



Using Medicare Data to Assess the Proarrhythmic Risk of Non-Cardiac Treatment Drugs that Prolong the QT Interval in Older Adults: An Observational Cohort Study

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Abstract

Introduction Serious cardiac arrhythmias caused by QT-prolonging drugs are difficult to predict based on physiological measurement and pre-approval clinical trials. Post-marketing surveillance and monitoring are important to generate safety data.

Objectives To assess whether an observational study using Medicare claims data can detect the arrhythmogenic risk of QT-prolonging drugs.

Methods We identified 17 QT-prolonging drugs with known risk of torsades des pointes (TdP) that were not used to treat cardiac arrhythmias. Amoxicillin and four serotonin-norepinephrine reuptake inhibitors (SNRIs) were used as controls. De-identified claims data of 1.2 million Medicare beneficiaries were accessed. Two separate Cox regressions were done for short-term and chronic-use drugs. The primary outcome was a composite of ventricular arrhythmias and/or sudden death, identified by ICD diagnostic codes. We explored the independent effect of each study drug on the outcomes. Other covariates included patient demographics, comorbidities, and known risk factors for drug-induced cardiac arrhythmia.

Results We were able to detect increased risk in 14 of 17 study drugs (82.3%), and none of the control drugs. Among the fluoroquinolones, ciprofloxacin was the safest. Azithromycin and clarithromycin were relatively safe compared to erythromycin. Compared to SNRIs, both citalopram and escitalopram had increased risk, more so with escitalopram than citalopram. Comorbidities associated with increased risk included ischemic heart disease, electrolyte imbalance, bradycardia, acute myocardial infarction, heart failure, and chronic kidney and liver disease.

Conclusion Medicare data can be utilized for post-marketing surveillance and monitoring of the proarrhythmic risk of QT-prolonging drugs in older adults.

Key Points

The Medicare claims database can be a useful resource in monitoring serious cardiac adverse effects of QT-prolonging drugs, which are generally difficult to predict and quantify.

Based on data from 1.2 million Medicare beneficiaries and over 5 million patient-years of follow-up, we detected an increased risk of some commonly prescribed drugs including levofloxacin, citalopram, and escitalopram for ventricular arrhythmia and sudden death.

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1 Introduction

The association of symptomatic cardiac arrhythmia with QT-prolonging drugs can be traced back to the first report of syncope in patients receiving quinidine, almost a hundred years ago [1]. It was later found that these dramatic episodes of syncope were often associated with a specific pattern of ventricular tachycardia called torsades des pointes (TdP) [2]. As most of the early cases of TdP were observed in patients treated for cardiac arrhythmia, it was assumed that this rare form of arrhythmia was mainly related to antiarrhythmic treatment drugs. However, the attitude towards TdP changed radically when it was discovered that common, non-cardiac treatment drugs taken by millions of patients could also cause QT prolongation and TdP. This led to tight scrutiny and eventual withdrawal from the market of some drugs such as terfenadine, astemizole, and cisapride [3]. In the 1990s, the US Food and Drug Administration (FDA) and the European Medicine Agency (EMA) began requiring preclinical and clinical tests for the QT-prolonging potential of developing drugs [4, 5]. Since 1989, at least 14 clinically important drugs have been withdrawn from the market due to TdP, with an unknown number of developing drugs halted due to the same concern [6]. Over the past two decades, QT prolongation has become one of the most common reasons for drug withdrawal or relabeling [7]. Recently, in the midst of the COVID-19 (Coronavirus Disease 2019) pandemic, the enthusiasm over the use of hydroxychloroquine and azithromycin as potential prophylaxis or treatment has raised concerns because both drugs have been known to cause TdP [8]. After issuing an emergency use authorization for hydroxychloroquine and chloroquine for treatment of hospitalized COVID-19 patients, the FDA had to issue a drug safety communication recommending against the use of these drugs outside of the hospital or clinical trial settings due to inability to monitor for their potential increased risk for ventricular tachycardia [9]. Subsequently, clinical reports have documented occurrences of significant QT prolongation and TdP in COVID-19 patients receiving these drugs which, together with the lack of evidence of therapeutic efficacy, led to revocation of the emergency use authorization by the FDA [10–13].

Despite stringent pre-marketing requirement for testing, physiologic measurement of QT prolongation is an unreliable predictor of the likelihood of ventricular arrhythmia [14–16]. Not all QT-prolonging drugs are proarrhythmic and the absence of QT prolongation is not a guarantee for safety. In vitro measurement of QT prolongation of a drug often does not correlate well with the clinical incidence of arrhythmia. Apart from the pharmacodynamics of the concerned drug, the likelihood of arrhythmia also depends

on patient factors such as genetic disposition (e.g., female gender, congenital long QT syndrome), co-morbidities (e.g., hypokalemia, bradycardia, structural heart disease) and interaction with other drugs (e.g., additive effects of other QT prolongers or pharmacokinetic interactions that increase drug concentrations, putting patients at increased risk of QT prolongation) [17–21]. Since it is not possible to precisely measure the risk that a drug will prolong the QT interval in an individual patient and thus increase the risk for TdP, the most reliable predictor of safety for any QT-prolonging drug is its history of safe administration across a large number of patients [22]. Therefore, outcome studies based on large clinical data sets are especially important to assess the risk of drug-induced arrhythmia [23].

The risk of specific drugs to cause TdP is difficult to quantify because these events are generally rare and their transient nature makes them hard to diagnose. One study estimated the overall incidence of drug-induced TdP to be 2.5 and 4.0 per million per year for males and females, respectively [24]. It follows that drug-induced arrhythmia studies based on general population data will require millions of patients with multi-year follow-up to have enough statistical power. The claims data from the US Centers for Medicare and Medicaid Services (CMS) have been made available for such research [25]. The main strength of the Medicare data is population coverage. It is estimated that over 93% of adults age 65 years and over are enrolled in Medicare, making Medicare data one of the richest sources of healthcare utilization information in the country [26, 27]. Currently, there are over 45 million Medicare beneficiaries. The data available to researchers include patient demographics, diagnoses, procedures, medications, and service encounter dates. Data are generally made available within a year. Patient-level data can be linked across years. We present a study using the CMS data to assess the risk of sudden death and ventricular arrhythmias for a subset of commonly prescribed non-cardiac treatment QT-prolonging drugs known to be associated with TdP. We postulate that an observation study using CMS data is able to emulate clinical studies in detecting the increased risks of known drugs and potentiating co-morbidities. New insights can also be gained regarding the relative risks of drugs within drug classes. To the best of our knowledge, this is the first study using the CMS data set to address this particular problem. We present our findings and discuss potential applications of this approach in post-marketing surveillance.

2 Materials and Methods

2.1 Study Population

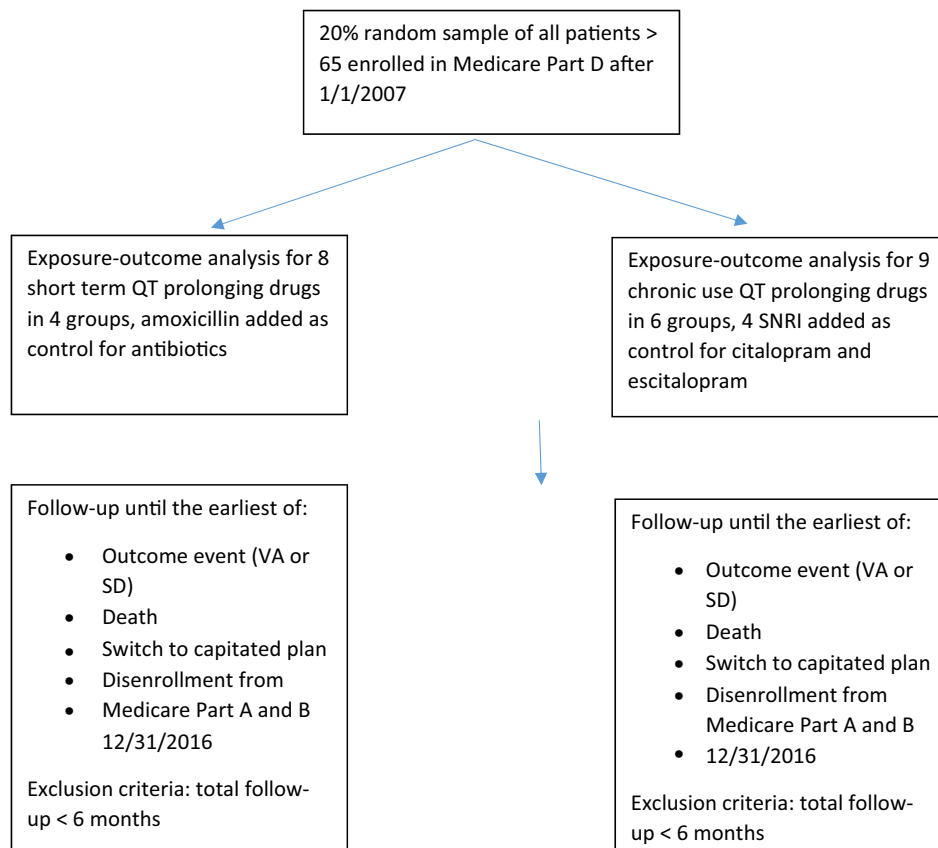
Our study population came from a 20% random sample of the Medicare beneficiaries who first enrolled in Medicare after 1 January 2007 (the first full year of prescription drug—Part D coverage) and after reaching the age of 65 years (Fig. 1). Individuals became eligible for the study at their Part D entitlement. In this observational cohort study, we followed patients from their Part D enrollment (accounting for left truncation [28]) to their first record of ventricular arrhythmias (VA), sudden death (SD), death, switch to a capitated plan, disenrollment from Medicare, or end of 2016, whichever came first. To ensure that all patients have been followed up for a meaningful period, we excluded patients with less than 6 months of follow-up. To ensure we have full inpatient and outpatient claims data, we censored patients when they dis-enrolled from Parts A (hospital insurances) and B (medical insurances). We used 10 years of de-identified Medicare claims data from 1 January 2007 through 31 December 2016 from the CMS

VRDC (Virtual Research Data Center) system. This study was exempted from human subject research review by the Office of Human Subjects Research Protections, National Institutes of Health.

2.2 Drugs, Controls, and Exposure Definition

We identified select drugs known to have a risk of TdP based on a list obtained from the CredibleMeds online resource in February 2019. To date, all of drugs in this study are still on the list [15, 29]. We chose from drugs that had not been withdrawn from the US market. These drugs were extracted using generic names from Part D prescription claims data. We excluded the antiarrhythmic drugs from our analysis because one of our outcome events, ventricular arrhythmia, might be the indication for which these drugs were prescribed. We excluded drugs or drug classes that were taken by less than 1% of the study population because of the lack of statistical power. Of the 48 drugs with known TdP risk, ten had been withdrawn from the US market, nine were antiarrhythmics and 12 had low usage. The full list of drugs can be found in the Online Supplementary Material (OSM), S1. For the remaining 17 drugs, we did separate

Fig. 1 Schematic diagram of cohort and analysis



VA - ventricular arrhythmias; SD - sudden death; SNRI - serotonin-norepinephrine reuptake inhibitor

analyses for short-term versus chronic-usage drugs because of their different prescription patterns, risk profiles, and possible cumulative effects. We used 30 days in the median days of supply (OSM, S2) as the cut-off to distinguish between short-term and chronic-usage drugs. We studied eight short-term drugs in one analysis—three fluoroquinolone antibacterials (ciprofloxacin, levofloxacin, and moxifloxacin, analyzed individually), three macrolide antibacterials (azithromycin, clarithromycin, and erythromycin, analyzed individually), one antifungal (fluconazole), and one antiemetic (ondansetron). We added amoxicillin as a control for the antibacterials. We studied nine chronic usage drugs in a separate analysis—two selective serotonin reuptake inhibitor (SSRI) antidepressants (citalopram and escitalopram, analyzed individually), three antipsychotics (haloperidol, thioridazine, and chlorpromazine, analyzed as a group because of the small number of patients), two phosphodiesterase inhibitors (PDEIs; cilostazol and anagrelide, analyzed as a group because of the small number of patients), one anti-rheumatic drug (hydroxychloroquine), and one anti-Alzheimer drug (donepezil). We added four serotonin-norepinephrine reuptake inhibitor (SNRI) antidepressants that did not have a known risk of TdP as control for the SSRI antidepressants. We matched the selected drugs to the CMS data using their generic drug names. We only included systemic dose forms (e.g., tablet, capsule, vial) and excluded topical and non-systemic dose forms (e.g., ointment, eye drop).

We considered that patients were using a study drug from the date of dispensing to the end of supply date. To compensate for drug stockpiling (i.e., patients may still be on a drug even though they have apparently run out, because they have accumulated excess supply), we added an extra 10 days for short-term drugs and 30 days for chronic-use drugs after the end of supply date. The extra days represented the median days of supply for most short-term and chronic-use drugs, respectively. A patient's drug use status was constantly updated throughout the follow-up period whenever an outcome event occurred. Drug-usage status was categorized into three mutually exclusive categories as current, former, and never users based on the time since last day of supply. For short-term drugs, a patient's usage status was defined as current user from the prescription day to 10 days after the last day of supply. If the prescription was not renewed, the patient would become a former user. Never users were patients who never had a prescription for the drug. For chronic-use drugs, current usage covered the period from prescription date to within 30 days of the last day of supply. For chronic-usage drugs, in order to study the possible cumulative effect, we further divided current users into two sub-groups: patients with > 12 months or ≤ 12 months of prior cumulative usage. The median days of supply and daily doses of study and control drugs are available as OSM, S3.

2.3 Outcome Events and Co-Morbidities

Our primary outcome was a composite of ventricular arrhythmias (VAs) and/or sudden death (SD). These events were identified by diagnosis codes—ICD-9-CM (before October 2015) and ICD-10-CM (after October 2015), regardless of whether they were used as the principal or secondary diagnoses. The respective ICD-9-CM/ICD-10-CM codes were—VA: Paroxysmal ventricular tachycardia (427.1/I47.2), Ventricular fibrillation (427.41/I49.01) and Ventricular flutter (427.42/I49.02); SD: Cardiac arrest (427.5/I46.9) and Instantaneous death (798.1, no corresponding code in ICD-10-CM). Since the conditions leading to cardiac arrest and instantaneous death were heterogeneous and could include non-cardiac causes, we did a secondary analysis with VA alone as outcome.

To account for the effect of co-morbidities, we used the CMS Chronic Conditions Warehouse (CCW) co-morbidity flags to identify 46 chronic conditions with > 1% prevalence. Some of these co-morbidities were known to be risk factors for drug-induced TdP (e.g., heart failure, liver and kidney diseases). We added two other risk factors not covered by the CCW flags—electrolyte imbalance (including hypokalemia) and bradycardia, identified by ICD codes. We did not include congenital long QT syndrome as a covariate in our analysis because of the low incidence (0.4% of patients).

2.4 Statistical Analysis

For our primary analysis, we used two separate Cox regression models to explore the independent effect of short-term and chronic-usage drugs on the outcomes. To account for demographic, socioeconomic, and geographic variations, we included these patient characteristics as co-variables—gender, race, degree of low-income subsidy (as a surrogate for income), rural residence indicator, and year of Part D entry (as a surrogate for age, since most patients enrolled at 65 years of age). We also included all the CCW co-morbidity flags described above as proxies for a patient's medical burdens and TdP risk. To minimize the immortal time bias we treated all drug usage and patient characteristics (except gender, race, and year of Part D entry) as time-varying covariates [30, 31]. This means that drug-usage status is determined repeatedly at each event time throughout the analysis, based on prescription history at that time. At any point in time, a patient can be only one of current, former, or past user for a particular drug, but their usage status will change with time. We did not consider drug dosage as a covariate because of sample-size limitation. To compensate for the imbalance in covariate distribution among drug groups, we used a propensity score (PS) weighting method. We derived two sets of PS weightings for short-term and chronic drug-usage patterns. Creating all possible combinations of drugs

would significantly reduce the sample size in each group. We decided on four mutually exclusive treatment groups for short term drugs: (1) only antibiotics, (2) only non-antibiotics, (3) both antibiotics and non-antibiotics, and (4) none. Then we estimated PS for the treatment groups based on patient demographics and co-morbidities, using a multinomial logistic regression [32]. Similarly, we used seven mutually exclusive groups for the chronic-usage drugs: (1) antidepressants only, (2) antipsychotics only, (3) PDE3 inhibitors only, (4) hydroxychloroquine only, (5) donepezil only, (6) any combination of the five groups, and (7) none. Patient characteristics before and after PS adjustment are available as OSM, S4, S5a, and S5b. Cox regression analyses were weighted by the inverse propensity score [33]. To assess the impact of possible immortal time bias due to the exclusion of patients with less than 6 months' follow-up, we did a sensitivity analysis without this exclusion. All analyses were performed using SAS Enterprise Guide software.

3 Results

3.1 Study Population

From our 20% random sample of Medicare enrollees, 1,265,921 patients satisfied all our selection criteria (Table 1). Starting with their part D enrollment, these patients had a median follow-up of 3.7 years, giving a total of 5,120,909 patient-years. Follow-up ended when they developed an outcome event (3.1%), died (4.2%), switched to a capitated plan (13.9%), or reached the end of our study (78.9%). The proportion of female was 58.5%. Non-Hispanic White and African American made up 81.4% and 7.2%, respectively. About 19% of patients were of low income, either dually enrolled to Medicare and Medicaid, or receiving a low-income subsidy. Rural residents made up 22.8%. Among the short-term study drugs, azithromycin was the most common and used by 35.3% of patients. The control drug amoxicillin was used by 40%. Among the chronic usage study drugs, citalopram was the most common (6.1%) followed by escitalopram (5.1%). The SNRI antidepressant control drugs were used by 6.8% of patients. The three most commonly observed proarrhythmic co-morbidities were ischemic heart disease (28.3%), hypothyroidism (20.7%), and chronic kidney disease (19.1%).

3.2 Short-Term Drugs

Among the fluoroquinolones, levofloxacin and moxifloxacin both showed increased risks for the primary outcome, i.e., VA and/or SD. Levofloxacin use increased the risk by 51% (hazard ratio (HR) = 1.51; 95% confidence interval (CI) 1.44–1.57) compared to never users, 63% (HR 1.63;

95% CI 1.56–1.70) compared to former users, and 51% (HR 1.51; 95% CI 1.42–1.61) compared to amoxicillin controls (Table 2). Moxifloxacin use increased the risk by 23% (HR 1.23; 95% CI 1.03–1.45) compared to never users, 35% (HR 1.35; 95% CI 1.13–1.60) compared to former users, and 23% (HR 1.23; 95% CI 1.03–1.46) compared to amoxicillin controls. Ciprofloxacin use increased risk by 30% (HR 1.30; 95% CI 1.24–1.36) compared to former users, but no difference from amoxicillin controls or never users.

Among the macrolides, erythromycin had increased risk of 63% (HR 1.63; 95% CI 1.32–2.02) compared to never users, 95% (HR 1.95; 95% CI 1.57–2.43) compared to former users, and 63% (HR 1.63; 95% CI 1.23–2.03) compared to amoxicillin controls. The only significant result for azithromycin user was an increased risk of 22% (HR 1.22; 95% CI 1.16–1.28) when compared to former users. For clarithromycin, there was a 21% (HR 0.79; 95% CI 0.66–0.95) reduced risk compared to never users and a 21% (HR 0.79; 95% CI 0.66–0.96) reduced risk compared to amoxicillin controls, and no significant difference from former users.

For the control antibiotic amoxicillin, current users was not associated with increased or decreased risk when compared to never users. There was an increased risk of 24% (HR 1.24; 95% CI 1.19–1.29) compared with former users.

Both fluconazole and ondansetron showed increased risks. Fluconazole use increased the risk by 123% (HR 2.23; 95% CI 2.15–2.32) compared to never users and 58% (HR 1.58; 95% CI 1.53–1.65) compared to former users. Ondansetron use increased the risk by 205% (HR 3.05; 95% CI 2.96–3.14) compared to never users and 77% (HR 1.77; 95% CI 1.72–1.83) compared to former users.

As for demographic factors, being female reduced the risk by 30% (HR 0.70; 95% CI 0.69–0.70, see Sect. 4 for interpretation in relation to drug usage). Younger patients (newer enrollment to Part D) had reduced risk. The risk was increased for African Americans by 13% (HR 1.13; 95% CI 1.11–1.14), while other races had decreased risks compared to Whites. Lower income (either dually enrolled for Medicare and Medicaid or on low-income subsidy) was associated with increased risk while rural residence had a small protective effect. All the known proarrhythmic co-morbidities (except hypothyroidism) were associated with increased risks. Among other commonly occurring co-morbidities that were not specifically identified as proarrhythmic, hypertension, anemia, diabetes, depression, and obesity were associated with increased risks.

For the secondary outcome (i.e., VA only), the trends generally mirrored the primary outcome (i.e., VA and SD). The exceptions were that the following comparisons became non-significant: moxifloxacin current versus never user, clarithromycin versus amoxicillin, African American versus White, and other ethnicity versus White. Three comparisons that showed no effect on VA and SD

Table 1 Study population, drugs, and co-morbidities

	No. of patients (%)
Total	1,265,921 (100)
Follow-up ended at	
1. Ventricular arrhythmias (VA) and/or sudden death (SD)	38,911 (3.1)
2. Death	52,979 (4.2)
3. Switch to capitated plan	175,829 (13.9)
4. Disenrollment from Medicare or end of study	994,202 (78.9)
**Median length of follow-up 3.7 years, total 5,120,909 patient-years, median age at part D entry 65.0 years, median age at end of follow-up 69.4 years	
Demographics	
Female	741,024 (58.5)
White	1,029,962 (81.4)
African American	90,865 (7.2)
Hispanic	69,848 (5.5)
Asian	32,152 (2.5)
Other	43,094 (3.4)
Dual Medicare and Medicaid	207,021 (16.4)
Non-dual, on low-income subsidy	32,776 (2.6)
Rural residence	288,307 (22.8)
Drug exposure—short-term drugs	
Ciprofloxacin	343,320 (27.1)
Levofloxacin	239,083 (18.9)
Moxifloxacin	26,528 (2.1)
Azithromycin	446,943 (35.3)
Clarithromycin	54,805 (4.3)
Erythromycin	11,695 (0.9)
Fluconazole	116,539 (9.2)
Ondansetron	116,149 (9.2)
Amoxicillin (control)	505,805 (40)
Drug exposure—chronic-usage drugs	
Citalopram	77,558 (6.1)
Escitalopram	65,142 (5.1)
Antipsychotics	5,359 (0.4)
Phosphodiesterase (PDE3) inhibitors	7,711 (0.6)
Hydroxychloroquine	17,201 (1.4)
Donepezil	19,853 (1.6)
SNRI antidepressants (control)	86,098 (6.8)
Proarrhythmic risk factors	
Ischemic heart disease	358,876 (28.3)
Hypothyroidism	262,066 (20.7)
Chronic kidney disease	241,813 (19.1)
Bradycardia	173,661 (13.7)
Electrolyte imbalance (including hypokalemia)	156,606 (12.4)
Heart failure	142,555 (11.3)
Liver disease and cirrhosis	85,854 (6.8)
Acute myocardial infarction	25,561 (2.0)

showed reduced risk for VA only: ciprofloxacin current versus never user, amoxicillin current versus never user, and clarithromycin current versus former user. The

sensitivity analysis without exclusion of patients with < 6 months' follow-up showed no significant change in the results.

Table 2 Results for short-term drugs

Treatment category	Reference group	VA and/or SD HR (95% CI)	VA HR (95% CI)
Current vs. never user			
Ciprofloxacin current user	Never user	1.00 (0.95–1.05)	0.93 (0.87–0.99)
Levofloxacin current user	Never user	1.51 (1.44–1.57)	1.28 (1.20–1.36)
Moxifloxacin current user	Never user	1.23 (1.03–1.45)	1.18 (0.95–1.47)
Azithromycin current user	Never user	0.98 (0.93–1.03)	0.99 (0.93–1.05)
Clarithromycin current user	Never user	0.79 (0.66–0.95)	0.73 (0.58–0.92)
Erythromycin current user	Never user	1.63 (1.32–2.02)	1.83 (1.42–2.36)
Amoxicillin (control) current user	Never user	1.00 (0.96–1.04)	0.93 (0.88–0.98)
Fluconazole current user	Never user	2.23 (2.15–2.32)	2.07 (1.97–2.17)
Ondansetron current user	Never user	3.05 (2.96–3.14)	2.99 (2.88–3.10)
Antibiotics vs. control			
Ciprofloxacin current user	Amoxicillin current user	1.00 (0.94–1.07)	1.00 (0.92–1.09)
Levofloxacin current user	Amoxicillin current user	1.51 (1.42–1.61)	1.38 (1.27–1.50)
Moxifloxacin current user	Amoxicillin current user	1.23 (1.03–1.46)	1.28 (1.02–1.60)
Azithromycin current user	Amoxicillin current user	0.98 (0.92–1.05)	1.07 (0.98–1.16)
Clarithromycin current user	Amoxicillin current user	0.79 (0.66–0.96)	0.79 (0.62–1.00)
Erythromycin current user	Amoxicillin current user	1.63 (1.32–2.03)	1.98 (1.52–2.56)
Current vs. former use			
Ciprofloxacin current user	Former user	1.30 (1.24–1.36)	1.21 (1.14–1.29)
Levofloxacin current user	Former user	1.63 (1.56–1.70)	1.43 (1.35–1.52)
Moxifloxacin current user	Former user	1.35 (1.13–1.60)	1.36 (1.09–1.69)
Azithromycin current user	Former user	1.22 (1.16–1.28)	1.21 (1.13–1.28)
Clarithromycin current user	Former user	0.85 (0.71–1.02)	0.76 (0.60–0.96)
Erythromycin current user	Former user	1.95 (1.57–2.43)	2.09 (1.61–2.73)
Amoxicillin current user	Former user	1.24 (1.19–1.29)	1.14 (1.08–1.21)
Fluconazole current user	Former user	1.58 (1.53–1.65)	1.45 (1.38–1.52)
Ondansetron current user	Former user	1.77 (1.72–1.83)	1.83 (1.76–1.90)
Demographics			
Female	Male	0.70 (0.69–0.70)	0.70 (0.69–0.71)
Part D since 2008	Part D since 2007	0.98 (0.96–1.00)	1.01 (0.99–1.03)
Part D since 2009	Part D since 2007	0.98 (0.96–1.00)	0.91 (0.89–0.94)
Part D since 2010	Part D since 2007	0.87 (0.85–0.88)	0.87 (0.85–0.90)
Part D since 2011	Part D since 2007	0.84 (0.82–0.85)	0.82 (0.80–0.85)
Part D since 2012	Part D since 2007	0.78 (0.76–0.79)	0.76 (0.74–0.78)
Part D since 2013	Part D since 2007	0.67 (0.66–0.69)	0.64 (0.62–0.66)
Part D since 2014	Part D since 2007	0.58 (0.57–0.59)	0.56 (0.55–0.58)
Part D since 2015	Part D since 2007	0.59 (0.57–0.61)	0.58 (0.56–0.60)
African American	White	1.13 (1.11–1.14)	1.02 (1.00–1.05)
Hispanic	White	0.78 (0.77–0.80)	0.71 (0.69–0.73)
Asian	White	0.81 (0.78–0.84)	0.73 (0.70–0.77)
Other	White	0.96 (0.93–0.99)	0.97 (0.93–1.01)
Ever dual	Non dual no LIS	1.04 (1.03–1.06)	0.98 (0.96–1.00)
Non-dual, LIS	Non dual no LIS	1.45 (1.42–1.48)	1.10 (1.07–1.14)
Living in rural areas	No	0.98 (0.97–0.99)	0.91 (0.90–0.92)
Proarrhythmic risk factors			
Ischemic heart disease	No	1.80 (1.78–1.82)	2.05 (2.02–2.08)
Hypothyroidism	No	0.97 (0.96–0.98)	0.98 (0.96–1.00)
Chronic kidney disease	No	1.35 (1.33–1.36)	1.19 (1.17–1.21)
Bradycardia	No	1.53 (1.52–1.55)	1.82 (1.79–1.85)
Electrolyte imbalance (including hypokalemia)	No	1.24 (1.22–1.26)	1.17 (1.15–1.19)
Heart failure	No	2.44 (2.41–2.47)	2.75 (2.71–2.80)
Liver disease and cirrhosis	No	1.15 (1.13–1.17)	1.13 (1.11–1.16)
Acute myocardial infarction	No	1.19 (1.17–1.22)	1.17 (1.14–1.21)

Table 2 (continued)

VA ventricular arrhythmia, SD sudden death, HR hazard ratio, CI confidence interval, LIS low-income subsidy

3.3 Chronic-Usage Drugs

Both SSRI antidepressants increased the risk for VA and SD. Current users of citalopram had increased risk of 14% (HR 1.14; 95% CI 1.11–1.16) compared to former users, 6% (HR 1.06; 95% CI 1.03–1.08) compared to SNRI (our control antidepressant) current users, and 3% (HR 1.03; 95% CI 1.02–1.05) compared to never users (Table 3). The risk was generally higher with escitalopram. Current users of escitalopram had increased risk of 31% (HR 1.31; 95% CI 1.28–1.35) compared to former users, 21% (HR 1.21; 95% CI 1.18–1.23) compared to SNRI current users, and 18% (HR 1.18; 95% CI 1.16–1.20) compared to never users. When current users were stratified according to the cumulative length of use, the risk was reduced for patients with cumulative use of 12 months or more. Compared to never users, the risk for current users of citalopram flipped from an increase of 23% (HR 1.23; 95% CI 1.20–1.26) in patients with less than 12 months of cumulative usage to a 14% (HR 0.86; 95% CI 0.85–0.88) risk reduction for patients with cumulative use of over 12 months. The same pattern was observed when citalopram was compared to SNRI, with risk flipping from an increase of 27% (HR 1.27; 95% CI 1.23–1.31) to a reduction of 12% (HR 0.88; 95% CI 0.85–0.90) with prolonged use of both drugs. For escitalopram, compared to never users, the increased risk dropped from 34% (HR 1.34; 95% CI 1.31–1.37) to 4% (HR 1.04; 95% CI 1.01–1.06) with over 12 months of cumulative use. Compared to SNRIs, the increased risk of current users of escitalopram dropped from 39% (HR 1.39; 95% CI 1.34–1.43) to 5% (HR 1.05; 95% CI 1.02–1.08) with prolonged use. Direct comparison of citalopram and escitalopram current users showed citalopram to be safer, with a reduction of risk of 13% (HR 0.87; 95% CI 0.86–0.89). The same trend was observed irrespective of the duration of cumulative use. As for SNRIs (the control drug for SSRI antidepressants), there was no consistent signal of increased or decreased risk. There was a minute reduction of risk of 2% (HR 0.98; 95% CI 0.96–0.99) in current users compared to never users, which was not observed for patients with over 12 months of cumulative use. Compared to never users, current users of SNRIs with less than 12 months of cumulative use had a slight reduction of risk of 3% (HR 0.97; 95% CI 0.94–0.99) for VA and SD, but an increase of risk of 3% (HR 1.03; 95% CI 1.00–1.06) for VA only.

For the antipsychotics, current users had an increased risk of 42% (HR 1.42; 95% CI 1.39–1.45) compared to former users, and an increased risk of 118% (HR 2.18; 95% CI 2.15–2.22) compared to never users. Similarly, for PDEIs, current users had an increased risk of 53% (HR 1.53; 95%

CI 1.51–1.55) compared to former users, and an increased risk of 156% (HR 2.56; 95% CI 2.53–2.59) compared to never users. Similar to SSRI antidepressants, for both antipsychotics and PDEIs, the risks seemed to be mitigated with longer cumulative use. For hydroxychloroquine, there was an increased risk of 68% (HR 1.68; 95% CI 1.66–1.71) when comparing current to never users, but no significant difference when compared with former users. For donepezil, there was an increased risk of 43% (HR 1.43; 95% CI 1.41–1.45) when comparing current to never users, but there was a decreased risk of 13% (HR 0.87; 95% CI 0.86–0.88) when compared with former users.

Females had a 31% (HR 0.69; 95% CI 0.68–0.70) reduction in risk, see Sect. 4). Younger patients (newer enrollment to Part D) had reduced risk. African Americans had an increased risk of 22% (HR 1.22; 95% CI 1.21–1.24) compared to Whites, while Hispanics and Asians had reduced risks of 23% (HR 0.77; 95% CI 0.75–0.78) and 45% (HR 0.55; 95% CI 0.53–0.57), respectively. Lower income was associated with increased risk, while rural residence was associated with decreased risk.

All the specific proarrhythmic risk factors were associated with increased risks. Among other co-morbidities, hypertension, anemia, and diabetes were associated with increased risks.

Results for the secondary outcome (VA alone) were mostly in agreement with the primary outcome, but with a smaller effect size. One notable exception was that for hydroxychloroquine current users compared to former users, there was a reduction in risk of 14% (HR 0.86; 95% CI 0.84–0.88) for the secondary outcome while no difference was observed for the primary outcome. Electrolyte imbalance was associated with a slightly reduced risk for the secondary outcome. The sensitivity analysis without exclusion of patients with < 6 months' follow-up showed no significant change in the results.

4 Discussion

Our study shows that CMS claims data can be a useful resource for detecting and monitoring serious arrhythmic events in QT-prolonging drugs. Among 17 drugs with known TdP risks, we are able to show increased risk in five of eight short-term drugs and all of nine chronic-use drugs. All control drugs (amoxicillin and SNRIs) were correctly identified as risk neutral. All the known patient factors for drug-induced TdP were correctly identified. In the US, Medicare is available to all citizens over 65 years of age, who are among the most vulnerable to QT prolongation

Table 3 Results for chronic-usage drugs

Treatment category	Reference group	VA and/or SD HR (95% CI)	VA HR (95% CI)
Current vs. never user			
Citalopram current user, all	Never user	1.03 (1.02–1.05)	0.99 (0.97–1.01)
Citalopram current user, CU ≤ 12 mo	Never user	1.23 (1.20–1.26)	1.05 (1.02–1.09)
Citalopram current user, CU > 12 mo	Never user	0.86 (0.85–0.88)	0.93 (0.90–0.95)
Escitalopram current user, all	Never user	1.18 (1.16–1.20)	1.16 (1.14–1.19)
Escitalopram current user, CU ≤ 12 mo	Never user	1.34 (1.31–1.37)	1.26 (1.22–1.30)
Escitalopram current user, CU > 12 mo	Never user	1.04 (1.01–1.06)	1.08 (1.05–1.11)
SNRI (control) current user, all	Never user	0.98 (0.96–0.99)	1.02 (1.00–1.04)
SNRI (control) current user, CU ≤ 12 mo	Never user	0.97 (0.94–0.99)	1.03 (1.00–1.06)
SNRI (control) current user, CU > 12 mo	Never user	0.99 (0.97–1.00)	1.01 (0.98–1.03)
Antipsychotic current user, all	Never user	2.18 (2.15–2.22)	2.36 (2.31–2.41)
Antipsychotic current user, CU ≤ 12 mo	Never user	2.62 (2.57–2.68)	3.53 (3.44–3.62)
Antipsychotic current user, CU > 12 mo	Never user	1.81 (1.77–1.86)	1.57 (1.52–1.63)
PDEI current user, all	Never user	2.56 (2.53–2.59)	2.97 (2.93–3.01)
PDEI current user, CU ≤ 12 mo	Never user	3.16 (3.11–3.20)	3.90 (3.83–3.96)
PDEI current user, CU > 12 mo	Never user	2.08 (2.05–2.11)	2.26 (2.22–2.30)
Hydroxychloroquine current user, all	Never user	1.68 (1.66–1.71)	1.55 (1.52–1.58)
Hydroxychloroquine current user, CU ≤ 12 mo	Never user	1.68 (1.64–1.71)	1.54 (1.50–1.58)
Hydroxychloroquine current user, CU > 12 mo	Never user	1.69 (1.67–1.72)	1.56 (1.53–1.59)
Donepezil current user, all	Never user	1.43 (1.41–1.45)	1.34 (1.31–1.36)
Donepezil current user, CU ≤ 12 mo	Never user	1.59 (1.57–1.62)	1.30 (1.27–1.33)
Donepezil current user, CU > 12 mo	Never user	1.29 (1.27–1.31)	1.38 (1.34–1.41)
Antidepressants comparison			
Citalopram current user, all	Citalopram former user	1.14 (1.11–1.16)	1.04 (1.01–1.07)
Escitalopram current user, all	Escitalopram former user	1.31 (1.28–1.35)	1.26 (1.22–1.30)
Citalopram current user, all	Escitalopram current user, all	0.87 (0.86–0.89)	0.85 (0.83–0.88)
Citalopram current user, CU ≤ 12 mo	Escitalopram current user, CU ≤ 12 mo	0.92 (0.89–0.95)	0.84 (0.80–0.88)
Citalopram current user, CU > 12 mo	Escitalopram current user, CU > 12 mo	0.83 (0.81–0.86)	0.86 (0.83–0.90)
Citalopram current user, all	SNRI current user, all	1.06 (1.03–1.08)	0.97 (0.95–1.00)
Citalopram current user, CU ≤ 12 mo	SNRI current user, CU ≤ 12 mo	1.27 (1.23–1.31)	1.03 (0.98–1.07)
Citalopram current user, CU > 12 mo	SNRI current user, CU > 12 mo	0.88 (0.85–0.90)	0.92 (0.89–0.95)
Escitalopram current user, all	SNRI current user, all	1.21 (1.18–1.23)	1.14 (1.11–1.18)
Escitalopram current user, CU ≤ 12 mo	SNRI current user, CU ≤ 12 mo	1.39 (1.34–1.43)	1.22 (1.17–1.27)
Escitalopram current user, CU > 12 mo	SNRI current user, CU > 12 mo	1.05 (1.02–1.08)	1.07 (1.03–1.11)
Current vs. former use of other drugs			
Antipsychotic current user, all	Former user	1.42 (1.39–1.45)	2.19 (2.13–2.25)
PDEI current user, all	Former user	1.53 (1.51–1.55)	1 2.08 (2.05–2.12)
Hydroxychloroquine current user, all	Former user	0.99 (0.97–1.00)	0.86 (0.84–0.88)
Donepezil current user, all	Former user	0.87 (0.86–0.88)	0.92 (0.90–0.94)
Demographics			
Female	Male	0.69 (0.68–0.70)	0.70 (0.69–0.70)
Part D since 2008	Part D since 2007	0.93 (0.92–0.95)	0.81 (0.79–0.82)
Part D since 2009	Part D since 2007	0.93 (0.91–0.94)	0.85 (0.84–0.87)
Part D since 2010	Part D since 2007	1.01 (1.00–1.03)	0.94 (0.92–0.95)
Part D since 2011	Part D since 2007	0.92 (0.91–0.94)	0.68 (0.67–0.70)
Part D since 2012	Part D since 2007	0.73 (0.72–0.74)	0.58 (0.57–0.59)
Part D since 2013	Part D since 2007	0.99 (0.97–1.00)	0.87 (0.85–0.89)
Part D since 2014	Part D since 2007	0.63 (0.62–0.64)	0.48 (0.47–0.49)
Part D since 2015	Part D since 2007	0.55 (0.54–0.56)	0.50 (0.49–0.52)

Table 3 (continued)

Treatment category	Reference group	VA and/or SD	VA
		HR (95% CI)	HR (95% CI)
African American	White	1.22 (1.21–1.24)	1.11 (1.09–1.13)
Hispanic	White	0.77 (0.75–0.78)	0.71 (0.69–0.72)
Asian	White	0.55 (0.53–0.57)	0.37 (0.35–0.39)
Other	White	1.61 (1.58–1.64)	1.15 (1.12–1.18)
Ever dual	Non-dual no LIS	1.03 (1.02–1.04)	1.04 (1.02–1.05)
Non-dual, LIS	Non-dual no LIS	1.60 (1.57–1.62)	1.26 (1.23–1.28)
Living in rural areas	No	0.92 (0.91–0.93)	0.77 (0.76–0.78)
Proarrhythmic risk factors			
Ischemic heart disease	No	1.54 (1.53–1.55)	1.75 (1.73–1.77)
Hypothyroidism	No	1.03 (1.02–1.04)	1.02 (1.01–1.03)
Chronic kidney disease	No	1.52 (1.51–1.53)	1.45 (1.44–1.47)
Bradycardia	No	1.50 (1.48–1.51)	1.81 (1.79–1.83)
Electrolyte imbalance (including hypokalemia)	No	1.07 (1.06–1.08)	0.97 (0.96–0.98)
Heart failure	No	2.84 (2.82–2.87)	3.21 (3.18–3.25)
Liver disease and cirrhosis	No	1.48 (1.46–1.49)	1.61 (1.59–1.63)
Acute myocardial infarction	No	1.31 (1.29–1.33)	1.27 (1.25–1.29)

VA ventricular arrhythmia, SD sudden death, HR hazard ratio, CI confidence interval, CU cumulative use, mo months, LIS low-income subsidy, SNRI serotonin-norepinephrine reuptake inhibitor, PDEI phosphodiesterase inhibitor

and its deadly consequences. Medicare beneficiaries, once enrolled, generally stay within the system, making longitudinal follow-up possible to detect rare events. It is estimated that 74% of Medicare beneficiaries are enrolled in Part D [34]. Our study included over 1.2 million patients with over 5 million patient-years of follow-up, which is among the largest of its kind.

Among the fluoroquinolones, our findings suggest that ciprofloxacin is the safest. Levofloxacin and moxifloxacin are both associated with increased risk of VA and/or SD in all comparisons (former users, never users, and amoxicillin controls). This is in line with the finding that both drugs cause QT prolongation in humans to a similar degree, more so than ciprofloxacin [22]. Ciprofloxacin is the weakest hERG (human ether-a-go-go-related gene) potassium channel blocker among the fluoroquinolones, which is considered the underlying mechanism for QT prolongation. In a large retrospective study, levofloxacin was found to be associated with significant increase in cardiovascular mortality and cardiac arrhythmia [35]. Both levofloxacin and moxifloxacin carry specific warnings about QT prolongation and VA in their product labels. In our study, ciprofloxacin is similar to amoxicillin in that there is only increased risk compared to former users, which could be an indication bias since antibiotics are prescribed for acute infective diseases that could increase the likelihood of adverse outcomes.

Among the macrolides, we did not find increased risk with azithromycin and clarithromycin. Erythromycin is consistently associated with increased risk in our study.

Multiple studies have placed erythromycin as the highest risk for cardiac arrhythmias among the macrolides [36–39]. Between azithromycin and clarithromycin, it is not clear which is safer. Other studies show conflicting results [37–42]. In our study, clarithromycin has even less risk than amoxicillin, which can be due to indication bias. Clarithromycin is the only macrolide indicated as combination therapy for eradication of *Helicobacter pylori* in patients with peptic ulcer diseases who do not have an acute infection like patients on other antibiotics.

As for the two non-antibiotic short-term drugs, fluconazole and ondansetron, our results show strong signals for their increased risks of 123–205% and 58–77% when compared to never and former users, respectively.

Among the chronic-usage drugs, we show that both SSRI antidepressants, citalopram and escitalopram, have increased risks in all comparisons—never users, former users, and SNRI controls. Escitalopram is associated with higher risk than citalopram. This is in agreement with two meta-analyses [43, 44]. Our findings are not in support of the appeal to favor escitalopram over citalopram based on the smaller degree of QT prolongation on therapeutically equivalent doses [45]. However, according to the drug labels, QT prolongation and TdP are specifically mentioned as warnings only for citalopram and not escitalopram. As for antipsychotics, our results show increased risk in comparison with former and never users, which is consistent with other studies [23].

Table 4 Effect of sex on outcome

	Female	Male
Ventricular arrhythmia and/or sudden death		
Overall	2.33%	4.12%
On any study drug	2.47%	4.24%
Not on study drug	1.92%	3.29%
OR	1.30 (95% CI 1.25–1.34)	1.10 (95% CI 1.07–1.13)
Ventricular arrhythmia		
Overall	1.58%	2.91%
On any study drug	1.65%	2.98%
Not on study drug	1.36%	2.78%
OR	1.22 (95% CI 1.16–1.27)	1.07 (95% CI 1.04–1.11)

OR odds ratio, CI confidence interval

Another interesting finding in our study is the effect of length of use of chronic drugs on risk levels. In all the chronic-usage drugs that are shown to have increased risks, the effect is lower in patients who have cumulative use of over 12 months. This shows that there is no evidence for cumulative effect in prolonged use. Several studies have shown that arrhythmogenic risks for long-term drugs are higher when the drugs are first started compared to steady users [23, 46]. It is unclear whether and how patients become less vulnerable to the cardiac side effects of the drugs on prolonged use. It is possible that patients who suffer from severe side effects early in their treatment have stopped taking the drug and never become prolonged users. Immortal time bias can also be a factor since patients have to live for 12 months to qualify as a prolonged user.

Although drug-induced TdP is sometimes regarded as an idiosyncratic event, females are considered to be more susceptible [47]. This apparently contradicts our findings. However, this has to be interpreted with care. The events we are observing, VA and SD, can have other causes besides drug-induced arrhythmia. Many of the non-drug-related causes (e.g., coronary heart disease) are more common in males. In our study, both VA and SD are overall more common in males, as shown in Table 4. This explains the overall lower hazard ratios for females in our regression models. However, for patients taking any of the study drugs, the odds ratios (ORs) for VA and SD [OR for female 1.30 (CI 1.25–1.34) vs. male 1.10 (CI 1.07–1.13)] and VA [OR for female 1.22 (CI 1.16–1.27) vs. male 1.07 (CI 1.04–1.11)] are significantly higher for females. This suggests that being female increases the risk of drug-induced arrhythmia.

Some known co-morbidities that increase the risk for drug-induced TdP are confirmed in our study. They include ischemic heart disease, electrolyte imbalance and hypokalemia, bradycardia, acute myocardial infarction, heart failure, and chronic kidney and liver disease.

As with other observational studies based on claims data, misclassification errors are a potential problem. Our study relies on ICD codes to identify the outcome events of ventricular arrhythmias and sudden death. This is not a foolproof method, but is a common method and has been shown to give a reasonably high positive predictive value of 85% (95% CI 78–91) for identifying ventricular arrhythmias and sudden death not due to extrinsic (e.g., traumatic) causes [23, 48].

We recognize the following additional limitations. We have used propensity score weighting to compensate for potential bias, but there could be other unadjusted confounders. The outcome events we studied, VA and SD, are heterogeneous conditions of which drug-induced TdP is only one of the possible causes. There are other factors that affect the risk of QT-prolonging drugs, such as dosage and drug-drug interactions, which we have not covered in our study.

5 Conclusion

Medicare data can be utilized to perform post-marketing surveillance and monitoring of the proarrhythmic risk of QT-prolonging drugs. We are able to detect increased risk for ventricular arrhythmia and sudden death in 14 out of 17 drugs with known TdP risk, as distinct from control drugs that are not associated with increased risk. Ciprofloxacin is the safest fluoroquinolone. Both azithromycin and clarithromycin are safe among the macrolides. Escitalopram is associated with higher risk than citalopram, and both drugs have increased risk compared to SNRIs.

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Declarations

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Conflict of Interest The authors declare that they have no competing interests.

Availability of Data and Material The data source used in this study can be accessed through the CMS Virtual Research Data Center.

Ethics Approval This study only involved access to de-identified patient data, and was rated as exempt from human subject research review by the Office of Human Subjects Research Protections, National Institutes of Health.

Author Contributions KWF and CJM contributed to the study conception and design. Data collection and analysis was performed by FB. All authors participated in the discussion and interpretation of the results. The first draft of the manuscript was written by KWF. All authors contributed to revision of the manuscript. All authors read and approved the final manuscript.

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