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# Severe Hypoglycemia Risk With Long-Acting Insulin Analogs vs Neutral Protamine Hagedorn Insulin

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**IMPORTANCE** Previous studies have found that the risk of severe hypoglycemia does not differ between long-acting insulin analogs and neutral protamine Hagedorn (NPH) insulin in patients with type 2 diabetes. However, these studies did not focus on patients 65 years or older, who are at an increased risk for hypoglycemia, or did not include patients with concomitant prandial insulin use.

**OBJECTIVE** To examine the risk of emergency department (ED) visits or hospitalizations for hypoglycemia among older community-residing patients with type 2 diabetes who initiated long-acting insulin or NPH insulin in real-world settings.

**DESIGN, SETTING, AND PARTICIPANTS** This retrospective, new-user cohort study assessed Medicare beneficiaries 65 years or older who initiated insulin glargine (n = 407018), insulin detemir (n = 141588), or NPH insulin (n = 26402) from January 1, 2007, to July 31, 2019.

**EXPOSURES** Insulin glargine, insulin detemir, and NPH insulin.

MAIN OUTCOMES AND MEASURES The primary outcome was time to first ED visit or hospitalization for hypoglycemia, defined using a modified validated algorithm. Propensity score-weighted Cox proportional hazards regression was used to estimate hazard ratios (HRs) and 95% Cls. The risk of recurring hypoglycemia events was estimated using the Andersen-Gill model. Post hoc analyses were conducted investigating possible effect modification by age.

**RESULTS** Of the 575 008 patients initiating use of insulin (mean [SD] age 74.9 [6.7] years; 53% female), 407 018 used glargine, 141 588 used detemir, and 26 402 used NPH insulin. The study included 7347 ED visits or hospitalizations for hypoglycemia (5194 for glargine, 1693 for detemir, and 460 for NPH insulin, with a median follow-up across the 3 cohorts of 0.37 years (interquartile range, 0.20-0.76 years). Initiation of glargine and detemir use was associated with a reduced risk of hypoglycemia compared with NPH insulin use (HR for glargine vs NPH insulin, 0.71; 95% CI, 0.63-0.80; HR, detemir vs NPH insulin, 0.72; 95% CI, 0.63-0.82). The HRs were similar for the recurrent event analysis. The protective association of long-acting insulin analogs varied by age and was not seen with concomitant prandial insulin use.

**CONCLUSIONS AND RELEVANCE** In this cohort study, initiation of long-acting analogs was associated with a lower risk of ED visits or hospitalizations for hypoglycemia compared with NPH insulin in older patients with type 2 diabetes in Medicare. However, this association was not seen with concomitant prandial insulin use.

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Supplemental content

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Corresponding Author: Marie C. Bradley, PhD, MPharm, MScPH, Office of Surveillance and Epidemiology, Center for Drug Evaluation and Research, US Food and Drug Administration, 10903 New Hampshire Ave, Bldg 22, Room 2467, Silver Spring, MD 20993 (marie.bradley@fda.hhs.gov). ong-acting insulin analogs, insulin glargine and insulin detemir, are structurally altered human insulins that mimic the pharmacokinetic properties of endogenous insulin more closely than neutral protamine Hagedorn (NPH) insulin and are increasingly used in the management of type 2 diabetes. A recent report<sup>1</sup> estimating Medicare Part D spending on insulin in 2017 found that long-acting insulin analogs accounted for 50% of total dispensed insulin (27 513 of 53 102 million units) and almost 62% of insulin analog use was insulin glargine. The price of long-acting insulin analogs has increased substantially,<sup>2</sup> and in 2017 alone Medicare was estimated to have spent \$7 billion on long-acting insulin analogs, of which glargine accounted for \$4.7 billion. Higher costs for these insulin analogs may limit patient access.<sup>1</sup>

Despite suggested theoretical benefits of long-acting analogs, such as lower risk of hypoglycemia (especially nocturnal) because of the longer duration of action and the less pronounced insulin peak, a Cochrane review of randomized clinical trials (RCTs)<sup>3</sup> that compared long-acting insulin analogs with NPH insulin reported no statistically significant difference for severe hypoglycemia rates in any of the RCTs<sup>4-9</sup> or in a meta-analysis of RCT results.<sup>3</sup> Similar findings were reported by Lipska et al<sup>10</sup> in an observational study that examined rates of emergency department (ED) visits or hospital admissions for hypoglycemia and changes in levels of glycemic control after initiating use of long-acting insulin analogs compared with NPH insulin among patients with type 2 diabetes in Kaiser Permanente of Northern California (KPNC).<sup>10</sup> They reported that initiation of long-acting insulin analog use compared with NPH insulin was not associated with reduced risk of ED visits or hospital admissions for hypoglycemia or with improved glycemic control and suggested that "use of basal insulin analogs in usual practice settings may not be associated with clinical advantages for these outcomes."10(pE1) However, another meta-analysis of RCTs<sup>11</sup> reported a lower risk of severe hypoglycemia among longacting analog users compared with NPH insulin users across 7 studies. The study by Lipska et al<sup>10</sup> was limited in that NPH insulin was used preferentially within KPNC; therefore, 23561 NPH insulin users but only 1928 long-acting insulin analog users were included in the study. In addition, this study<sup>10</sup> did not examine concomitant use of prandial insulin, which is common in real-world settings. The mean age of patients in previous RCTs<sup>4,5,8,9</sup> and the study by Lipska et al<sup>10</sup> ranged from 55 to 60 years, indicating that these studies were likely underpowered to detect or could not test the impact of older age on their findings. People older than 65 years may be at increased risk for hypoglycemia, and the consequences may be more severe.<sup>12,13</sup> In addition, severe hypoglycemia was patient reported in the previous RCTs, whereas in the study by Lipska et al<sup>10</sup> it was based on health care utilization data. Given the limitations of the previous observational study<sup>10</sup> and the need for real-world evidence on the safety of longacting insulin analogs compared with NPH insulin in older patients, we used Medicare data to assess the risk of ED visits or hospitalizations for hypoglycemia among older patients with type 2 diabetes who initiated glargine or detemir compared with NPH insulin in real-world settings.

### **Key Points**

Question Do long-acting insulin analogs reduce the risk of emergency department visits or hospitalization for hypoglycemia compared with neutral protamine Hagedorn (NPH) insulin in older patients with type 2 diabetes?

**Findings** In this cohort study of 575 008 patients 65 years or older initiating use of insulin, long-acting insulin analogs were associated with a lower risk of emergency department visits or hospitalizations for hypoglycemia compared with NPH insulin. This finding was not seen with concomitant use of prandial insulin.

Meaning Long-acting insulin analogs may reduce the risk of severe hypoglycemia compared with NPH insulin in older patients.

## Methods

## **Study Cohort**

Medicare beneficiaries 65 years or older and enrolled in Medicare fee-for-service Parts A, B, and D were eligible for study inclusion if they initiated a study insulin (glargine, detemir, or NPH insulin) between January 1, 2007, and July 31, 2019. Beneficiaries were also required to have continuous enrollment in Medicare, a type 2 diabetes diagnosis, and no prescriptions for a study insulin or a prandial insulin in the 365 days before the date of the qualifying prescription (index date). Patients were excluded if they were in a skilled nursing facility or nursing home, received their index prescription from a long-term care pharmacy, or were receiving hospice care on the index date. Kidney transplant recipients, patients undergoing dialysis in the year before index date, and anyone who entered Medicare for reasons other than age were also excluded (eFigure 1 in the Supplement). This study was classified as public health surveillance by the US Food and Drug Administration and was exempted from review by the agency's institutional review board in accordance with the updated Common Rule. In addition, patient consent was not required for this study because it was observational and used deidentified health care claims data. This study followed the Strengthening the Reporting of Observational Studies in Epidemiology (STROBE) reporting guideline.

#### Exposure

The primary exposure definition was new use<sup>14</sup> of any formulation of glargine, detemir, or NPH insulin alone (eTable 1 in the Supplement); NPH insulin combination products with prandial insulin were excluded from the primary analysis. Patients were considered exposed to a study insulin from their index date (first insulin dispensing based on Part D dispensing claims) until a censoring or outcome event occurred.

#### Outcomes

Emergency department visits and hospitalizations for hypoglycemia were identified using *International Classification of Diseases, Ninth Revision, Clinical Modification (ICD-9-CM),* and *International Statistical Classification of Diseases, Tenth Revision, Clinical Modification (ICD-10-CM),* diagnosis codes. We used a modified version of the algorithm developed by Ginde et al,<sup>15</sup> which was validated for use in claims data based on *International Classification of Diseases, Ninth Revision (ICD-9)* coding. For hypoglycemic events identified after the October 1, 2015, *International Classification of Diseases, Tenth Revision (ICD-10)* transition date, we used the General Equivalence Mappings to map *ICD-9-CM* codes from the algorithm of Ginde et al<sup>15</sup> to *ICD-10-CM* codes. The algorithm was modified to include inpatient and outpatient ED claims with hypoglycemia in the primary position only, similar to the algorithm used by Lipska et al<sup>10</sup> (eFigure 2 and eTable 2 in the Supplement).

#### Follow-up

An as-treated approach to follow-up time was applied in our primary analyses. Follow-up time started on the first day after the index date and continued until the earliest of the following: switch to another study insulin, initiation of prandial insulin use, death, disenrollment from Medicare Parts A, B, or D or enrollment in Medicare Part C, end of study (July 31, 2019), treatment cessation (defined as no observed refill within 45 days of the last day of the previous refill's supply), a hypoglycemia outcome, or an invalid prescription (ie, prescriptions with implausible dose values) (eTable 3 in the Supplement).

#### **Covariates**

Demographic characteristics, preexisting medical conditions, medication use, an adapted Diabetes Complications Severity Index,<sup>16</sup> and health care utilization (including inpatient, outpatient, ED, and physician visits; number of glycated hemoglobin tests; and physician specialty) were identified in the 12-month baseline period before cohort entry. Timevarying concomitant use of noninsulin antidiabetic drugs, including sulfonylureas, metformin, incretins (dipeptidyl peptidase-4 inhibitors and glucagon-like peptide 1 agonists), and other antidiabetic drugs (thiazolidinediones and other) were also evaluated during follow-up.

#### **Statistical Analysis**

Logistic regression was used to estimate the probability of receiving glargine vs NPH insulin and detemir vs NPH insulin conditional on baseline covariates (ie, propensity score) and to calculate inverse probability of treatment weights (IPTWs) for each comparison (glargine vs NPH insulin and detemir vs NPH insulin). Because the target population for this study was the glargine-detemir cohort for each comparison, IPTWs for average treatment effects among treated patients, considering glargine-detemir as the reference treatment, were applied. Distributions of propensity scores and IPTWs were inspected for outliers. Weight truncation at the 99th percentile was conducted to account for extreme weights in the NPH insulin cohort. Covariate balance between weighted cohorts was assessed using standardized mean differences, with a value of 0.1 or less indicating a negligible difference between groups.<sup>17</sup>

All analyses were based on IPTW-adjusted cohorts to account for potential confounding at baseline and additionally adjusted for time-varying concomitant use of noninsulin antidiabetic drugs, including sulfonylureas, metformin, incretins (dipeptidyl peptidase-4 inhibitors and glucagon-like peptide 1 agonists), and other antidiabetic drugs (thiazolidinediones and other) during follow-up. Weighted Cox proportional hazards regression with robust SEs was used to estimate hazard ratios (HRs) and 95% CIs for time to first ED visit or hospitalization for hypoglycemia among glargine users compared with users of NPH insulin and separately for detemir users compared with NPH insulin. Secondary analyses used the Andersen-Gill model, an extended Cox proportional hazards regression model,<sup>18</sup> to examine the association between use of long-acting insulins and recurrent hypoglycemia events, additionally adjusting for number of prior events. For recurrent events to be counted as separate outcomes, we required at least 1 day between the end of prior outcome and start of the next outcome.

Several prespecified sensitivity analyses were undertaken that modified the primary analysis by (1) increasing the gap allowance between successive insulin prescriptions from 45 to 90 days; (2) restricting the analysis to the *ICD-9* coding era (January 2007 to September 2015); (3) combining longacting insulin analog users (glargine and detemir) into 1 cohort; (4) using the original algorithm of Ginde et al,<sup>15</sup> which includes hypoglycemia recorded in any position; and (5) not truncating IPTW at the 99th percentile.

We also conducted prespecified exploratory analyses to evaluate the risk of hypoglycemia among concomitant prandial insulin users, defined as initiation of prandial insulin use on index date or at any time during follow-up. For these analyses, the primary analysis study population was expanded to include patients in the NPH insulin cohort who initiated an NPH insulin combination with prandial insulin. The primary analysis was repeated in this expanded cohort with the following modifications: (1) removal of censoring for initiation of prandial insulin use during follow-up, (2) an additional adjustment for time-varying concomitant prandial insulin use in the weighted model, and (3) inclusion of interaction terms for concurrent prandial insulin use for each of the study drugs.

Post hoc analyses were conducted to investigate possible effect modification by age given that the findings varied from the previous study by Lipska et al,<sup>10</sup> which involved a younger population. We first examined effect modification by age category (65-74, 75-84, and ≥85 years) and then used a penalized spline<sup>19</sup> to explore effect modification in a continuous age scale. Post hoc analyses also investigated the effect of socioeconomic status and year of insulin initiation. Analyses were performed using SAS statistical software, version 9.4 (SAS Institute Inc) and R software, version 3.4.3 (R Foundation for Statistical Computing). A 2-sided P < .05 was considered statistically significant.

## Results

Of the 575 008 patients initiating use of insulin (mean [SD] age 74.9 [6.7] years; 53% female), 407 018 used glargine, 141 588 used detemir, and 26 402 used NPH insulin. Glargine initiators contributed 299 098 person-years of follow-up, detemir initiators contributed 101 426 person-years of follow-

up, and NPH insulin initiators contributed 14 994 personyears of follow-up.

Before IPTW adjustment, no substantial differences were found in demographic or clinical characteristics between the glargine and detemir cohorts. However, when the NPH insulin cohort was compared with each long-acting analog cohort, slight differences were noted, including a higher proportion of NPH insulin users who were Black (13% for NPH insulin vs 9% for analogs), fewer physician visits and glycated hemoglobin tests before the index date in NPH insulin users than analog users, and a smaller proportion of NPH insulin users who used oral diabetes medications and statins compared with analog users (**Table 1**). After IPTW adjustment, cohorts for each analysis were closely balanced for all baseline covariates (eTable 4 in the Supplement).

A total of 7347 ED visits or hospitalizations for hypoglycemia occurred during the study period: 5194 for glargine, 1693 for detemir, and 460 for NPH insulin, with a median follow-up across the 3 cohorts of 0.37 years (interquartile range [IQR], 0.20-0.76 years). The main reason for censoring in each exposure cohort was treatment discontinuation (responsible for the censoring of approximately 25% in each cohort within 3 months and approximately 60% within a year [eTable 3 in the Supplement]). For the glargine and NPH insulin comparison, the weighted incidence rates for ED visits or hospitalizations for hypoglycemia per 1000 person-years were 17.37 (95% CI, 16.89-17.84) for glargine and 26.64 (95% CI, 26.01-27.3) for NPH insulin. For the detemir and NPH insulin comparison, the incidence rates were 16.69 (95% CI, 15.92-17.51) for detemir and 25.04 (95% CI, 24.01-26.11) for NPH insulin (**Table 2**).

Compared with patients who initiated NPH insulin, those taking glargine and detemir had a reduced risk of ED visits or hospitalizations for hypoglycemia; the adjusted HRs were 0.71 (95% CI, 0.63-0.80; P < .001) for glargine and 0.72 (95% CI, 0.63-0.82; P < .001) for detemir (Table 2; eFigures 3 and 4 in the Supplement).

In the analysis that included concomitant prandial insulin as a time-varying covariate, the HR for hypoglycemia comparing glargine vs NPH insulin was 0.99 (95% CI, 0.90-1.09; P = .85) during time taking concomitant prandial insulin and 0.78 (95% CI, 0.67-0.87; *P* < .001) during time not taking concomitant prandial insulin (P = .001 for the interaction between study drug and concomitant prandial insulin use). For detemir vs NPH insulin, the corresponding risk estimates were 0.96 (95% CI, 0.86-1.08; P = .53) during time taking concomitant prandial insulin and 0.78 (95% CI, 0.68-0.89; P < .001) during time not taking concomitant prandial insulin (P = .02 for the interaction between study drug and concomitant prandial insulin use) (Table 3). These findings indicate that the association between each long-acting insulin analog (vs NPH insulin) and severe hypoglycemia during periods of receiving and not receiving treatment with prandial insulin was significantly different (effect modification).

There was also evidence that the association of hypoglycemia with glargine and detemir may vary by age. In a post hoc analysis, exploring effect modification in a continuous age scale, results from penalized spline models illustrated in **Figure 1** and **Figure 2** suggested that the observed protective association of long-acting analogs compared with NPH insulin was stronger at 69 to 87 years of age than at other ages.

The analysis allowing for recurrent hypoglycemia events found similar results for glargine (HR, 0.70; 95% CI, 0.63-0.79; P < .001) and detemir (HR, 0.74; 95% CI, 0.65-0.84; P < .001). In addition, this analysis identified that the risk of recurrent ED visits or hospitalizations for hypoglycemia across all comparisons increased with the number of prior events (eTable 5 and eFigure 4 in the Supplement). Prespecified sensitivity analyses had similar patterns and trends of associations as those for the primary analysis (eFigure 4 and eTable 6 in the Supplement).

In a post hoc subgroup analysis by low-income subsidy, a proxy for low-income status, the HR for the glargine vs NPH insulin comparison was 0.67 (95% CI, 0.56-0.80) for beneficiaries who received the subsidy, whereas in those who did not receive the subsidy it was 0.73 (95% CI, 0.62-0.85), and the corresponding estimates for the detemir vs NPH insulin comparison were 0.76 (95% CI, 0.60-0.95) for beneficiaries who received the subsidy vs 0.71 (95% CI, 0.60-0.85) for those who did not (P > .40 for interaction) (eTable 7 in the Supplement). Including year of initiation of insulin use in the model did not substantially change the estimates from the primary analysis (glargine vs NPH insulin: HR, 0.73; 95% CI, 0.67-0.90).

## Discussion

In this new-user, active comparator cohort study, which included more than 575 000 insulin users, initiation of glargine and detemir use was associated with a nearly 30% lower risk of ED visits or hospitalizations for hypoglycemia compared with initiation of NPH insulin use, which translated to 9.3 fewer hypoglycemia events with glargine and 8.4 fewer with detemir per 1000 patient-years of treatment. In terms of number needed to harm,<sup>20</sup> one would need to treat 154 patients with glargine or 167 with detemir rather than with NPH insulin for a year to prevent 1 excess case of severe hypoglycemia. However, this protective association was no longer seen when insulin analogs were used concomitantly with prandial insulin.

These results contrast with findings of a recent observational study<sup>3</sup> examining the same question in KPNC. Lipska et al<sup>10</sup> reported no difference in risk of ED visits or hospital admissions for hypoglycemia among long-acting analog users compared with NPH insulin users. The mean age of participants in that study<sup>10</sup> was 60 years compared with 75 years in the current study, suggesting that age may have contributed to the disparity in study results. In post hoc analyses, we observed potential effect modification by age. It appeared that in those 65 to 68 years of age, the use of glargine or detemir compared with NPH insulin may not be associated with ED visits or hospitalizations for hypoglycemia. These findings aligned more closely with those from the study by Lipska et al,<sup>10</sup> whereas in middle to old age (69-87 years of age), use of longacting analogs was associated with a reduced risk of hypoglycemia compared with NPH insulin. Differences in the populations between the 2 studies included age, race/ethnicity, and Table 1. Baseline Demographic and Clinical Characteristics of Glargine, Detemir, and Neutral Protamine Hagedorn (NPH) Insulin Users Before Inverse Probability of Treatment Weighting

	No. (%) of users			Standardized mean difference			
Characteristic	Glargine	Detemir	NPH insulin	Glargine vs detemir	Glargine vs NPH	Detemir vs NPH	
Base population total	407 018 (100)	141 588 (100)	26 402 (100)	NA	NA	NA	
Age, mean (SD), y	75.00 (6.76)	74.72 (6.65)	75.11 (6.84)	0.04	0.02	0.06	
Age categorical, y							
65-74	218 367 (54)	78 402 (55)	13 936 (53)	0.03	0.02	0.05	
75-84	145 613 (36)	49 494 (35)	9595 (36)	0.02	0.01	0.03	
>85	43 038 (11)	13 692 (10)	2871 (11)	0.03	0.01	0.04	
Race/ethnicity							
White	324 641 (80)	112 528 (79)	19 833 (75)	0.01	0.11	0.10	
Black	38 547 (9)	13 291 (9)	3395 (13)	0.00	0.11	0.11	
Other	43 830 (11)	15 769 (11)	3174 (12)	0.01	0.04	0.03	
Sex							
Male	190 240 (47)	65 675 (46)	11 898 (45)	0.01	0.03	0.03	
Female	216 778 (53)	75 913 (54)	14 504 (55)	0.01	0.03	0.03	
Low-income status							
Yes	126 173 (31)	43 770 (31)	8815 (33)	0.00	0.05	0.05	
No	280 845 (69)	97 818 (69)	17 587 (67)	0.00	0.05	0.05	
Zip code-level annual income, \$							
<30 000	68 260 (17)	26 653 (19)	5320 (20)	0.05	0.09	0.03	
30 000-60 000	267 954 (66)	92 342 (65)	17 054 (65)	0.01	0.03	0.01	
>60 000	55 478 (14)	17 192 (12)	2965 (11)	0.04	0.07	0.03	
Unknown	15 326 (4)	5401 (4)	1063 (4)	0.00	0.01	0.01	
Metropolitan statistical area							
Nonrural	302 571 (74)	102 537 (72)	19 376 (73)	0.04	0.02	0.02	
Rural	104 447 (26)	39 051 (28)	7026 (27)	0.04	0.02	0.02	
Area Deprivation Index score							
Missing	15 323 (4)	5449 (4)	1152 (4)	0.00	0.03	0.03	
0-19	65 940 (16)	19 877 (14)	3863 (15)	0.06	0.04	0.02	
20-39	85 255 (21)	28 027 (20)	5171 (20)	0.03	0.03	0.01	
40-59	87 795 (22)	30 595 (22)	5572 (21)	0.00	0.01	0.01	
60-79	83 774 (21)	31 129 (22)	5493 (21)	0.03	0.01	0.03	
80-100	68 931 (17)	26 511 (19)	5151 (20)	0.05	0.07	0.02	
No. of IP visits							
0	255 489 (63)	91 781 (65)	15 923 (60)	0.04	0.05	0.09	
1	85 608 (21)	28 093 (20)	5450 (21)	0.03	0.01	0.02	
2	36 119 (9)	11 937 (8)	2570 (10)	0.02	0.03	0.05	
≥3	29 802 (7)	9777 (7)	2459 (9)	0.02	0.07	0.09	
No. of OP/ED visits							
0	274 892 (68)	96 295 (68)	17 824 (68)	0.01	0.00	0.01	
1	82 488 (20)	28 429 (20)	5244 (20)	0.00	0.01	0.01	
2	28 588 (7)	9747 (7)	1938 (7)	0.01	0.01	0.02	
≥3	21 050 (5)	7117 (5)	1396 (5)	0.01	0.01	0.01	
No. of physician visits <sup>a</sup>							
0	17 506 (4)	4277 (3)	2225 (8)	0.07	0.17	0.23	
1-4	57 216 (14)	17 174 (12)	4383 (17)	0.06	0.07	0.13	
5-10	101 467 (25)	35 346 (25)	6324 (24)	0.00	0.02	0.02	
11-20	122 618 (30)	44 911 (32)	7182 (27)	0.03	0.06	0.10	
21-30	58 705 (14)	21 752 (15)	3333 (13)	0.03	0.05	0.08	

(continued)

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# Table 1. Baseline Demographic and Clinical Characteristics of Glargine, Detemir, and Neutral Protamine Hagedorn (NPH) Insulin Users Before Inverse Probability of Treatment Weighting (continued)

	No. (%) of users			Standardized mean difference		
Characteristic	Glargine	Detemir	NPH insulin	Glargine vs detemir	Glargine vs NPH	Detemir vs NPH
≥31	49 506 (12)	18 128 (13)	2955 (11)	0.02	0.03	0.05
No. of glycated hemoglobin tests						
0	36 798 (9)	11 850 (8)	4214 (16)	0.02	0.21	0.23
1	66 303 (16)	22 166 (16)	4774 (18)	0.02	0.05	0.06
2-3	201 273 (49)	70 921 (50)	11 760 (45)	0.01	0.10	0.11
4-5	90 720 (22)	32 361 (23)	4975 (19)	0.01	0.09	0.10
≥6	11 924 (3)	4290 (3)	679 (3)	0.01	0.02	0.03
Physician specialty <sup>a</sup>						
Endocrinology	43 696 (11)	14 747 (10)	3570 (14)	0.01	0.09	0.10
Primary care	240 379 (59)	87 982 (62)	12 871 (49)	0.06	0.21	0.27
Other	122 943 (30)	38 859 (27)	9961 (38)	0.06	0.16	0.22
Other diabetes medications						
Metformin	263 194 (65)	93 095 (66)	13 532 (51)	0.02	0.27	0.30
Sulfonylureas	269 206 (66)	93 664 (66)	13 806 (52)	0.00	0.28	0.28
Thiazolidinediones	79 231 (19)	26 167 (18)	4202 (16)	0.03	0.09	0.07
DPP-4	120 166 (30)	47 431 (33)	3417 (13)	0.09	0.41	0.50
GLP-1 receptor agonist	31 686 (8)	13 154 (9)	1254 (5)	0.05	0.13	0.18
Other antidiabetic drugs	38 557 (9)	13 428 (9)	1455 (6)	0.00	0.15	0.15
No antidiabetic drug	45 160 (11)	14 140 (10)	7316 (28)	0.04	0.43	0.47
Other medications						
ACE inhibitors and ARBs	295 620 (73)	103 035 (73)	18 422 (70)	0.00	0.06	0.07
Antiarrhythmics	20 077 (5)	6961 (5)	1238 (5)	0.00	0.01	0.01
Anticoagulants, oral	60 079 (15)	19 762 (14)	3499 (13)	0.02	0.04	0.02
Antiplatelets	69 693 (17)	24 590 (17)	4391 (17)	0.01	0.01	0.02
β-Blockers	221 524 (54)	76 437 (54)	13 574 (51)	0.01	0.06	0.05
Calcium channel blockers	154 515 (38)	54 145 (38)	9993 (38)	0.01	0.00	0.01
Digoxin	26 603 (7)	8780 (6)	1560 (6)	0.01	0.03	0.01
Diuretics						
Loop	131 010 (32)	44 328 (31)	8721 (33)	0.02	0.02	0.04
Potassium	39 516 (10)	13 494 (10)	2535 (10)	0.01	0.00	0.00
Thiazides	142 886 (35)	50 287 (36)	8694 (33)	0.01	0.05	0.05
Fibrates	38 987 (10)	14 977 (11)	2050 (8)	0.03	0.06	0.10
Nitrates	34 065 (8)	11 361 (8)	2465 (9)	0.01	0.03	0.05
Statins	291 861 (72)	102 197 (72)	17 438 (66)	0.01	0.12	0.13
Medical conditions						
Atrial fibrillation	80 256 (20)	26 726 (19)	4895 (19)	0.02	0.03	0.01
COPD	83 476 (21)	28 957 (20)	5617 (21)	0.00	0.02	0.02
Chronic kidney disease stage						
1	3000 (1)	1105 (1)	168 (1)	0.00	0.01	0.02
2	10 026 (2)	3819 (3)	590 (2)	0.01	0.02	0.03
3	64 961 (16)	23 408 (17)	3583 (14)	0.02	0.07	0.08
4	13 555 (3)	4578 (3)	846 (3)	0.01	0.01	0.00
5	1062 (0)	318 (0)	103 (0)	0.01	0.02	0.03
ESRD	1886 (0)	596 (0)	185 (1)	0.01	0.03	0.04
Unspecified stage	22 570 (6)	7408 (5)	1553 (6)	0.01	0.01	0.03
Unspecified kidney failure	9822 (2)	3147 (2)	680 (3)	0.01	0.01	0.02

(continued)

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Table 1. Baseline Demographic and Clinical Characteristics of Glargine, Detemir, and Neutral Protamine Hagedorn (NPH) Insulin Users Before Inverse Probability of Treatment Weighting (continued)

	No. (%) of users			Standardized mean difference		
Characteristic	Glargine	Detemir	NPH insulin	Glargine vs detemir	Glargine vs NPH	Detemir vs NPH
Kidney sclerosis	456 (0)	154 (0)	33 (0)	0.00	0.00	0.00
None	279 680 (69)	97 055 (69)	18 661 (71)	0.00	0.04	0.05
Coronary revascularization	67 657 (17)	22 980 (16)	4208 (16)	0.01	0.02	0.01
Dementia	28 390 (7)	9509 (7)	1666 (6)	0.01	0.03	0.02
Heart failure	104 161 (26)	34 038 (24)	7056 (27)	0.04	0.03	0.06
Hospitalized myocardial infarction	21 233 (5)	6722 (5)	1455 (6)	0.02	0.01	0.03
Hospitalized stroke	34 226 (8)	11 531 (8)	2353 (9)	0.01	0.02	0.03
Hypercholesterolemia	201 288 (49)	72 001 (51)	12 098 (46)	0.03	0.07	0.10
Hypertension	378 959 (93)	132 865 (94)	24 095 (91)	0.03	0.07	0.10
Liver disease	23 614 (6)	8441 (6)	1395 (5)	0.01	0.02	0.03
Malignant tumor	108 562 (27)	37 634 (27)	6982 (26)	0.00	0.01	0.00
Obesity	98 237 (24)	34 788 (25)	5815 (22)	0.01	0.05	0.06
Prior hypoglycemia	4140 (1)	1311 (1)	386 (1)	0.01	0.04	0.05
Smoking	78 957 (19)	27 926 (20)	4655 (18)	0.01	0.05	0.05
Transient ischemic attack	19 081 (5)	6726 (5)	1224 (5)	0.00	0.00	0.01
Diabetes systemic complications						
Diabetic ketoacidosis	6304 (2)	2152 (2)	419 (2)	0.00	0.00	0.01
Nephropathy	158 742 (39)	55 230 (39)	9856 (37)	0.00	0.03	0.03
Neuropathy	129831 (32)	45 635 (32)	8511 (32)	0.01	0.01	0.00
Peripheral arterial disease	125 712 (31)	43 651 (31)	8294 (31)	0.00	0.01	0.01
Prior amputation	4902 (1)	1647 (1)	421 (2)	0.00	0.03	0.04
Retinopathy	86 712 (21)	29 922 (21)	6255 (24)	0.00	0.06	0.06
Adapted Diabetes Complications Severity Index score (categorical)						
0	66 792 (16)	23 622 (17)	4460 (17)	0.01	0.01	0.01
1-2	124 402 (31)	43 782 (31)	7926 (30)	0.01	0.01	0.02
3-4	110 884 (27)	38 132 (27)	7101 (27)	0.01	0.01	0.00
≥5	104 940 (26)	36 052 (25)	6915 (26)	0.01	0.01	0.02

Abbreviations: ACE, angiotensin-converting enzyme; ARB, angiotensin receptor blocker; COPD, chronic obstructive pulmonary disease; DPP-4, dipeptidyl peptidase-4 inhibitors; ED, emergency department; ESRD, end-stage renal disease; GLP-1, glucagon-like peptide 1; IP, inpatient; NA, not applicable; OP, outpatient. <sup>a</sup> The primary care specialty included 3 specialties (internal medicine, family practice, and general practice), whereas the other specialty included all other prescribing specialties, except for endocrinology.

type of insurance. The KPNC population was substantially younger, likely had health insurance based on employment, and had a lower proportion of White people than the Medicare population in the current study. It is possible that adherence to insulin therapy may be better in younger, actively employed individuals, which might explain the longer follow-up in the study by Lipska et al.<sup>10</sup> In addition, the practice of medicine within KPNC, with system-wide, evidencebased practice guidelines and physician performance monitoring, may contribute to improved patient adherence compared with the more heterogeneous guidelines and monitoring seen in the fee-for-service environment. However, despite a shorter median follow-up, we still had large cohorts of glargine and detemir users with follow-up beyond 1 year, indicating that our estimates of hypoglycemia risk during longer periods are still well powered. Differences in race/ethnicity between KPNC and Medicare reflect the race/ethnicity distribution in Northern California compared with the racial/ethnic distribution of older people in the entire US.

A study by Luo et al<sup>21</sup> compared severe hypoglycemia rates before and after a managed care organization's intervention encouraging Medicare beneficiaries (mean age, 72.5 years) with type 2 diabetes to switch from a long-acting analog to human insulin. They found that switching was not associated with changes in rates of serious hypoglycemia. However, as with the study by Lipska et al,<sup>10</sup> the findings from a managed care organization often cannot be generalized to other health care settings with less intensive practitioner support for chronic disease management. Indeed, the intervention in that study<sup>10</sup> included support from pharmacists, nurse practitioners, physician assisTable 2. Incidence Rates and Hazard Ratios for ED Visits or Hospitalizations for Hypoglycemia Among New Users of Glargine and Detemir Compared With Neutral Protamine Hagedorn (NPH) Insulin

			Total No. of		Unweighted		Weighted incidence	
Agent	No. of patients	Follow-up time, median (IQR), y	person- years	No. of events	Incidence rates per 1000 person-years	Hazard ratio (95% CI)	rates per 1000 person-years	Adjusted hazard ratio (95% CI)ª
Glargine vs I	NPH insulin							
Glargine	407 018	0.37 (0.20-0.73)	299 098	5194	17.37 (16.89-17.84)	0.61 (0.55-0.67)	17.37 (16.89-17.84)	0.71 (0.63-0.80)
NPH insulin	26 402	0.27 (0.2-0.55)	14994	460	30.68 (27.88-33.48)	1 [Reference]	26.64 (26.01-27.30)	1 [Reference]
Detemir vs N	IPH insulin							
Detemir	141 588	0.37 (0.20-0.76)	101 426	1693	16.69 (15.92-17.51)	0.58 (0.52-0.64)	16.69 (15.92-17.51)	0.72 (0.63-0.82)
NPH insulin	26 402	0.27 (0.20-0.55)	14994	460	30.68 (27.88-33.48)	1 [Reference]	25.04 (24.01-26.11)	1 [Reference]
Glargine vs M Glargine NPH insulin Detemir vs M Detemir NPH insulin	NPH insulin 407 018 26 402 NPH insulin 141 588 26 402	0.37 (0.20-0.73) 0.27 (0.2-0.55) 0.37 (0.20-0.76) 0.27 (0.20-0.55)	299 098 14 994 101 426 14 994	5194 460 1693 460	17.37 (16.89-17.84) 30.68 (27.88-33.48) 16.69 (15.92-17.51) 30.68 (27.88-33.48)	0.61 (0.55-0.67) 1 [Reference] 0.58 (0.52-0.64) 1 [Reference]	17.37 (16.89-17.84) 26.64 (26.01-27.30) 16.69 (15.92-17.51) 25.04 (24.01-26.11)	0.71 (0.63-0 1 [Reference 0.72 (0.63-0 1 [Reference

Abbreviations: ED, emergency department; IQR, interquartile range.

<sup>a</sup> Adjusted for inverse probability of treatment weights and time-varying concomitant use of noninsulin antidiabetic drugs, including sulfonylureas, metformin, incretins (dipeptidyl peptidase 4 inhibitors and glucagon-like peptide 1 agonists), and other antidiabetic drugs (thiazolidinediones and others).

Table 3. Hazard Ratios for ED Visits or Hospitalizations for Hypoglycemia Among New Users of Glargine and Detemir Compared With Neutral Protamine Hagedorn (NPH) Insulin According to Prandial Use During Follow-up

Concomitant prandial insulin use during follow-up	Hazard ratio (95% CI)		
Insulin glargine vs NPH insulin (expanded cohort)	)		
Time using prandial insulin			
Glargine	0.99 (0.90-1.09)		
NPH insulin	1 [Reference]		
Time not using prandial insulin			
Glargine	0.78 (0.69-0.87)		
NPH insulin	1 [Reference]		
P value for interaction (glargine × time using prandial insulin during follow-up)	.001		
Insulin detemir vs NPH insulin (expanded cohort)			
Time using prandial insulin			
Detemir	0.96 (0.86-1.08)		
NPH insulin	1 [Reference]		
Time not using prandial insulin			
Detemir	0.78 (0.68-0.89)		
NPH insulin	1 [Reference]		
<i>P</i> value for interaction (detemir × time using prandial insulin during follow-up)	.02		
Abbreviation: FD emergency department			

ADDIEVIATION: ED, emergency department.

tants, and physicians with experience in chronic disease management, which may have included counseling about hypoglycemia not offered to participants in the current study.

A Cochrane review of RCTs<sup>3</sup> to assess the effects of longterm treatment with long-acting insulin analogs compared with NPH insulin in patients with type 2 diabetes also reported no difference in severe hypoglycemia among users. The summary odds ratios from the meta-analysis were 0.70 (95% CI, 0.40-1.23) for glargine vs NPH insulin based on 4 RCTs<sup>4,5,8,9</sup> and 0.50 (95% CI, 0.18-1.38) for detemir vs NPH insulin based on 2 RCTs.<sup>6,7</sup> However, the meta-analytic summary estimates and the individual risk estimates from the RCTs trended in the same direction as the overall estimate in the current study, toward a protective association for long-acting analogs, despite lacking statistical significance. Of note, the RCTs had small sample sizes (ranging from 476 to 756 study par-





The hazard ratios are indicated by the solid line and the corresponding upper, and lower bounds of the 95% CIs are indicated by the dashed lines.





The hazard ratios are indicated by the solid line, and the corresponding upper and lower bounds of the 95% CIs are indicated by the dashed lines.

ticipants) and limited numbers of recorded outcome events, and the mean age of participants was also lower than in the current study. Other studies<sup>11,22</sup> have also found results similar to ours. Another meta-analysis of RCTs<sup>11</sup> reported a lower risk of severe hypoglycemia across 7 studies among long-acting analog users compared with NPH insulin (glargine: HR, 0.80; 95% CI, 0.67 to 0.96; detemir: HR, 0.74; 95% CI, 0.58-0.96). However, a high level of heterogeneity among studies that reported hypoglycemia outcomes was noted, which may have been related to differences in patient characteristics or treatment strategies. A network meta-analysis<sup>22</sup> of 41 studies reported a summary risk ratio for documented symptomatic hypoglycemia in glargine vs NPH insulin users of 0.65 (95% CI, 0.27-1.49).<sup>22</sup>

In real-world clinical practice, basal insulin and prandial insulin are frequently used together in the management of type 2 diabetes. In the current study, up to 29% of basal insulin users had concomitant use of prandial insulin during follow-up and were censored in the primary analysis. When timevarying use of concomitant prandial insulin was accounted for in exploratory analyses, the protective association conferred by use of long-acting analogs compared with NPH insulin seen in the primary analysis was not observed. This is an important finding and suggests that the advantages of long-acting analogs on hypoglycemia, observed in the main analysis, at least in certain age groups may not be seen if the patient initiates concomitant prandial insulin. The inclusion of prandial insulin in type 2 diabetes treatment regimens may increase complexity, especially for older users,<sup>23</sup> thereby increasing the possibility of using too much insulin, which might increase the likelihood of hypoglycemia to such an extent that the benefits from long-acting analogs compared with NPH insulin are lost. Further studies are needed to investigate the potential influence of prandial insulin use. The study by Lipska et al<sup>10</sup> did not include prandial insulin users in their analyses.

## **Strengths and Limitations**

This study has several strengths. First, to our knowledge, it is the largest study to date to examine the association between long-acting insulin analog use and ED visits or hospitalizations for hypoglycemia, and it had substantially more longacting insulin analog users compared with a recent study by Lipska et al<sup>10</sup> (548 606 vs 1928 long-acting insulin analog users). The study by Lipska et al<sup>10</sup> was conducted in an integrated delivery health care system setting. These settings tend to have formularies that restrict the use of long-acting analogs in patients with type 2 diabetes initiating use of insulin. This means that in the study by Lipska et al,<sup>10</sup> those with the most severe diabetes may have been channeled to receive a prescription for a long-acting analog and may have had a higher risk of hypoglycemia. This selection bias may result in an NPH insulin user cohort that has a lower risk of hypoglycemia. The lack of such restrictions in the choice to initiate analog insulin vs NPH insulin in Medicare is a strength of the current study. A new-user design<sup>14</sup> was applied to avoid missing potential early effects of drugs and to accurately ascertain baseline confounders. The current study was the first study to date, to our knowledge, that examined the association of long-acting insulin analog vs NPH insulin use on ED visits or hospitalizations for hypoglycemia by age and with concomitant use of prandial insulin. The current study used a propensity score method to balance observed confounders across exposure cohorts. Because NPH insulin use has declined over calendar time, bias may have been introduced by not accounting for the study year in the primary analysis; however, post hoc analyses, including year in the propensity score, found that the results did not change substantially.

The study has limitations. It was observational and therefore may be subject to potential residual confounding by factors not adjusted for in the analysis, such as unmeasured aspects of socioeconomic status, insulin dose, and glycated hemoglobin levels. Lower socioeconomic status could conceivably result in channeling to the cheapest insulin (NPH insulin) and be associated with severe hypoglycemia. However, post hoc subgroup analyses by low-income subsidy, a proxy measure for low-income status, found that the results of the primary analysis were not influenced by confounding related to socioeconomic status as measured by low-income subsidy. The study population was 65 years or older; therefore, the generalizability of findings to those outside that age range may be limited. The Medicare claims data used in this study are ideal for capturing drug exposure but may be limited in identifying hypoglycemia. To address this, the study used a modified validated algorithm<sup>15</sup> that has been applied in a previous study<sup>10</sup> and a sensitivity analysis was conducted using an unmodified version of the validated algorithm. Hypoglycemia events that did not result in an ED visit or hospitalization were not captured in this study, which may have underestimated the true incidence of hypoglycemia.<sup>24</sup> Although information on diabetes duration or baseline glycated hemoglobin levels (an indicator of baseline glycemic control) was not available, the study estimated a modified diabetes severity index<sup>16</sup> and included it in the propensity score model to account for any potential confounding by diabetes severity.

## Conclusions

Initiation of long-acting insulin analog use was associated with a lower risk of ED visits or hospitalizations for hypoglycemia compared with NPH insulin in older patients with type 2 diabetes in Medicare. However, this protective association may vary by age and was not seen with use of concomitant prandial insulin.

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Research Original Investigation

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