Drug exposure**

The SNDS is a powerful tool to describe and quantify drug exposure in patients as described elsewhere [19,20]. First, it contains claims from drugs dispensed by community pharmacies. Each drug packages are identified by a unique CIP (*club inter-pharmaceutique*) code providing for each drug, their anatomical therapeutic chemical (ATC) codes, the number of items and dosage for each item. For each drug, date of prescribing, date of dispensing and information on prescribers are available. Hence, the SNDS enables to estimate a large amount of drug exposure indicators such as duration of treatment, discontinuation and number of treatment cycles, number of defined daily doses (DDDs) or medication possession ratio (MPR). These data allow to assess compliance and associated factors to oral anticancer drugs which become of great importance as regards the increasing marketing of this route of administration for cancer treatment. Hence, this database provides accurate information to model drug exposure with minimized information bias (recall bias, non-response bias or reporting bias).

However, data availability in the SNDS is not continuous and gaps in availability must be accounted when designing a pharmacoepidemiological study in order to minimize bias. Drugs dispensed over the counter or during hospital stays are not available from the SNDS with potential classification bias. As described previously by Palmaro et al., other factors of potential gap in availability of drug exposure should also be checked to minimize bias [19]. However, innovative and costly drugs (established by decree), drugs dispensed by hospital to ambulatory patients (so called: "retrocession") and drugs not approved on the basis of the programme of temporary authorization of use are available. This is of great interest in oncology, because new anticancer drugs are often included in this category.

Another fundamental issue in onco-pharmacoepidemiology is the lack of method to identify multidrug chemotherapy regimens in these databases with only one publication in multiple myeloma patients in France [36]. In fact, sequence of treatments (chemotherapy, radiotherapy or stern cells transplant) can be identified using diagnosis procedure codes in the PMSI database but the type of chemotherapy protocol is not always fully available. In fact, old and conventional anticancer drugs are not recorded. Yet, it is essential to identify the type of chemotherapy regimen and number and rank of treatment lines to describe with accuracy care pathway and to assess survival, effectiveness or safety. One possible approach is using recorded drugs (costly or retrocession) as tracers of chemotherapy protocol when available or specific. Another approach could be the linkage of SNDS data with other hospital sources giving access to the nature of chemotherapy received by patients but also other potential confounding factors not available in the SNDS as done by several international initiatives.

#### **Confusion bias**

The major limitation to conduct onco-pharmacoepidemiology studies with the SNDS is confusion bias. The lack of clinical data such as cancer stage, prognosis factors, anatomo-pathology reports, result of diagnosis tests does not permit to consider data according to prognosis markers. Moreover, there is little social information and no information on lifestyle habit of patients (e.g.: smoking status, addictions etc.) [18,20]. Moreover, adverse drug reactions not requiring a specific treatment such as drug initiation, medical procedure or hospitalization are not detectable in the SNDS. Finally, the SNDS enables to identify the reimbursement of medical act but the results are not registered in the database. This is particularly the case for medical biology examinations including pharmacogenetic explorations and could be a limit as regards the request of genetic exploration for the initiation of anticancer treatments [37,38]. The pharmacoepidemiology approach does not allow making a direct link between the status for a gene and the use of a drug at the population level. In addition, reimbursement of pharmacogenetics explorations is still carried out today only on nonnomenclature acts ("biologie hors nomenclature"), which makes their identification in the databases more complex. The attribution of dedicated codes could facilitate the identification of the realization of such acts and thus be able to study the proportion of exploration performed before the introduction of certain drug treatments. All these limitations highlight the complementarity of sources that can be used in onco-pharmacoepidemiology. Several cohort studies have been conducted to describe patterns of drug use and to assess effectiveness in real life conditions. These cohorts included data from university hospitals, cancer care centers, private clinics or community hospitals with patients identified by physicians or anticancer drugs by nominative hospital pharmacy dispensation [39–42]. Then, pharmacovigilance in oncology based on spontaneous report remains irreplaceable to detect and prevent adverse drug reaction in oncology [43,44]. To minimize confusion bias, linkage with observational cohort data is a perspective of interest as highlighted by international initiatives [45]. Then, statistical methods such as propensity scores or the use of selfcontrolled designs can be used to deal with confounding factors [20,46]. It should be noted that since 2016, owing respecting regulation processes, the link from field cohorts with reimbursement data is allowed which could be an enrichment data source.

#### **International initiatives**

#### Linkage of health insurance administrative databases with multiple sources

The Surveillance, Epidemiology and End Results (SEER) program in the United-States.

The National Cancer Institute's (NCI) Surveillance, Epidemiology and End Results (SEER) programme is a population-based registry. It collects informations from some geographic areas which represent 28% of the US population. It aims to produce epidemiological data on incidence prevalence and mortality. There are additional supplementary data that SEER collects and makes available through databases that are not part of the standard SEER Research. In Pharmacoepidemiology, two specialized databases are of interest: the SEER-MEDICARE database and the SEER-CAHPS data set. These databases are based on a linkage between SEER data and the Centers for Medicare & Medicaid Services' (CMS) Medicare Consumer Assessment of Healthcare Providers and Systems (M-CAHPS<sup>®</sup>) patient surveys. The SEER-CAHPS data set links 3 types of data: clinical/registry (SEER), patient-reported information from the Medicare Consumer Assessment of Healthcare Providers and Systems (M-CAHPS), and administrative/billing (Medicare claims and enrollment files). Beneficiaries included with cancer are Medicare beneficiaries residing in SEER areas who responded to a CAHPS survey between 1997 and 2015. The SEER-MEDICARE links 2 types of data: clinical/registry (SEER) and administrative/billing (Medicare claims and enrollment files). Beneficiaries with cancer included are all Medicare-eligible persons appearing in the SEER data who were diagnosed with cancer between 1973 and 2013 and their Medicare claims through 2014. This resource permits examination of sociodemographic, clinical characteristics and medical care of patients diagnosed with cancer, including cancer survivors. However, Medicare is not representative of the whole US population including only beneficiaries older than 65 years old, beneficiaries aged <65 years with certain disability and beneficiaries of any age with renal end-stage disease [47–49]. Yet, it is crucial to assess long-term consequences of cancer chemotherapy in young adults in terms of somatic and psychologic complications, quality of life or social impact such as difficulties in returning to work. Moreover, this database has geographical limits contrary to the national coverage of the SNDS.

The Nordic prescription databases

The five Nordic countries (Denmark, Finland, Iceland, Norway and Sweden) have nationwide prescription databases on prescriptions dispensed in pharmacies. In these countries, all residents are

identified through a unique personal identity code (PIC) at birth or time of permanent residency since 1960s. PIC permits the linkage between various population-based data sources, such as Nordic cancer registries or biobanks. Available data are categorized in 4 categories patient-specific data, prescriber data, drug data and pharmacy data [50,51]. Between 2005 and 2010, 515 studies including drug utilization studies, effect studies and validation studies were published using these databases. A linkage with other registries was done in 63% (N = 356) of these studies with only 5%(N = 25) concerning antineoplastic and immunomodulation agents [52]. However, some limitations, similar to that observed with the SNDS, must be highlighted. First, OTC drugs and drugs dispensed in hospital and other institutions are not available while anticancer drugs are mainly administered in hospital. Another limit is possible confounding resulting from a lack of data regarding lifestyle habits or detailed clinical data in the database and in other registries. Finally, these databases are limited by small population's coverage ranging from 0.3 to nearly 9 million inhabitants and consequently for studying rare diseases or events [51-53]. One approach to obtain large population study and get sufficient statistical power is to combine information from multiple health care databases as describe in the review by Trifiro et al. [54]. In this way, the Nordic PharmacoEpidemiological Network (NorPEN) has been created in 2008 in order to facilitate research within pharmacoepidemiology in the Nordic countries.

#### **Combination of multiple health care databases**

Several international initiatives have been conducted combining multiple health care sources in order to increase statistical power. In Europe, several projects combining multiple national health care databases are conducted to evaluate specific safety issues but none projects were conducted so far in oncology [46,55–58]. In Canada, the Canadian Network for Observational Drug Effect Studies (CNODES) was created in order to link health care databases and to collect data on nearly 40 million of subjects with meta-analytical approach of individual provinces data [59,60]. The difficulty is to combine heterogeneous medical data with different type of systems, sources, medical event coding and languages. However, this approach is of great interest in oncology drug safety and in the detection of signal but harmonization of methods is needed to detect diseases or events of interest.

#### Discussion

#### Harmonization process

These considerations highlight that the relevance of the use of health care database for research purpose must be based on a case by case reflection process. In this way, several aspects should be considered in order to improve results' validity of future studies conducted on these databases, such as intrinsic features of diseases and management, type, design and aims of study conducted according to data sources. The development of validated tools and standardized methods is crucial for the validity of future active surveillance studies in oncology. In fact, different published studies used distinct definitions for the same event or disease or to quantify drug exposure. Moreover, the concept of "expert users" should be promoted given the complexity of these data sources. In this way, several initiatives and projects are conducted with the aims to harmonize detection of medical event in claims database in the USA and in Europe (mini sentinel program, observational medical outcomes partnership, pharmacoepidemiological research on outcomes of therapeutics by a European consortium) [61-63]. The development of such initiatives contrasts with the difficulty to publish validation studies, which are needed for national research or international collaboration. Moreover, the use of health care databases is increasing to conduct pharmacoepidemiological studies in oncology with a growing interest in the "big data" context but study validation remains scarce despite guidelines published since 2013 by the ISPOR oncology special interest group. A systematic review conducted to identify secondary data use to conduct health research in oncology between 2006 and 2010, revealed that 72.8% of studies were using claims data with very little studies reporting the use of published algorithms and only 4.8% discussing the impact of their selection algorithm on the results [64]. The development of methodological tools is crucial to enhance quality of studies that can impact clinical practice and to guide public decision. As described above, it is essential to accurately identify stage of cancers, biomarkers, type and line of treatments, relevant clinical confounders such as comorbidities but also patients reported outcomes. Such information could be obtained with the combination of multiple data sources which constitute a future challenge in onco-pharmacoepidemiology. The use of health care database without linkage with other sources is of great interest to study health care pathway as a whole with significant statistical power but often only in a macroscopic way. However, this increase in statistical power can lead to statistical significance due to very minor effects without clinical relevance [65,66].

#### Value of pharmacoepidemiology in oncology

In oncology, systemic older anti-cancer drugs present a well-known safety profile for patients contrary to "innovative" ones. In March 2018, a French press release states the request of patient organizations suffering from hematological malignancies to obtain early access to "innovative drugs". This request takes place in a general context suggesting that a rapid access to innovative drugs is necessarily valuable for cancer patients. However, some concerns have emerged in the literature about this new heterogeneous group of anticancer drugs which are presented as "innovative, targeted and safer".

First, as depicted in the introduction, analysis of EMA marketing authorization between 2009 and 2013 showed that only half of new anti-cancer drugs actually improves survival or quality of life in cancer patients. When survival gains were found, they were frequently marginal compared to existing drugs. These concerns contrast with the substantial cost of these drugs. Moreover, 16% of drug approvals received orphan designation. In onco-hematology, this percentage increases to 47% [8]. As depicted in the literature, orphan drugs in oncology generated the largest amount of profit. Some authors comment this concept with headlines such as "*from blockbusters to nichebusters*" [67,68]. In fact, the development and authorization of orphan drugs are facilitated and centralized. After authorization, companies can ask extension of marketing authorization to other indications with a large number of treated patients. Finally, a recent study showed that the median total number of patients studied prior to marketing authorization was 1,708 (interquartile range [IQR] 968-3,195) for standard drugs and 438 (IQR 132-915) for orphan drugs. Then duration of

exposure for chronic medication was insufficient in 20% of studies conducted [7]. In this context, pre-marketing results may be controversial and assessment of these results' transposition in terms of effectiveness and safety in real life conditions is crucial at the population level. In addition, the long-term adverse events of these new drugs or combinations remain unknown.

#### Conclusion

Pharmacoepidemiology and pharmacovigilance constitute an important cornerstone in oncology for signal detection and long-term follow up of cancer patients. Optimized use of claims data represents a future challenge in Pharmacoepidemiology according to research issues but also with limits and strengths specific to every data sources. In the future, other complementary data sources such as social networks could be considered in a new field of cyberpharmacovigilance or cyberpharmacoepidemiology [69].

#### **Disclosure of interest**

The authors declare that they have no conflict of interest.

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Solid tumor									
Cancer type	ICD-10 Codes	Medical Acts or procedures	Other variable	Gold standard	Se <sup>*</sup>	$PPV^+$			
Colorectal Quantin et al J Cancer Epidemiol 2012;2012:298369.	C18; C19; C20	"endoscopic examination of the colon or rectum"; "partial or total exeresis of the colon or rectum"; "excision, exeresis or destruction of polyps or tumours in the colon or rectum"; "colostomy repair or closure"; "secondary restoration of continuity"; "implantation of a colon endoprosthesis"	-	Cancer registry	≈75%	≈75%			
Breast Couris et al. J Clin Epidemiol 2009 Jun;62(6):660- 6	C50	-	-	Cancer registry	64%	-			
Prostate Couris et al. J Med Syst 2006;30:459-63	C61; D07.5	Surgical procedures and ultrasound procedures	-	Medical record	-	≈33%			
Central nervous system Coureau et al Rev Epidemiol Sante Publique 2012;60:295-304	C70; C71; C72; D32;D33;D42; D43; C75.2;D35.3; D44.4; G93.0:	Surgical procedures Diagnosis act Chemotherapy and radiotherapy	No metastasis antecedent Age>70 years old	Cancer Registry	67%	69%			
<b>Thyroïd</b> <i>Carré et al</i> <i>Rev Epidemiol Sante</i> <i>Publique</i> 2006;54:367-76	C73; D09.3;D44.0	Surgical acts	-	Cancer Registry	73%	89%			

**Table 1**. Description of validated algorithms to identify incident cancer patients in the système national des données de santé (SNDS) by cancer type for solid tumors

\*Sensitivity; <sup>+</sup>Predictive positive value

ICD-10 codes: international statistical classification of diseases and related health problems  $10^{\text{th}}$  revision

national des données de santé (SNDS) by cancer type for hematologic malignancies										
	He	ematologic maligancies	\$							
Cancer type	ICD-10 Codes	Medical Acts/procedures	Other variable	Gold standart	Se*	$\mathrm{PPV}^{+}$				
Hodgkin Lymhoma <sup>1</sup>	C81	Chemotherapy	No lymphoma's antecedent	Cancer registry	94.2%	74.2%				

Chemotherapy

Chemotherapy

Chemotherapy

No

lymphoma's

antecedent

No

lymphoma's

antecedent

No

lymphoma's

antecedent

No

Myeloma's

antecedent

Cancer

registry

Cancer

registry

Cancer

registry

Cancer

registry

74.6%

48.6%

19.0%

90%

64.6%

78.3%

22.6%

66%

**Table 2.** Description of validated algorithms to identify incident cancer patients in *the système* national des données de santé (SNDS) by cancer type for hematologic malignancies

\*Sensitivity; \*Predictive positive value

**B-Non Hodgkin** 

T- Non Hodgkin

Leukemia/ Small

**Chronic Lymphocytic** 

Lymphoma<sup>1</sup>

Lymphoma<sup>1</sup>

lymphocytic

lymphoma<sup>1</sup>

Myeloma<sup>2</sup>

ICD-10 codes: international statistical classification of diseases and related health problems 10<sup>th</sup> revision

<sup>1</sup>Conte et al. Medicine (Baltimore) 2018;97:e9418.

C82;C83.3; C83.0;C83.1;

C83.7; C83.8;

C83.9; C85;

C88.4

C84;C86

C91.1

C90

<sup>2</sup>Palmaro et al. Medicine (Baltimore) 2017;96:e6189.