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# Non-chemotherapy drugs inducing agranulocytosis: a disproportionality analysis based on the FAERS database

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**Introduction:** Non-chemotherapy drug-induced agranulocytosis (NCDIA) is a serious adverse reaction that significantly increases the risk of life-threatening infections. Although the association between certain non-chemotherapy drugs and agranulocytosis has been documented, a comprehensive analysis using a large-scale pharmacovigilance database is lacking. This study aimed to systematically identify and characterize NCDIA by analyzing adverse event reports from the FAERS database.

**Methods:** We conducted a retrospective analysis of NCDIA reports from the FAERS database spanning from 2004 to 2024 Q1. Drugs were classified using the Anatomical Therapeutic Chemical (ATC) classification system, with chemotherapy agents (ATC code L01) excluded. The Reporting Odds Ratio (ROR) method was employed to detect potential adverse event signals. Positive signals were defined as cases with at least three reports and a lower 95% confidence interval (CI) of ROR greater than one. Time-to-event analysis was also performed to examine onset patterns across different demographic groups and drugs.

**Results:** A total of 10,913 NCDIA reports were identified from the FAERS database. Disproportionality analysis revealed significant signals for 166 non-chemotherapy drugs related to agranulocytosis, which were systematically classified into three risk categories: known (n = 111), possible (n = 25), and new potential risks (n = 30). This classification system enables us to identify drugs with known risks, those that might pose a risk, and new risks warranting further investigation. Demographic analysis revealed that females, children (<18 years), and the elderly ( $\geq$ 65 years) experienced earlier onset of agranulocytosis. Drug-specific onset timing analysis provided evidence for optimizing monitoring protocols. Notably, NCDIA-associated mortality rates showed a significant decrease from 11.91% (2004–2010) to 7.28% (2021–2024) (*P* < 0.001).

**Conclusion:** This comprehensive pharmacovigilance study not only confirmed previously known NCDIA associations but also identified new potential risk drugs. The novel risk classification system and detailed onset timing analysis provide valuable insights for clinical monitoring. The findings of earlier onset in specific

populations and declining mortality trends have important implications for developing targeted surveillance strategies and improving patient safety management.

KEYWORDS

non-chemotherapy drug, agranulocytosis, pharmacovigilance, risk classification system, clinical monitoring

## **1** Introduction

Agranulocytosis is a critical hematological disorder marked by a drastically reduced neutrophil count, with an absolute neutrophil count below  $0.5 \times 10^9$ /L (Andrès and Maloisel, 2008; Lorenzo-Villalba et al., 2020). This condition significantly elevates the risk of severe infections, posing a serious threat to patient health (Andres and Mourot-Cottet, 2017). The majority of agranulocytosis cases, approximately 70%–97%, are induced by medications (Garbe, 2007; Rattay and Benndorf, 2021). These drug-induced cases can be classified into two primary categories based on their mechanisms: chemotherapy drug-induced agranulocytosis (NCDIA) (Andres et al., 2011; Andres et al., 2019).

Chemotherapy drugs are a well-recognized cause of agranulocytosis due to their inherent mechanism of action, which involves suppressing bone marrow function by targeting rapidly dividing cells. This suppression often results in severe neutropenia, serving as a dose-limiting toxicity (Lyman et al., 2014). Managing CDIA often involves adjusting drug doses, delaying treatment, and using granulocyte-colony stimulating factors (G-CSF) to stimulate white blood cell production and reduce the risk of severe infections (Lalami and Klastersky, 2017).

In contrast, non-chemotherapy drugs encompass a wide array of medications from various therapeutic classes not typically associated with cancer treatment. These drugs can induce agranulocytosis through immunological or cytotoxic mechanisms (Andres and Mourot-Cottet, 2017). Unlike CDIA, where the risk is more clearly linked to dose and duration of treatment, NCDIA often exhibits no clear dose dependence, leading to its idiosyncratic nature. Additionally, some drugs require metabolism into active products to cause agranulocytosis, with certain cases influenced by genetic polymorphisms that produce active metabolites only under specific disease conditions (Rattay and Benndorf, 2021). This contributes to the relative rarity and unpredictability of such adverse reactions, presenting unique challenges in clinical practice. Therefore, early identification and prompt management of NCDIA are crucial to preventing severe infectious complications. Raising awareness and educating healthcare providers about the signs and symptoms of agranulocytosis, regularly monitoring blood counts in high-risk patients, and thoroughly reviewing patient history for any previous drug-induced reactions can help mitigate these risks and enhance patient safety (Curtis, 2017).

Recently, we developed the first machine learning model to predict NCDIA toxicity, which integrates molecular descriptors and chemical structure information to provide a valuable tool for assessing agranulocytosis risk in drug development and clinical monitoring (Huang et al., 2024). However, to the best of our knowledge, although the association between certain nonchemotherapy drugs and agranulocytosis has been documented, a comprehensive analysis using a large-scale pharmacovigilance database is lacking. Understanding the characteristics and risk patterns of NCDIA from a pharmacovigilance perspective is crucial for developing personalized monitoring strategies and optimizing patient safety management in clinical practice. This study aims to leverage the FAERS dataset to deepen and expand the existing knowledge on NCDIA.

## 2 Materials and methods

### 2.1 Data source

The data for this study were sourced from the FAERS database (available at https://fis.fda.gov/extensions/FPD-QDE-FAERS/FPD-QDE-FAERS.html, accessed on 15 June 2024), covering a 20-year period from 2004 to the first quarter of 2024 (2024 Q1).

# 2.2 Target adverse event and drug classification criteria

To ensure a rigorous pharmacovigilance analysis of nonchemotherapy drug-induced agranulocytosis, we established specific criteria for both adverse event identification and drug classification. For adverse event selection, we focused exclusively on the Preferred Term (PT) "Agranulocytosis" according to MedDRA version 27.0. While the Standardized MedDRA Query (SMQ) of agranulocytosis could provide a broader coverage including related conditions such as aplastic anemia, bone marrow failure, and febrile neutropenia, this focused approach was chosen to avoid potential confounding from conditions that might have different underlying mechanisms or clinical manifestations, thereby enabling a more specific analysis of druginduced agranulocytosis cases, though it may result in a more conservative estimate of case numbers. For drug classification, we employed the Anatomical Therapeutic Chemical (ATC) classification system to systematically analyze agranulocytosis adverse events (AEs) induced by non-chemotherapy drugs. Drugs coded under "L01: antineoplastic agents" were classified as chemotherapy drugs, while those with different ATC codes were categorized as non-chemotherapy drugs, allowing for a focused evaluation of their association with agranulocytosis.

### 2.3 Data extraction and processing

Data cleaning was performed in strict accordance with the FDA's official guidelines, as outlined in the flowchart in

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Supplementary Figure S1. To remove duplicate records, we selected the PRIMARYID, CASEID, and FDA\_DT fields from the DEMO table. The data were sorted by CASEID, FDA\_DT, and PRIMARYID. For reports with the same CASEID, we retained the one with the latest FDA\_DT value. If both CASEID and FDA\_DT were identical, we retained the report with the highest PRIMARYID value. Since 2019, the delete file included with each quarter's data indicates which reports need to be removed from the database. Additionally, only data related to the "primary suspect drug" were extracted and utilized for constructing the data analysis table. After data cleaning and integration, reports related to NCDIA were extracted.

Data extraction, analysis, and visualization were performed using SAS 9.4, R software (version 4.2.1), WPS Office, and Python (version 3.9.12).

# 2.4 AE signal detection and statistical analysis

In this study, we employed the Reporting Odds Ratio (ROR) method, a well-established disproportionality analysis technique in pharmacovigilance research, to detect potential AE signals (Sakaeda et al., 2013). The calculation formula for ROR and its corresponding 95% confidence interval (CI) are presented in Supplementary Table S1. A drug is considered to have a potential risk of inducing agranulocytosis if there are three or more reports of the target AE and the lower limit of the 95% CI for the ROR exceeds one. For the disproportionality analysis, the reference group consisted of all adverse event reports in FAERS after excluding reports related to chemotherapy drugs (ATC code L01) and duplicate reports, as detailed in the data processing flowchart (Supplementary Figure S1).

For statistical analysis, continuous variables were presented as median and interquartile range (IQR), and categorical variables as counts and percentages. The chi-square test was used to assess differences in categorical variables, with Bonferroni correction for pairwise mortality rate comparisons across time periods. The Mann-Whitney U test was employed for two-group comparisons of continuous variables, while the Kruskal-Wallis test followed by Dunn's test with Bonferroni correction was used for multiple group comparisons. For multiple comparisons, P values were adjusted using Bonferroni correction, and the adjusted P values were reported. For all analyses, a two-sided P value <0.05 was considered statistically significant.

### 2.5 Classification of NCDIA risk

To systematically evaluate the agranulocytosis risk of identified drugs, we developed a three-tier classification system. Drugs were categorized based on literature review of Micromedex (assessed on 14 July 2024), the SIDER database (Kuhn et al., 2016) (assessed on 15 July 2024), and relevant published reviews (Andersohn et al., 2007; Garbe, 2007; Andres and Mourot-Cottet, 2017; Andres and Maloisel, 2008; Coates, 2024). Drugs were classified as: (1) "Known NCDIA": drugs with documented "agranulocytosis" as an adverse effect in any of these sources; (2) "Possible NCDIA": drugs without documented agranulocytosis but with records of other hematologic adverse

reactions in Micromedex involving decreased white blood cell or neutrophil counts (e.g., febrile neutropenia, neutropenia, leukopenia, decreased white blood cell count, aplastic anemia); (3) "New Potential NCDIA": drugs without documented hematologic adverse effects.

## **3** Results

# 3.1 Basic information on patient characteristics

From 2004 to 2024 Q1, the FAERS database recorded a total of 44472692 AE reports related to non-chemotherapy drugs. Among these, 10,913 reports involving 10,913 patients were associated with NCDIA. The basic characteristics of patients with NCDIA are provided in Supplementary Table S2. As illustrated in Figure 1A, the reporting ratio of NCDIA is similar between genders, with 45.92% of reports involving females and 46.66% involving males (7.42% unknown), indicating no significant gender bias in NCDIA occurrence (P =0.420). The median age of patients was 57 years (IQR: 39-71), with elderly patients (age  $\geq 65$ , n = 3351, 30.71%) showing a significantly higher reporting proportion compared to other age groups (all P <0.001, Bonferroni-adjusted) (Figure 1B). The majority of reports were submitted by physicians, accounting for 45.49% of NCDIA cases (Figure 1C). Regarding geographical distribution, France contributed the highest number of reports, making up 27.09% (n = 2956) of the total (Figure 1D). In terms of patient outcomes, NCDIA resulted in serious adverse outcomes, with 21.83% (n = 2382) of cases being lifethreatening and 9.68% (n = 1056) of cases resulting in patient deaths (Figure 1E). As shown in Figure 1F, the number of NCDIA reports surged in 2023, reaching a historical high of 1079 cases.

## 3.2 Non-chemotherapy drugs and drug classes associated with agranulocytosis

Among the 10,913 reports associated with NCDIA, a total of 166 non-chemotherapy drugs were identified with a positive AE signal, as detailed in Supplementary Table S3. Figure 2 provides an overview of the top 20 drugs with the highest number of target reports (Figure 2A) and highest ROR values (Figure 2B). The top five non-chemotherapy drugs, based on the number of reports, are Clozapine (n = 1742, ROR = 33.86), followed by Mycophenolic Acid (n = 299, ROR = 6.84), Pantoprazole (n = 232, ROR = 9.52), Ibuprofen (n = 217, ROR = 4.30), and Olanzapine (n = 211, ROR = 4.74). When considering ROR values, Metamizole has the highest ROR (n = 18, ROR = 233.19), followed by Levamisole (n = 3, ROR = 182.48), Thiamazole (n = 202, ROR = 147.24), Deferiprone (n = 139, ROR = 117.32), and Propylthiouracil (n = 45, ROR = 71.83). Overall, a higher ROR value suggests a greater risk of the drug causing agranulocytosis, underscoring the need for heightened vigilance regarding these high-risk drugs in clinical practice.

In addition, we assessed the risk of agranulocytosis across different drug classes based on the second level of the ATC code. A total of 20 drug classes were identified as high-risk for agranulocytosis, encompassing 112 drugs with positive AE signals. This means that the remaining 54 drugs with positive AE signals belong to classes not considered high-risk for



agranulocytosis. The results for non-chemotherapy drug classes with positive AE signals, ranked by ROR, are presented in Figure 3A and further illustrated in the bubble chart in Figure 3B. The class with the highest risk of agranulocytosis is P02 (Anthelmintics), with an ROR of 12.16 and three drugs identified with positive signals (Albendazole, Mebendazole, and Levamisole). Other classes with significant ROR values include J01 (Antibacterials for Systemic Use), M04 (Antigout Preparations), N05 (Psycholeptics), and P01 (Antiprotozoals), each with an ROR value exceeding 5. This indicates that these drug classes are associated with a higher risk of agranulocytosis.

# 3.3 Identifying non-chemotherapy drugs with new potential agranulocytosis risk

To better understand and characterize the risk profile of drugs associated with NCDIA, we analyzed the 166 drugs with positive

Drug name	ATC code	Number of reports	ROR	95%CI	B	Drug name	ATC code	Number of reports	ROR	95%CI
Clozapine	N05	1742	33.86	32.17-35.65		Metamizole	N02	18	233.19	144.97-375.12
Mycophenolic Acid	L04	299	6.84	6.10-7.67		Levamisole	P02	3	182.48	57.39-580.24
Pantoprazole	A02	232	9.52	8.36-10.84		Thiamazole	H03	202	147.24	127.80-169.64
Ibuprofen	C01	217	4.30	3.76-4.92		Deferiprone	V03	139	117.32	99.01-139.01
Olanzapine	N05	211	4.74	4.13-5.43		Propylthiouracil	H03	45	71.83	53.46-96.50
Thiamazole	H03	202	147.24	127.80-169.64		Ceftaroline	J01	3	61.13	19.55-191.18
Valaciclovir	J05	190	19.17	16.61-22.14		Chlorpropamide	A10	3	56.34	18.03-176.09
Quetiapine	N05	142	2.01	1.71-2.38		Ceftaroline Fosamil	J01	16	49.31	30.11-80.75
Deferiprone	V03	139	117.32	99.01-139.01		Oxacillin	J01	8	47.34	23.57-95.07
Esomeprazole	A02	125	1.96	1.64-2.34		Ticlopidine	B01	27	37.78	25.85-55.21
Sulfasalazine	A07	120	21.78	18.18-26.08		Clozapine	N05	1742	33.86	32.17-35.65
Levetiracetam	N03	117	3.27	2.73-3.93		Valganciclovir	J05	81	30.41	24.42-37.88
Pregabalin	N02	114	1.26	1.05-1.51		Flumazenil	V03	5	30.28	12.56-73.01
Azithromycin	D10	110	6.25	5.18-7.54		Cefotaxime	J01	26	29.57	20.09-43.51
Amlodipine	C08	108	2.49	2.06-3.02		Atovaquone	P01	21	24.46	15.92-37.58
Amoxicillin	J01	105	5.77	4.76-6.99		Norfloxacin	D06	6	22.84	10.23-50.96
Atorvastatin	C10	101	1.76	1.44-2.14		Isoniazid;Rifampicin	J04	7	22.74	10.82-47.81
Lansoprazole	A02	100	4.47	3.67-5.45		Sulfasalazine	A07	120	21.78	18.18-26.08
Lamotrigine	N03	99	2.17	1.78-2.64		Doripenem	J01	5	20.77	8.63-50.03
Piperacillin: Tazobactam	J01	98	15.97	13.08-19.49		Valaciclovir	J05	190	19.17	16.61-22.14

FIGURE 2

The top 20 drugs with the highest number of target reports (A) and highest ROR values (B).

ATC code	Drug classification	Positive signal drug counts	Number of reports	ROR	95%CI
P02	Anthelmintics	3	18	12.16	7.65-19.3
J01	Antibacterials For Systemic Use	28	830	7.15	6.66-7.68
M04	Antigout Preparations	2	83	7.06	5.69-8.70
N05	Psycholeptics	7	2478	5.82	5.56-6.0
P01	Antiprotozoals	2	33	5.73	4.07-8.0
J02	Antimycotics For Systemic Use	6	88	4.88	3.96-6.0
H03	Thyroid Therapy	2	270	4.65	4.12-5.2
V03	All Other Therapeutic Products	3	180	4.47	3.86-5.1
D01	Antifungals For Dermatological Use	2	92	4.18	3.41-5.1
A07	Antidiarrheals, Intestinal Antiinflammatory/Antiinfective Agents	4	307	3.45	3.08-3.8
J04	Antimycobacterials	3	23	3.23	2.14-4.8
C03	Diuretics	3	131	2.78	2.34-3.3
D06	Antibiotics And Chemotherapeutics For Dermatological Use	10	444	2.68	2.43-2.9
C08	Calcium Channel Blockers	2	117	2.31	1.92-2.7
N03	Antiepileptics	5	340	2.12	1.90-2.3
A02	Drugs For Acid Related Disorders	6	589	1.94	1.78-2.1
C01	Cardiac Therapy	3	287	1.90	1.69-2.1
J05	Antivirals For Systemic Use	9	463	1.63	1.49-1.7
A04	Antiemetics And Antinauseants	4	65	1.62	1.27-2.0
C09	Agents Acting On The Renin-Angiotensin System	8	263	1.20	1.07-1.3



#### FIGURE 3

Non-chemotherapy drug classes with positive AE signals based on ATC code: (A) Drug classes ranked by ROR. (B) Bubble chart illustration: This chart visually represents the number of drugs with positive AE signals across different drug classes (vertical axis), the total number of reports for each drug class (bubble size), and their respective ROR values (color intensity).

Drug name	ATC code	Number of reports	ROR	95%CI	Drug name	ATC code	Number of reports	ROR	95%CI
Doripenem	J01	5	20.77	8.63-50.03	Interferon Alfa-2A	L03	3	5.10	1.64-15.83
Valaciclovir	J05	190	19.17	16.61-22.14	Atovaquone;Proguanil	P01	6	3.42	1.54-7.62
Caspofungin	J02	20	14.16	9.12-21.97	Belatacept	L04	4	3.31	1.24-8.82
Ceftolozane;Tazobactam	J01	5	13.22	5.50-31.83	Fenofibrate	C10	12	2.90	1.64-5.10
Micafungin	J02	16	11.38	6.97-18.60	Torasemide	C03	6	2.71	1.22-6.04
Fosaprepitant	A04	10	10.41	5.59-19.36	Aztreonam	J01	13	2.67	1.55-4.60
Fosfomycin★	J01	6	9.69	4.35-21.59	Amlodipine	C08	108	2.49	2.06-3.02
Fidaxomicin	A07	7	8.29	3.95-17.41	Ribavirin	D06	39	2.37	1.73-3.24
Ursodeoxycholic Acid	A05	9	6.58	3.42-12.66	Doxycycline <del>*</del>	A01	24	2.25	1.51-3.37
Aprepitant	A04	13	6.56	3.81-11.31	Clobazam	N03	7	2.22	1.06-4.65
Repaglinide	A10	5	6.37	2.65-15.32	Valsartan	C09	40	1.69	1.24-2.31
Azithromycin 🖈	D10	110	6.25	5.18-7.54	Ciclosporin	L04	64	1.53	1.20-1.96
Deferoxamine	V03	5	5.22	2.17-12.55					
Drug name		Number of reports	ROR	95%CI	Drug name		Number of reports	ROR	95%CI
Drug name Fhunazenil	V03	5	30.28	12.56-73.01	Tigecycline	J01	6	4.44	1.99-9.89
Drug name Fhumazenil Daptomycin★	V03 J01	5 89	30.28 18.26	12.56-73.01 14.82-22.51	Tigecycline Ertapenem	J01 J01	6 7	4.44 3.96	1.99-9.89 1.89-8.31
<b>Drug name</b> Flumazenil Daptomycin★ Alfuzosin	V03 J01 G04	5 89 24	30.28 18.26 18.19	12.56-73.01 14.82-22.51 12.18-27.17	Tigecycline Ertapenem Hydroxyzine	J01 J01 A04	6 7 12	4.44 3.96 3.81	1.99-9.89 1.89-8.31 2.16-6.71
Drug name Flumazenil Daptomycin★ Alfuzosin oniazid;Pyrazinamide;Rifampicin	V03 J01 G04 J04	5 89 24 3	30.28 18.26 18.19 12.63	12.56-73.01 14.82-22.51 12.18-27.17 4.07-39.24	Tigecycline Ertapenem Hydroxyzine Clofazimine	J01 J01 A04 J04	6 7 12 5	4.44 3.96 3.81 3.67	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82
Drug name Fhunazenil Daptomycin★ Affitzosin oniazdi;Pyrazinanide;Rifampicin Metyrapone	V03 J01 G04 J04 V04	5 89 24 3 3	30.28 18.26 18.19 12.63 10.90	12.56-73.01 14.82-22.51 12.18-27.17 4.07-39.24 3.51-33.84	Tigecycline Ertapenem Hydroxyzine Clofazimine Desloratadine	J01 J01 A04 J04 D04	6 7 12 5 6	4.44 3.96 3.81 3.67 3.37	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82 1.52-7.52
Drug name Fhunazenil Daptomycin★ Alfuzosin oniazid;Pyrazinamide;Rifampicin Metyrapone Letermovir	V03 J01 G04 J04 V04 J05	5 89 24 3 3 4	30.28 18.26 18.19 12.63 10.90 9.84	12.56-73.01 14.82-22.51 12.18-27.17 4.07-39.24 3.51-33.84 3.69-26.27	Tigecycline Ertapenem Hydroxyzine Clofazimine Desloratadine Darunavir	J01 J01 A04 J04 D04 J05	6 7 12 5 6 7	4.44 3.96 3.81 3.67 3.37 3.06	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82 1.52-7.52 1.46-6.42
Drug name Flumazenil Daptomycin★ Alfuzosin oniazid;Pyrazinamide;Rifampicin Metyrapone Letermovir Acarbose	V03 J01 G04 J04 V04 J05 A10	5 89 24 3 3 4 7	30.28 18.26 18.19 12.63 10.90 9.84 7.90	12.56-73.01 14.82-22.51 12.18-27.17 4.07-39.24 3.51-33.84 3.69-26.27 3.76-16.59	Tigecycline Ertapenem Hydroxyzine Clofazimine Desloratadine Darunavir Basiliximab	J01 J01 A04 J04 D04 J05 L04	6 7 12 5 6 7 6	4.44 3.96 3.81 3.67 3.37 3.06 2.71	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82 1.52-7.52 1.46-6.42 1.22-6.04
Drug name Fhunazenil Daptomycin★ Alfuzosin oniazid;Pyrazinamide;Rifampicin Metyrapone Letermovir Acarbose Naloxone;Oxycodone	V03 J01 G04 J04 V04 J05 A10 N02	5 89 24 3 4 7 3 3	30.28 18.26 18.19 12.63 10.90 9.84 7.90 7.88	12.56-73.01 14.82-22.51 12.18-27.17 4.07-39.24 3.51-33.84 3.69-26.27 3.76-16.59 2.54-24.47	Tigecycline Ertapenem Hydroxyzine Clofazimine Desloratadine Darunavir Basiliximab Risedronic Acid	J01 J01 A04 J04 J04 J05 L04 M05	6 7 12 5 6 7 6 18	4.44 3.96 3.81 3.67 3.37 3.06 2.71 2.33	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82 1.52-7.52 1.46-6.42 1.22-6.04 1.46-3.69
Drug name Fhumazenil Daptomycin★ Alfuzosin oniazid;Pyrazinamide;Rifampicin Metyrapone Letermovir Acarbose Naloxone;Oxycodone Cilgavimab;Tixagevimab	V03 J01 G04 J04 V04 J05 A10 N02 J06	5 89 24 3 3 4 7 3 8	30.28 18.26 18.19 12.63 10.90 9.84 7.90 7.88 7.61	12.56-73.01 14.82-22.51 12.18-27.17 4.07-39.24 3.51-33.84 3.69-26.27 3.76-16.59 2.54-24.47 3.80-15.22	Tigecycline Ertapenem Hydroxyzine Clofazimine Desloratadine Darunavir Basiliximab Risedronic Acid Levocetirizine	J01 J01 A04 J04 J04 J05 L04 M05 D04	6 7 12 5 6 7 6 18 10	4.44 3.96 3.81 3.67 3.37 3.06 2.71 2.33 2.24	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82 1.52-7.52 1.46-6.42 1.22-6.04 1.46-3.69 1.20-4.17
Drug name Fhunazenil Daptomycin★ Alfuzosin oniazid;Pyrazinamide;Rifampicin Metyrapone Letermovir Acarbose Naloxone;Oxycodone Cilgavimab;Tixagevimab Silodosin	V03 J01 G04 J04 V04 J05 A10 N02 J06 G04	5 89 24 3 3 4 7 3 8 6	30.28 18.26 18.19 12.63 10.90 9.84 7.90 7.88 7.61 6.30	12.56-73.01 14.82-22.51 12.18-27.17 4.07-39.24 3.51-33.84 3.69-26.27 3.76-16.59 2.54-24.47 3.80-15.22 2.83-14.03	Tigecycline Ertapenem Hydroxyzine Clofazimine Desloratadine Darunavir Basilikimab Risedronic Acid Levocetirizine Tamsulosin	J01 J01 A04 J04 J05 L04 M05 D04 G04	6 7 12 5 6 7 6 18 10 19	4.44 3.96 3.81 3.67 3.37 3.06 2.71 2.33 2.24 2.00	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82 1.52-7.52 1.46-6.42 1.22-6.04 1.46-3.69 1.20-4.17 1.27-3.13
Drug name Fhunazenl Daptomycin★ Aftizosin oniazid;Pyrazinamide;Rifampicin Metyrapone Letermovir Acarbose Naloxone;Oxycodone Cilgavimab;Tixagevimab Silodosin Paracetamol;Tramadol	V03 J01 G04 J04 V04 J05 A10 N02 J06 G04 N02	5 89 24 3 3 4 7 3 8 6 18	30.28   18.26   18.19   12.63   10.90   9.84   7.90   7.88   7.61   6.30   6.27	12.56-73.01 14.82-22.51 12.18-27.17 4.07-39.24 3.51-33.84 3.69-26.27 3.76-16.59 2.54-24.47 3.80-15.22 2.83-14.03 3.94-9.95	Tigecycline Ertapenem Hydroxyzine Clofazimine Desloratadine Darunavir Basiliximab Risedronic Acid Levocetirizine Tamsulosin Atorvastatin	J01 J01 A04 J04 J05 L04 M05 D04 G04 C10	6 7 12 5 6 7 6 18 10 19 10	4.44 3.96 3.81 3.67 3.37 3.06 2.71 2.33 2.24 2.00 1.76	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82 1.52-7.52 1.46-6.42 1.22-6.04 1.46-3.69 1.20-4.17 1.27-3.13 1.44-2.14
Drug name Fhunazenil Daptomycin★ Alfuzosin oniazid;Pyrazinamide;Rifampicin Metyrapone Letermovir Acarbose Naloxone;Oxycodone Cilgavimab;Tixagevimab Silodosin Paracetamol;Tramadol Nicardipine	V03 J01 G04 J04 V04 J05 A10 N02 J06 G04 N02 C08	5 89 24 3 3 4 7 3 8 6 18 4	30.28   18.26   18.19   12.63   10.90   9.84   7.90   7.88   7.61   6.30   6.27   6.13	12.56-73.01 14.82-22.51 12.18-27.17 4.07-39.24 3.51-33.84 3.69-26.27 3.76-16.59 2.54-24.47 3.80-15.22 2.83-14.03 3.94-9.95 2.30-16.34	Tigecycline Ertapenem Hydroxyzine Clofazimine Darunavir Basiliximab Risedronic Acid Levocetirizine Tamsulosin Atorvastatin Ocrelizumab★	J01 J01 J04 J04 J05 L04 M05 D04 G04 C10 L04	6 7 12 5 6 7 6 18 10 19 19 10	4.44 3.96 3.81 3.67 3.37 3.06 2.71 2.33 2.24 2.00 1.76 1.67	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82 1.52-7.52 1.46-6.42 1.22-6.04 1.46-3.69 1.20-4.17 1.27-3.13 1.44-2.14 1.29-2.16
Drug name Fhunazenil Daptomycin★ Alfiuzosin oniazid;Pyrazinamide;Rifampicin Metyrapone Letermovir Acarbose Naloxone;Oxycodone Cilgavimab;Tixagevimab Silodosin Paracetamol;Tiramadol Nicardipine Enoxaparin★	V03 J01 G04 J04 V04 J05 A10 N02 J06 G04 N02 C08 B01	5 89 24 3 3 4 7 3 8 6 18 4 72	30.28   18.26   18.19   12.63   10.90   9.84   7.90   7.88   7.61   6.30   6.27   6.13   5.93	$\begin{array}{c} 12.56-73.01\\ 14.82-22.51\\ 12.18-27.17\\ 4.07-30.24\\ 3.51-33.84\\ 3.69-26.27\\ 3.76-16.59\\ 2.54-24.47\\ 3.80-15.22\\ 2.83-14.03\\ 3.94-9.95\\ 2.30-16.34\\ 4.70-7.47\\ \end{array}$	Tigecycline Ertapenem Hydroxyzine Clofazimine Dasloratadine Darunavir Basiliximab Risedronic Acid Levocetirizine Tamsulosin Atorvastatin Ocrelizumab★ Tramadol	J01 J01 A04 J04 D04 J05 L04 M05 D04 G04 C10 L04 N02	6 7 12 5 6 7 6 18 10 19 19 10 19 58 46	4.44 3.96 3.81 3.67 3.37 3.06 2.71 2.33 2.24 2.00 1.76 1.67 1.66	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82 1.52-7.52 1.46-6.42 1.22-6.04 1.46-3.69 1.20-4.17 1.27-3.13 1.44-2.14 1.29-2.16
Drug name Fhunazenil Daptomycin★ Alfuzosin oniazid;Pyrazinamide;Rifampicin Metyrapone Letermovir Acarbose Naloxone;Oxycodone Cilgavimab;Tixagevimab Silodosin Paracetamol;Tramadol Nicardipine	V03 J01 G04 J04 V04 J05 A10 N02 J06 G04 N02 C08	5 89 24 3 3 4 7 3 8 6 18 4	30.28   18.26   18.19   12.63   10.90   9.84   7.90   7.88   7.61   6.30   6.27   6.13	12.56-73.01 14.82-22.51 12.18-27.17 4.07-39.24 3.51-33.84 3.69-26.27 3.76-16.59 2.54-24.47 3.80-15.22 2.83-14.03 3.94-9.95 2.30-16.34	Tigecycline Ertapenem Hydroxyzine Clofazimine Darunavir Basiliximab Risedronic Acid Levocetirizine Tamsulosin Atorvastatin Ocrelizumab★	J01 J01 J04 J04 J05 L04 M05 D04 G04 C10 L04	6 7 12 5 6 7 6 18 10 19 19 10	4.44 3.96 3.81 3.67 3.37 3.06 2.71 2.33 2.24 2.00 1.76 1.67	1.99-9.89 1.89-8.31 2.16-6.71 1.53-8.82 1.52-7.52 1.46-6.42 1.22-6.04 1.46-3.69 1.20-4.17 1.27-3.13 1.44-2.14 1.29-2.16

Non-chemotherapy drugs with new potential agranulocytosis risk: (A) "Possible NCDIA" drugs ranked by ROR values. (B) "New Potential NCDIA" drugs ranked by ROR values. Drugs with agranulocytosis case reports are marked with red asterisks.

signals using a novel three-tier classification system (Known NCDIA, Possible NCDIA, and New Potential NCDIA) as introduced in the Methods section. This classification system enables us to identify drugs with known risks, those that might pose a risk, and new risks warranting further investigation. Among the drugs analyzed, 111 were categorized as "Known NCDIA", 25 as "Possible NCDIA", and 30 as "New Potential NCDIA." The categories of 166 non-chemotherapy drugs are presented in Supplementary Table S3, with the "Possible NCDIA" drugs ranked by their ROR values in Figure 4A, and the "New Potential NCDIA" drugs shown in Figure 4B.

Additionally, we conducted a search on PubMed (assessed on 15 July 2024) for agranulocytosis case reports related to drugs in the "Possible NCDIA" and "New Potential NCDIA" categories. From the literature review, we identified four drugs in the "Possible NCDIA" category with agranulocytosis case reports: Micafungin (Ameri et al., 2019), Fosfomycin (Matusik et al., 2023), Azithromycin (Kajiguchi and Ohno, 2009), and Doxycycline (Parent-Massin et al., 1993), and five drugs in the "New Potential NCDIA" category: Daptomycin (Leyra et al., 2016), Enoxaparin (Medrano-Casique et al., 2016), Ocrelizumab (Auer et al., 2020), Metformin (Laporte et al., 2008), and Pregabalin (Kino et al., 2014). These drugs with agranulocytosis case reports are marked with red asterisks in Figure 4.

# 3.4 Time to event analysis of agranulocytosis for non-chemotherapy drugs

Among the 10,913 NCDIA reports, 5046 cases included recorded time-to-event data for agranulocytosis. Table 1 presents

the analysis of the time to onset of NCDIA, categorized by gender and age groups.

The overall median time to event for NCDIA was 22 days (IQR, 7–58), as shown in the cumulative percentage curve (Figure 5A). The box plots depicting time to event by gender and age groups are presented in Figure 5B. Notable gender differences were observed, with females showing earlier onset (median: 20 days, IQR: 7-55) compared to males (median: 23 days, IQR: 7-62; P = 0.001). Age group analysis showed marked variability in the time to onset of agranulocytosis. Patients under 18 years had a median onset time of 18 days (IQR, 4-50), those aged 18-44 years had a median of 23 days (IQR, 6-93), patients aged 45-64 years had a median of 25 days (IQR, 8-80), and those aged 65 years or older had a median of 19 days (IQR, 7-43). The Kruskal-Wallis test indicated significant differences among these age groups (P < 0.001). Further analysis using Dunn's test with Bonferroni correction identified specific significant differences between several age groups, particularly highlighting that patients under 18 and those 65 years and older had earlier onset times compared to other groups (<18 vs. 18-44: P < 0.001; <18 vs. 45–64: P < 0.001; 18–44 vs.  $\geq$  65: P < 0.001; 45–64 vs.  $\geq$ 65: P < 0.001). These results suggest that both gender and age significantly impact the onset time of agranulocytosis in patients treated with non-chemotherapy drugs. The earlier onset in females and in age groups (<18 and ≥65 years) may reflect underlying biological differences or variations in drug metabolism or immune response. Clinicians should consider these factors when monitoring patients for agranulocytosis, tailoring surveillance and intervention strategies to effectively mitigate risks.

Drug-specific analysis of cases with  $\geq 20$  reports revealed substantial variations in onset timing (Supplementary Table S4).

Category	Number of cases	Median time (IQR) (days)	Statistical test	P-value
Overall	5046	22 (7–58)	_	_
Gender			Mann-Whitney U test	0.001*
Female	2399	20 (7–55)	_	_
Male	2445	23 (7-62)	_	_
Unknown	202	_	_	_
Age group			Kruskal-Wallis test	<0.001*
<18	268	18 (4–50)	_	
18-44	1039	23 (6-93)	_	
45-64	1454	25 (8-80)	_	_
≥65	1824	19 (7-43)	_	-
Unknown	461	_	_	
Comparison of time to onset among age groups	_	_	Dunn's test with Bonferroni correction	_
<18 vs. 18-44	_	_	_	<0.001*
<18 vs. 45-64	_	_	_	<0.001*
<18 vs. ≥ 65	_	_	_	0.847
18–44 vs. 45–64	_	_	_	0.901
$18-44$ vs. $\ge 65$	_	_	_	< 0.001*
$45-64 \text{ vs.} \ge 65$	_	_	_	<0.001*

TABLE 1 Time to event of agranulocytosis for non-chemotherapy drugs by gender and age groups.

Statistical significance is marked by asterisks (\*).



Azithromycin showed the most rapid onset (median: 4 days, IQR: 2–6), while Ocrelizumab demonstrated the longest latency (median: 176 days, IQR: 86–557). Similar variations were observed among drug classes (Supplementary Table S5), with C01 (Cardiac Therapy) showing the shortest onset (median: 6 days, IQR: 2–21) and V03 (All Other Therapeutic Products) the longest (median: 73 days, IQR: 18–186). The significant variation observed in the time to onset among non-chemotherapy drugs underscores the importance of understanding these specific onset times for individual drugs and drug classes. Such insights can enhance the prediction and management of NCDIA.

### 3.5 NCDIA followed by death

During the study period, the FDA received a total of 1056 reports (9.68%) of agranulocytosis cases followed by death attributed to non-chemotherapy drugs. A summary of the death and non-death cases of NCDIA is provided in Table 2. The median age of NCDIA death patients was 65 years (IQR, 50–77), and 48.67% of these patients were female. Statistical tests showed no significant difference in gender distribution and time to onset of agranulocytosis between death and non-death cases (P = 0.070 and P = 0.126,

Category	Death cases (n = 1056)	Non-death cases (n = 9857)	Statistical test	<i>P</i> -value
Gender			Chi-squared test	0.070
Female	514 (48.67%)	4497 (45.62%)	-	_
Male	467 (44.22%)	4625 (46.92%)	_	_
Unknown	75 (7.10%)	735 (7.46%)	_	_
Age			Mann-Whitney U test	<0.001*
Median years (IQR)	65 (50–77)	55 (38–70)	_	_
Missing cases	174	1508	_	_
Time to event			Mann-Whitney U test	0.126
Median days (IQR)	28 (8-58)	21 (7–58)	_	_
Missing cases	595	5272	_	_
Year period			Chi-squared test	< 0.001*
2004-2010	262 (11.91%)	1937 (88.09%)	_	_
2011-2015	245 (10.40%)	2111 (89.60%)	_	_
2016-2020	361 (9.56%)	3414 (90.44%)	_	_
2021-2024	188 (7.28%)	2395 (92.72%)	_	_
Comparison of mortality rate			Pairwise Chi-square tests with Bonferroni correction	
2004–2010 vs. 2011–2015	_	_	_	0.687
2004–2010 vs. 2016–2020	-	-	-	0.028*
2004–2010 vs. 2021–2024	_	_	_	<0.001*
2011–2015 vs. 2016–2020	_	_	_	1.838
2011–2015 vs. 2021–2024	_	_	_	<0.001*
2016–2020 vs. 2021–2024	_	_	_	0.010*

#### TABLE 2 Summary of death and non-death cases of NCDIA.

Statistical significance is marked by asterisks (\*).

respectively). However, there was a significant difference in age between the two groups, with death cases having a higher median age compared to non-death cases (P < 0.001). This suggests that age is a significant factor in the mortality of agranulocytosis patients. Additionally, the study found a decreasing trend in the mortality rate of NCDIA from 2004 to 2024. The 20-year period was divided into four intervals: 2004–2010, 2011–2015, 2016–2020, and 2021–2024. As shown in Figure 6, the mortality rate of NCDIA decreased significantly, from 11.91% (95% CI: 10.59–13.34) in 2004–2010 to 7.28% (95% CI: 6.31–8.35) in 2021–2024 (P < 0.001).

Drug-specific mortality analysis identified eight drugs associated with  $\geq$ 20 death reports (Figure 7). While Clozapine had the highest number of death cases, its mortality rate (6.37%, 95% CI: 5.29–7.58) was the lowest among these drugs. Notably, Mirtazapine and Furosemide demonstrated the highest mortality rates (33.87%, 95% CI: 22.47%–45.61% and 31.94%, 95% CI: 21.58–42.77, respectively).



FIGURE 6

Mortality rates of NCDIA across four time periods. Statistical significance (P < 0.05) is marked by asterisks (\*), with P-values shown for comparisons between each period.

Clozapine	N05	1742	Number of death cases	6.37%	5.29-7.58
Pantoprazole	A02	232	34	14.66%	10.46-19.52
Thiamazole	H03	202	29	14.36%	9.94-19.56
Lansoprazole	A02	100	28	28.00%	19.60-36.99
Quetiapine	N05	142	25	17.61%	11.86-24.29
Furosemide	C03	72	23	31.94%	21.58-42.77
Mirtazapine	N06	62	21	33.87%	22.47-45.61
Ceftriaxone	J01	74	20	27.03%	17.52-37.43

## 4 Discussion

NCDIA is a severe and life-threatening adverse drug reaction, characterized by its complex mechanisms and idiosyncratic nature. Despite increased research and heightened awareness in recent years, predicting and managing NCDIA remains challenging. While previous studies have documented individual cases and small-scale analyses, no comprehensive investigation has systematically evaluated NCDIA using a large-scale pharmacovigilance database. Our study addresses this gap by analyzing NCDIA reports from the FAERS database over a 20year period, providing novel insights into its characteristics and identifying previously unrecognized risk drugs.

Firstly, gender and age play distinct roles in the occurrence and development of NCDIA. Our study indicates no significant difference in NCDIA reporting rates between genders (Supplementary Table S2). Although previous research suggested that females report NCDIA far more frequently than males,our analysis did not reveal a gender bias (Maloisel et al., 2003; Lorenzo-Villalba et al., 2020; Andres et al., 2017). Regarding age distribution, patients aged  $\geq$  65 years reported significantly more NCDIA cases than other age groups (Supplementary Table S2; Figure 1B). This finding aligns with previous studies identifying elderly patients (≥ 65 years) as a major risk factor for NCDIA (Lorenzo-Villalba et al., 2020). Elderly patients are more susceptible to NCDIA due to factors such as declining liver and kidney function, multiple disease comorbidities, and the use of various medications (Lorenzo-Villalba et al., 2020). This underscores the need for clinicians to exercise increased caution and implement enhanced monitoring and preventive measures when prescribing high-risk nonchemotherapy drugs to elderly patients. Additionally, our study systematically analyzed the timing of NCDIA onset and found significant differences across gender and age groups (Table 1; Figure 5B). Females tend to develop agranulocytosis earlier than males, and patients under 18 and over 65 years old tend to develop it earlier than other age groups. Previous studies have shown that adverse drug reactions vary by gender and age (Alomar, 2014; Gandhi et al., 2004; Soldin and Mattison, 2009; Corsonello et al., 2010). The observed gender differences in NCDIA onset may be due to biological and physiological factors such as variations in drug metabolism enzyme activity and hormone levels, which could affect the timing of drug-induced agranulocytosis (Gandhi et al., 2004; Soldin and Mattison, 2009). Age differences are attributed to the distinct metabolic and immune systems in elderly and pediatric

patients compared to young and middle-aged adults (Corsonello et al., 2010; Simon et al., 2015; Alomar, 2014). Previous epidemiological studies on NCDIA did not report differences in the timing of agranulocytosis onset by gender and age. Therefore, our findings provide valuable insights for clinicians and pharmacists to develop better monitoring and intervention strategies, especially for high-risk populations.

Secondly, this study identified a variety of drugs with potential high risk for agranulocytosis. From 10,913 reports of NCDIA, we identified 166 drugs with positive signals (Supplementary Table S3). After an in-depth database and literature review, we established a classification system for NCDIA: 111 drugs were categorized as "Known NCDIA", 25 as "Possible NCDIA", and 30 as "New Potential NCDIA". In clinical practice, it is crucial to be particularly vigilant regarding drugs categorized as "Possible NCDIA" and "New Potential NCDIA" (Figure 4). Although these drugs have not been previously identified as causing agranulocytosis in their labeling, those classified as "Possible NCDIA" have shown adverse reactions related to neutropenia or leukopenia. If not monitored and managed, these reactions could potentially progress to agranulocytosis. Conversely, "New Potential NCDIA" drugs have no documented adverse effects related to agranulocytosis or granulocytopenia in their labeling. However, our research indicates a risk signal for agranulocytosis with these drugs, and some already have associated case reports of agranulocytosis. For instance, further literature review revealed case reports of agranulocytosis associated with four "Possible NCDIA" drugs: Micafungin (Ameri et al., 2019), Fosfomycin (Matusik et al., 2023), Azithromycin (Kajiguchi and Ohno, 2009), and Doxycycline (Parent-Massin et al., 1993); as well as with five "New Potential NCDIA" drugs: Daptomycin (Leyra et al., 2016), Enoxaparin (Medrano-Casique et al., 2016), Ocrelizumab (Auer et al., 2020), Metformin (Laporte et al., 2008), and Pregabalin (Kino et al., 2014). Notably, among these nine drugs, only Doxycycline was included in a systematic review of case reports in 2007 (Andersohn et al., 2007). The other eight drugs had case reports published after 2008. Due to the low incidence and idiosyncratic nature of this adverse drug reaction, many drugs that cause agranulocytosis are identified through post-marketing surveillance rather than during clinical trials, as the trials often have strict inclusion and exclusion criteria (Rattay and Benndorf, 2021). Therefore, signal mining of adverse drug reactions in the FAERS database, along with case report analysis, is crucial for understanding the characteristics of agranulocytosis caused by specific drugs.

Furthermore, our study provides comprehensive insights into NCDIA onset patterns. Beyond demographic analyses, we characterized drug-specific and drug class-specific onset timing (Supplementary Tables S4, S5), revealing substantial variations that have important implications for clinical monitoring. For instance, onset times ranged from 4 days (Azithromycin) to 176 days (Ocrelizumab) among individual drugs, and from 6 days (C01: Cardiac Therapy) to 73 days (V03: All Other Therapeutic Products) among drug classes. This temporal characterization addresses a significant knowledge gap, as comprehensive onset timing data for NCDIA has been largely absent from the literature. Such information is crucial for clinical practice, enabling: (1) Evidence-based assessment of potential druginduced agranulocytosis cases; (2) Optimization of blood count monitoring frequencies; (3) Development of drug-specific surveillance protocols. The clinical utility of such timing data is well illustrated by Thiamazole, where we observed a median onset time of 42 days (IQR: 30-66 days). This aligns with findings from a Japanese study showing that biweekly blood count monitoring during the first 2 months of Thiamazole therapy can identify 78% of neutropenia cases before progression to agranulocytosis (Nakamura et al., 2013). This example demonstrates how onset timing data can inform practical monitoring strategies to prevent severe complications.

Finally, our mortality analysis revealed important patterns and trends in NCDIA outcomes. Agranulocytosis, characterized by a severe deficiency of neutrophils, can precipitate life-threatening infections and, in extreme cases, lead to patient death. European research reports indicate that over the past 2 decades, the mortality rate associated with NCDIA has ranged between 10% and 16% (Andres and Mourot-Cottet, 2017). High-risk factors for mortality in patients with agranulocytosis include advanced age (over 65 years), renal insufficiency (serum creatinine level >120 µmol/ L), and the presence of bacteremia or shock (Andrès and Maloisel, 2008; Andres et al., 2011). Our research corroborates these findings, showing a mortality rate of 9.68% for NCDIA based on reports from 2004 to 2024. The median age of deceased cases was 65 years (IQR 50-77), significantly higher than the median age of non-fatal cases, which was 55 years (IQR 38-70). Furthermore, we identified eight drugs with more than twenty reported fatal cases of agranulocytosis (Figure 7), among which Clozapine had the highest number of fatal cases but the lowest mortality rate at 6.37%. This may be attributed to increased awareness and preventive measures against clozapineinduced agranulocytosis (Mijovic and MacCabe, 2020). In the United States, the FDA mandates regular monitoring and reporting of neutrophil counts for all patients on Clozapine, facilitating safe use of the drug while mitigating mortality associated with clozapine-induced agranulocytosis. Between 1990 and 1994 in the United States, the incidence of clozapineinduced agranulocytosis decreased from 1% to 2% in pre-marketing studies to 0.38% post-marketing, with the mortality rate declining from an estimated 15% to approximately 3.1% (Honigfeld, 1996). Despite the life-threatening potential of NCDIA, our study indicates a positive trend, with the mortality rate declining from 11.91% during 2004-2010 to 7.28% during 2021-2024 (Table 2; Figure 6). This downward trend may be attributed to improvements in intensive care treatments, the availability of effective broadspectrum antibiotics, heightened physician vigilance regarding drug-induced agranulocytosis, prompt cessation of suspected drugs, and the proactive use of G-CSF or GM-CSF in patients with severe agranulocytosis (Andersohn et al., 2007). These measures collectively contribute to improving the therapeutic outcomes for patients with agranulocytosis and reducing mortality rates.

However, several limitations of this study should be acknowledged. First, our case identification relied solely on the Preferred Term (PT) "Agranulocytosis" rather than using the SMQ of agranulocytosis that include related conditions such as aplastic anemia, bone marrow failure, febrile neutropenia, and neutropenic sepsis. While this focused approach ensures high specificity for agranulocytosis cases and avoids potential confounding from conditions with different pathophysiological mechanisms or clinical manifestations, it likely results in underdetection of some relevant cases. This conservative case identification strategy means our findings might underestimate the true scope of NCDIA conditions. A second fundamental limitation stems from the inherent constraints of the FAERS database regarding laboratory data verification. Although agranulocytosis is strictly defined as an absolute neutrophil count below  $0.5 \times 10^9$ /L, FAERS does not contain laboratory data to confirm these values. Consequently, an unknown proportion of the reported cases may not meet the strict laboratory definition of agranulocytosis. However, given that agranulocytosis is a severe condition requiring immediate medical attention, most reports likely originate from healthcare professionals who have made the diagnosis based on laboratory findings, even though these values are not captured in the database. Additionally, like other spontaneous reporting systems, the FAERS database has limitations such as reporting bias, incomplete information, and the inability to establish true causality (Sakaeda et al., 2013; Ismail and Akram, 2022). These limitations necessitate cautious interpretation of our findings. Future pharmacovigilance studies could be strengthened by: (1) employing the SMQ of agranulocytosis for more comprehensive case identification, (2) linking with electronic health records to validate laboratory criteria, and (3) conducting prospective studies to better establish causality between specific drugs and agranulocytosis.

## **5** Conclusion

In this comprehensive pharmacovigilance study of NCDIA spanning 2 decades (2004–2024), we have made several significant findings with important clinical implications. First, we identified 166 drugs associated with NCDIA, which were then systematically categorized using our novel three-tier classification system, revealing 30 previously unrecognized potential risk drugs and providing clinicians with an updated framework for risk assessment. Second, the analysis revealed distinct gender and age-related patterns in NCDIA onset, with females and specific age groups (<18 and  $\geq$ 65 years) showing earlier onset, emphasizing the need for more targeted monitoring strategies in these populations. The drug-specific onset timing analysis offers valuable guidance for optimizing blood count monitoring protocols, particularly for high-risk medications. Importantly, the observed decline in NCDIA-associated mortality rates from 11.91% to 7.28% over the study

period suggests improving clinical management strategies, though continued vigilance remains essential. These findings have direct implications for clinical practice, supporting the development of more personalized monitoring approaches and potentially improving patient safety in non-chemotherapy drug treatment. Future pharmacovigilance studies and clinical investigations should focus on validating the newly identified potential risk drugs and further refining monitoring strategies for specific patient populations. Our findings provide a foundation for evidence-based decision-making in NCDIA risk management and patient care.

## Data availability statement

The original contributions presented in the study are included in the article/Supplementary Material, further inquiries can be directed to the corresponding author.

## Author contributions

SW: Methodology, Investigation, Software, Data curation, Writing-original draft; LH: Methodology, Visualization, Validation, Writing-original draft; JC: Methodology, Software, Validation, Writing-review and editing; XX: Visualization, Validation, Writing-review and editing; SH: Formal analysis, Writing-review and editing; XH: Conceptualization, Methodology, Investigation, Supervision, Writing-original draft, Project administration, Funding acquisition.

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### References

Alomar, M. J. (2014). Factors affecting the development of adverse drug reactions (Review article). Saudi Pharm. J. 22, 83–94. doi:10.1016/j.jsps.2013.02.003

Ameri, A. H., Curtis, B. R., and Sykes, D. B. (2019). Immune neutropenia mediated by micafungin. Am. J. Hematol. 94, 830-832. doi:10.1002/ajh.25483

Andersohn, F., Konzen, C., and Garbe, E. (2007). Systematic review: agranulocytosis induced by nonchemotherapy drugs. *Ann. Intern. Med.* 146, 657–665. doi:10.7326/0003-4819-146-9-200705010-00009

AndrèS, E., and Maloisel, F. (2008). Idiosyncratic drug-induced agranulocytosis or acute neutropenia. *Curr. Opin. Hematol.* 15, 15–21. doi:10.1097/MOH.0b013e3282f15fb9

Andres, E., and Mourot-Cottet, R. (2017). Non-chemotherapy drug-induced neutropenia - an update. *Expert Opin. Drug Saf.* 16, 1235–1242. doi:10.1080/14740338.2017.1376645

Andres, E., Mourot-Cottet, R., Maloisel, F., Severac, F., Keller, O., Vogel, T., et al. (2017). Idiosyncratic drug-induced neutropenia and agranulocytosis. *QIM* 110, 299–305. doi:10.1093/qjmed/hcw220

Andres, E., Villalba, N. L., Zulfiqar, A. A., Serraj, K., Mourot-Cottet, R., and Gottenberg, A. J. (2019). State of art of idiosyncratic drug-induced neutropenia or agranulocytosis, with a focus on biotherapies. *J. Clin. Med.* 8, 1351. doi:10.3390/jcm8091351

Andres, E., Zimmer, J., Mecili, M., Weitten, T., Alt, M., and Maloisel, F. (2011). Clinical presentation and management of drug-induced agranulocytosis. *Expert Rev. Hematol.* 4, 143–151. doi:10.1586/ehm.11.12 Foundation of Guangdong Province, sponsored by the Health Commission of Guangdong Province (Grant Number: A2024082).

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## **Conflict of interest**

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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## Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fphar.2025.1525307/ full#supplementary-material

Auer, M., Bsteh, G., Hegen, H., Wurth, S., Zinganell, A., Berger, T., et al. (2020). Late-onset neutropenia in a multiple sclerosis patient after first dose ocrelizumab switched from rituximab. *Multiple Scler. Relat. Disord.* 43, 102155. doi:10.1016/j.msard.2020.102155

Coates, T. D. (2024). Drug-induced neutropenia and agranulocytosis. Waltham, MA: UpToDate. Available at: https://www.uptodate.com/contents/drug-induced-neutropenia-and-agranulocytosis (Accessed January 29, 2024).

Corsonello, A., Pedone, C., and Incalzi, R. A. (2010). Age-related pharmacokinetic and pharmacodynamic changes and related risk of adverse drug reactions. *Curr. Med. Chem.* 17, 571–584. doi:10.2174/092986710790416326

Curtis, B. R. (2017). Non-chemotherapy drug-induced neutropenia: key points to manage the challenges. *Hematol. Am. Soc. Hematol. Educ. Program* 2017, 187–193. doi:10.1182/asheducation-2017.1.187

Gandhi, M., Aweeka, F., Greenblatt, R. M., and Blaschke, T. F. (2004). Sex differences in pharmacokinetics and pharmacodynamics. *Annu. Rev. Pharmacol. Toxicol.* 44, 499–523. doi:10.1146/annurev.pharmtox.44.101802.121453

Garbe, E. (2007). Non-chemotherapy drug-induced agranulocytosis. Expert Opin. drug Saf. 6, 323–335. doi:10.1517/14740338.6.3.323

Honigfeld, G. (1996). Effects of the clozapine national registry system on incidence of deaths related to agranulocytosis. Psychiatr. Serv. Wash. DC 47, 52–56. doi:10.1176/ps.47.1.52

Huang, X., Xie, X., Huang, S., Wu, S., and Huang, L. (2024). Predicting nonchemotherapy drug-induced agranulocytosis toxicity through ensemble machine learning approaches. *Front. Pharmacol.* 15, 1431941. doi:10.3389/fphar.2024.1431941 Ismail, M., and Akram, M. U. (2022). FDA adverse event reporting system (FAERS) database: a comprehensive analysis of its structure, functionality, and limitations. *Sage Sci. Rev. Appl. Mach. Learn.* 5, 15–29.

Kajiguchi, T., and Ohno, T. (2009). Azithromycin-related agranulocytosis in an elderly man with acute otitis media. *Intern. Med.* 48, 1089–1091. doi:10.2169/internalmedicine.48.2093

Kino, H., Suzuki, H., Nakamura, K., Koiso, T., Ito, Y., Uemura, K., et al. (2014). *Clostridium difficile* infection induced by pregabalin-associated agranulocytosis. *Intern. Med.* 53, 2149–2152. doi:10.2169/internalmedicine.53.2085

Kuhn, M., Letunic, I., Jensen, L. J., and Bork, P. (2016). The SIDER database of drugs and side effects. *Nucleic Acids Res.* 44, D1075–D1079. doi:10.1093/nar/gkv1075

Lalami, Y., and Klastersky, J. (2017). Impact of chemotherapy-induced neutropenia (CIN) and febrile neutropenia (FN) on cancer treatment outcomes: an overview about well-established and recently emerging clinical data. *Crit. Rev. oncology/hematology* 120, 163–179. doi:10.1016/j.critrevonc.2017.11.005

Laporte, F., Hamdi, S., Oksman, F., and Huguet, F. (2008). Auto-immune neutropenia associated with metformin in a patient with splenic marginal zone lymphoma. *Pharm. World and Sci.* 30, 319–321. doi:10.1007/s11096-008-9218-3

Leyra, F., Perez-Chuliá, N., Jofré, C., Suarez-Gonzalo, L., Del Ser, N. P., and Moreno, I. (2016). Thrombocytopaenia and neutropaenia associated with daptomycin USE. *J. Chemother.* 28, 425–427. doi:10.1179/1973947815Y.000000032

Lorenzo-Villalba, N., Alonso-Ortiz, M. B., Maouche, Y., Zulfiqar, A. A., and Andres, E. (2020). Idiosyncratic drug-induced neutropenia and agranulocytosis in elderly patients. *J. Clin. Med.* 9, 1808. doi:10.3390/jcm9061808

Lyman, G. H., Abella, E., and Pettengell, R. (2014). Risk factors for febrile neutropenia among patients with cancer receiving chemotherapy: a systematic review. *Crit. Rev. oncology/hematology* 90, 190–199. doi:10.1016/j.critrevonc.2013.12.006

Maloisel, F., AndrèS, E., Kaltenbach, G., Noel, E., and Koumarianou, A. (2003). Prognostic factors of hematologic recovery in nonchemotherapy drug-induced agranulocytosis. *Haematologica* 88, 470–471.

Matusik, E., Demanet, J., Alves, I., Tone, A., Ettahar, N., Lemtiri, J., et al. (2023). Fosfomycin-induced agranulocytosis: a case report and review of the literature. *BMC Infect. Dis.* 23, 685. doi:10.1186/s12879-023-08652-8

Medrano-Casique, N., Tong, H. Y., Borobia, A. M., Carcas, A. J., FríAS, J., and RamíREZ, E. (2016). Nonchemotherapy drug-induced agranulocytosis in children detected by a prospective pharmacovigilance program. *Pediatr. Hematol. Oncol.* 33, 441–456. doi:10.1080/08880018.2016.1234523

Mijovic, A., and Maccabe, J. H. (2020). Clozapine-induced agranulocytosis. Ann. Hematol. 99, 2477-2482. doi:10.1007/s00277-020-04215-y

Nakamura, H., Miyauchi, A., Miyawaki, N., and Imagawa, J. (2013). Analysis of 754 cases of antithyroid drug-induced agranulocytosis over 30 years in Japan. J. Clin. Endocrinol. and Metabolism 98, 4776–4783. doi:10. 1210/jc.2013-2569

Parent-Massin, D. M., SenséBé, L., LéGLISE, M. C., Guern, G., Berthou, C., Riché, C., et al. (1993). Relevance of *in vitro* studies of drug-induced agranulocytosis: report of 14 cases. *Drug Saf.* 9, 463–469. doi:10.2165/ 00002018-199309060-00009

Rattay, B., and Benndorf, R. A. (2021). Drug-induced idiosyncratic agranulocytosis - infrequent but dangerous. *Front. Pharmacol.* 12, 727717. doi:10.3389/fphar.2021. 727717

Sakaeda, T., Tamon, A., Kadoyama, K., and Okuno, Y. (2013). Data mining of the public version of the FDA adverse event reporting system. *Int. J. Med. Sci.* 10, 796–803. doi:10.7150/ijms.6048

Simon, A. K., Hollander, G. A., and Mcmichael, A. (2015). Evolution of the immune system in humans from infancy to old age. *Proc. R. Soc. B Biol. Sci.* 282, 20143085. doi:10.1098/rspb.2014.3085

Soldin, O. P., and Mattison, D. R. (2009). Sex differences in pharmacokinetics and pharmacodynamics. *Clin. Pharmacokinet.* 48, 143–157. doi:10.2165/00003088-200948030-00001