Association Between Trajectory of Severe Hypoglycemia and Dementia in Patients With Type 2 Diabetes: A Population-based Study

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Received October 30, 2020; accepted February 16, 2021; released online March 6, 2021

ABSTRACT

Background: We aimed to investigate associations between exposure to various trajectories of severe hypoglycemic events and risk of dementia in patients with type 2 diabetes.

Methods: In 2002–2003, 677,618 patients in Taiwan were newly diagnosed as having type 2 diabetes. Among them, 35,720 (5.3%) experienced severe hypoglycemic events during the 3-year baseline period following diagnosis. All patients were followed from the first day after baseline period to the date of dementia diagnosis, death, or the end of 2011. A group-based trajectory model was used to classify individuals with severe hypoglycemic events during the baseline period. Cox proportional hazard models with the competing risk method were used to relate dementia risk to various severe hypoglycemia trajectories.

Results: After a median follow-up 6.70 and 6.10 years for patients with and without severe hypoglycemia at baseline, respectively, 1,952 (5.5%) individuals with severe hypoglycemia and 23,492 (3.7%) without developed dementia during follow-up, for incidence rates of 109.80 and 61.88 per 10,000 person-years, respectively. Four groups of severe hypoglycemia trajectory were identified with a proportion of 18.06%, 33.19%, 43.25%, and 5.50%, respectively, for Groups 1 to 4. Groups 3 (early manifestation but with later decrease) and 4 (early and sustained manifestation) were associated with a significantly increased risk of dementia diagnosis, with a covariate-adjusted subdistribution hazard ratio of 1.22 (95% confidence interval, 1.14–1.31) and 1.25 (95% confidence interval, 1.02–1.54), respectively.

Conclusions: Our analysis highlighted that early manifestation of severe hypoglycemic events may contribute more than does late manifestation to the risk of dementia among individuals newly diagnosed as having type 2 diabetes.

Key words: dementia; type 2 diabetes; trajectory; severe hypoglycemia; cohort studies

INTRODUCTION

According to an estimate by the International Diabetes Federation, the global population of individuals with diabetes is poised to rapidly increase from 415 million in 2015 to 642 million in 2040. Among age groups, the number of diabetics aged 65–79 years is set to increase more appreciably than others, by more than twofold.1 Because both type 2 diabetes and older age are associated with increased risk of dementia, a substantial increase in people with dementia can be expected in the future, especially in aging societies.

Recent meta-analyses of observational studies have reported that type 2 diabetes was associated with a 1.6–1.8-fold increased risk of any type of dementia, a 2.0–2.5-fold increased risk of vascular dementia, and a 1.5–2.0-fold increased risk of non-vascular dementia (mainly Alzheimer disease [AD]).2,3 Neuroglycopenia resulting from a hypoglycemic episode can lead to degeneration of brain cells4 and decline in cognitive function.5 Several studies have observed that experiences of hypoglycemia were associated with elevated risk of subsequent dementia in elderly people; a dose-gradient effect of recurrent hypoglycemic episodes on risk of dementia was also observed.6–10 Compared
with people not having had a hypoglycemic episode, those with one episode had a 1.26–2.05-fold increased risk of dementia, and those with two or more episodes had a 1.50–4.07-fold increased risk.6,7,9,10

However, most studies have determined frequency of hypoglycemia by counting the number of hypoglycemic episodes over a period of time and associated the total number of episodes with incidence of dementia.7,9,10 This design presumes a constant hazard of hypoglycemic episodes over the progression of diabetes; however, this may not be accurate. One finding noted the chance of severe hypoglycemia occurrence increased with the duration of diabetes and of insulin therapy.11 Moreover, it was reported that repeated episodes of severe hypoglycemia positively correlated with the presence of certain comorbidities and that a long duration of diabetes prior to insulin treatment or anti-hypertensive medications may reduce the risk of hypoglycemia.12 These findings suggest that the chance of developing hypoglycemia over the course of diabetes may be affected by both disease progression and medication.

Current evidence indicates that hypoglycemia is prevalent among people with type 2 diabetes; particularly those on insulin, but also fairly common with other treatment regimens.13 Because severe hypoglycemic episodes can repeatedly occur during the course of type 2 diabetes, the exposure parameters regarding severe hypoglycemia that are truly associated with elevated risk of dementia must be explored. Therefore, to better illustrate the role of severe hypoglycemia on the relationship between type 2 diabetes and dementia, we conducted a population-based study to depict the trajectory of severe hypoglycemic episodes and to explore the risk of dementia associated with various trajectories of severe hypoglycemic episodes.

METHODS
Data source
Data were retrieved from Taiwan’s National Health Insurance (NHI) Research Database (NHIRD), a medical claims database that contains medical records of nearly all (>97%) Taiwanese citizens (prisoner and military personnel claims were exempted during the study period).14 The National Health Insurance Administration conducts quarterly expert reviews on a random sample of medical claims to ensure their accuracy.15 Information on median family income for 368 cities and townships in 2002–2003 was retrieved from Government Open Data, which is supervised by the Taiwan National Development Council.16 The study was approved by the Institutional Review Board of National Cheng Kung University Hospital (A-EX-106-001).

Research design and study cohorts
This was a claim data-based cohort study. Type 2 diabetes was identified if during 2002–2003 a patient had ≥1 admission or ≥2 ambulatory care visits for type 2 diabetes (International Classification of Diseases, Ninth Revision, Clinical Modification [ICD-9-CM]: 250.x0 or 250.x2) within a 365-day period and was not diagnosed as having type 1 diabetes (ICD-9-CM: 250.x1 or 250.x3) (n = 896,155). One validation study by Sung et al17 reported a sensitivity, specificity, positive predictive value, and negative predictive value of 90.9%, 94.9%, 92.0, and 94.2%, respectively, for the diagnosis of diabetes in Taiwan’s NHI claims if certain algorithm of case-identification can be applied. For example, both diagnosis codes and prescription medications recorded in the index hospitalization, or diagnosis codes appear in at least one inpatient, or in at least two outpatient claims in a year. The date of the first type 2 diabetes diagnosis in 2002–2003 was considered the enrollment date. Individuals with type 2 diabetes with diagnoses of severe hypoglycemic episodes between January 1, 1997, and the enrollment date were excluded (n = 66,507).

In determining trajectories of severe hypoglycemic episodes during the first 3 years after the enrollment date (ie, baseline period), those who died or withdrew from the NHI program during the baseline period were also excluded (n = 89,839). We further excluded people having been diagnosed as having dementia prior to the end of the baseline period (n = 62,191), leaving a total of 677,618 people with a complete 3-year baseline period in the study population. Among these, 35,720 (5.3%) experienced severe hypoglycemia during the baseline period.

Trajectory of severe hypoglycemic episodes
Hypoglycemic events recorded in medical claims from emergency or inpatient departments were considered severe hypoglycemia. By modifying the coding algorithm proposed by Ginde et al,18 we included the following ICD-9-CM codes as severe hypoglycemia: 250.8, 251.0, 251.1, 251.2, 270.3, and 962.3. Among the patients with type 2 diabetes who experienced one or more severe hypoglycemic event during the baseline period, we examined, by 6-month intervals, whether an individual experienced a severe hypoglycemia episode over the 3-year baseline period. The six repeated measurements constituted the trajectory of severe hypoglycemic episodes.

We employed the group-based trajectory model (GBTM)19 to describe and distinguish trajectory types of occurrence of severe hypoglycemia. The GBTM method assumes several latent groups of distinct polynomial functions of repeated measurements, namely trajectories. The likelihood of observing values at each time point for each individual, given they belong to one of the groups, was estimated. By maximizing the complete likelihood for all individuals (ie, the product of these individual likelihood values), polynomial growth curves were constructed to describe the shape for each trajectory group under a given number of groupings; the membership of each individual assigned to one of the groups was also determined.20,21

In this study, we chose polynomial logistic functions to construct trajectories for occurrences of severe hypoglycemia and fitted data by linear, quadratic, and cubic functions for each trajectory. The optimal number of trajectory groups and the appropriate order of trajectories were determined by considering clinical plausibility and three statistical criteria: (1) the Bayes information criterion (BIC) of the model was minimal, (2) Bayes factors (2log BIC10) between the more complex model and the simpler model exceeded 10, which is the criterion for very strong evidence against the simpler model, and (3) the group with the smallest sample size contained at least 5% of the study population.20 When the number and shapes of trajectory groups were determined, each individual was assigned to the group with the maximal posterior probability. By means of this group-based trajectory analysis, we classified all 35,720 individuals with type 2 diabetes into four groups with distinct trajectories of severe hypoglycemic episodes (Figure 1). According to severity, we named the groups as Group 1, very late manifestation (18.06% probability); Group 2, late manifestation (33.19% probability); Group 3, early manifestation but with later decrease (43.25% probability); and Group 4, early and sustained manifestation.
thyroid hormone, vitamin B12, folate, and syphilis), psychological (including a complete blood count and biochemistries, iron, neurologists or psychiatrists usually perform serum evaluation for each individual was determined using the method proposed by Liu et al,25 who classifi
can withdraw from their NHI policies. Patients with country permanently (eg, emigration to other countries) or die register with the NHI program, and only those who leave the compulsory by law for all Taiwanese citizens and residents to withdraw from the NHI program, or the end of 2011. It is to be incidences of dementia.22 Under Taiwan’s NHI program, neurologists or psychiatrists usually perform serum evaluation (including a complete blood count and biochemistries, iron, thyroid hormone, vitamin B12, folate, and syphilis), psychological examinations, and brain imaging (computed tomography or magnetic resonance imaging) to confirm the diagnosis of dementia.23 Taiwanese studies based on the NHI claims further illustrate the time frame of ascertainment of newly diagnosed type 2 diabetes, the occurrence of severe hypoglycemia after type 2 diabetes, and dementia.

Covariates
Numerous sociodemographic characteristics and clinical features were considered as covariates. Information for gender, age at enrollment, and income-based insurance premium was retrieved from the registry. The urbanization level of the area of residence for each individual was determined using the method proposed by Liu et al,25 who classified each township in Taiwan into seven categories, including population density, proportion of residents with college or higher education, percentage of elderly (>65 years) people, proportion of the workforce practicing agriculture, and number of physicians per 10^5 people. The median annual family income of each township was also employed to represent individuals’ community socioeconomic status.

Various comorbidities that predispose a person to dementia were accounted for, including cerebrovascular disease, cardiovascular disease, diabetic microvascular disease (ie, diabetic retinal disease or end-stage renal disease), peripheral neuropathy, depression, head trauma, hypertension, and hyperlipidemia. Information regarding these comorbidities was obtained from inpatient and outpatient medical claims reimbursed between January 1, 1997, and the index date. The number of ambulatory visits during the 1-year period before enrollment was counted to indicate the frequency of clinical visits, and the frequency of clinical visits was controlled to minimize the potential of disease surveillance bias.

Statistical methods
Count and percentage as well as mean and SD were used to describe sociodemographic characteristics and clinical features of individuals with or without severe hypoglycemia and the trajectory groups. Overall and sex- and age-stratified incidence rates for severe hypoglycemia were expressed by persons per 10,000 person-years (PYs) observed and calculated under the assumption of a Poisson distribution. We used the Cox proportional hazard regression model to estimate overall and sex- and age-specific hazard ratios (HRs) and their 95% confidence intervals (CIs) for dementia in relation to various trajectories of severe hypoglycemia occurrence during the baseline period. By taking death as a competing risk event and dementia as the risk of interest, subdistribution HRs (shHRs) were estimated based on the Fine and Gray model.26

Data analyses were performed using SAS (version 9.4; SAS Institute, Cary, NC, USA). A P-value of 0.05 or less was considered statistically significant.

RESULTS
Compared with those without severe hypoglycemia, patients with severe hypoglycemia were older and tended to be men. They were also more likely to live in a rural area, have a lower income, make fewer clinical visits, live in a poorer community, and have comorbidities listed in Table 1. Patients in Groups 1, 2, and 3 were essentially similar with respect to the selected characteristics. However, patients in Group 4 (early and sustained manifestation) tended to be men, younger, have higher income, and were less likely to live in a rural area or have a comorbidity (Table 1).

Over a maximum of 7 years (mean, 5.87 years) of follow-up, 1,952 (5.5%) individuals with severe hypoglycemia and 23,492 (3.7%) without were diagnosed as having dementia, corresponding to incidence rates of 109.80 and 61.88 per 10,000 PYs, respectively. The median follow-up time for patients with and without severe hypoglycemia was 6.70 and 6.10 years, respectively. Among all incident cases of dementia, 25.37% were AD (ICD-9-CM: 331.0), 11.78% were vascular dementia (VD) (ICD-9-CM: 290.4x), and the others were non-AD and non-VD. Higher incidence rates of dementia for individuals with severe hypoglycemia were observed in both men (89.01 vs 51.85 per 10,000 PYs) and women (126.85 vs 71.39 per 10,000 PYs).

Figure 1. Trajectory of severe hypoglycemic episodes occurring within 3 years after enrollment. Group 1: very late manifestation (18.06% probability); Group 2: late manifestation (33.19% probability); Group 3: early manifestation with later decrease (43.25% probability); Group 4: early and sustained manifestation (5.50% probability).

(5.50% probability). The mean of severe hypoglycemia episodes for Groups 1 to 4 were 1.86 (standard deviation [SD], 2.16), 3.15 (SD, 4.49), 2.38 (SD, 3.67), and 20.37 (SD, 10.94), respectively. 

Follow-up and end point
All individuals were followed from the day following the end of the baseline period (ie, index date, which was enrollment date plus 3 years) to the date of a new diagnosis of dementia, withdrawal from the NHI program, or the end of 2011. It is compulsory by law for all Taiwanese citizens and residents to register with the NHI program, and only those who leave the country permanently (eg, emigration to other countries) or die can withdraw from their NHI policies. Patients with ≥1 admission or ≥3 ambulatory care visits with a diagnosis of dementia (ICD-9-CM: 331.0 or 290.xx) during follow-up were considered to be incidences of dementia.22 Under Taiwan’s NHI program, neurologists or psychiatrists usually perform serum evaluation (including a complete blood count and biochemistries, iron, thyroid hormone, vitamin B12, folate, and syphilis), psychological examinations, and brain imaging (computed tomography or magnetic resonance imaging) to confirm the diagnosis of dementia.23 Taiwanese studies based on the NHI claims further illustrate the time frame of ascertainment of newly diagnosed type 2 diabetes, the occurrence of severe hypoglycemia after type 2 diabetes, and dementia.

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Among people with severe hypoglycemia in the baseline period, Group 3 (early manifestation but with later decrease) had the highest incidence rate of dementia (120.12 per 10,000 PYs), and Group 4 had the lowest incidence rate (85.94 per 10,000 PYs). Similar group discrepancy was noted for both men and women.

Table 3 presents covariate-adjusted sHRs (AsHRs) of dementia diagnosis, with AsHRs of 1.22 (95% CI, 1.14–1.31) and 1.25 (95% CI, 1.02–1.54), respectively. Further gender-specific analyses suggested that only Group 3 not Group 4 was significantly associated with increased risk of dementia diagnosis, with AsHRs of 1.22 (95% CI, 1.09–1.36) in men and 1.23 (95% CI, 1.13–1.34) in women. Additionally, age-specific analyses suggested that Groups 1 (AsHR 1.41), 2 (AsHR 1.31), and 3 (AsHR 1.21) were all significantly associated with increased AsHR of dementia in younger (<65 years of age) patients. However, only Group 3 was significantly associated with increased AsHR of dementia for older (≥65 years) patients (AsHR 1.23).

Compared to those who did not suffer from severe hypoglycemia, patients with severe hypoglycemia at baseline had higher prescriptions of various anti-glucose drugs, including sulfonylurea, meglitinide, thiazolidinedione, alpha-glucosidase inhibitor, and insulin. They also had significantly higher prevalence of beta-blocker use. We also noted differences in anti-glucose use among different groups of patients with severe hypoglycemia. Both sulfonylurea and alpha-glucosidase inhibitor were prevalent in patients of Group 4 who had a higher frequency of severe hypoglycemia. (eTable 1).

Our study used severe hypoglycemia events in the first 3 years after type 2 diabetes diagnosis to determine severe hypoglycemia trajectories and ignored any severe hypoglycemia event occurring during follow-up, which might be subject to biased estimation of dementia risk associated with severe hypoglycemia. We performed a sensitivity analysis by including severe hypoglycemia events occurring during the followed period to assess their impact on incident dementia. The results are shown in eTable 2. Similar to the original analysis, both Groups 3 and 4 (ie, patients with severe hypoglycemia had higher risk of dementia) were associated with a significant risk of dementia, with AsHRs of 1.22 (95% CI, 1.09–1.36) in men and 1.23 (95% CI, 1.13–1.34) in women. Additionally, age-specific analyses suggested that Groups 1 (AsHR 1.41), 2 (AsHR 1.31), and 3 (AsHR 1.21) were all significantly associated with increased AsHR of dementia in younger (<65 years of age) patients. However, only Group 3 was significantly associated with increased AsHR of dementia for older (≥65 years) patients (AsHR 1.23).

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Table 3 presents covariate-adjusted sHRs (AsHRs) of dementia diagnosis for various groups of patients with severe hypoglycemia. Compared with controls, both Groups 3 (early manifestation but with later decrease) and 4 (early and sustained manifestation) were associated with a significantly increased risk of dementia diagnosis, with AsHRs of 1.22 (95% CI, 1.14–1.31) and 1.25 (95% CI, 1.02–1.54), respectively. Further gender-specific analyses suggested that only Group 3 not Group 4 was significantly associated with increased risk of dementia, with AsHRs of 1.22 (95% CI, 1.09–1.36) in men and 1.23 (95% CI, 1.13–1.34) in women. Additionally, age-specific analyses suggested that Groups 1 (AsHR 1.41), 2 (AsHR 1.31), and 3 (AsHR 1.21) were all significantly associated with increased AsHR of dementia in younger (<65 years of age) patients. However, only Group 3 was significantly associated with increased AsHR of dementia for older (≥65 years) patients (AsHR 1.23).

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early manifestation of severe hypoglycemia) were still at significantly elevated risk of dementia, with an HR of 1.25 (95% CI, 1.17–1.33) and 1.36 (95% CI, 1.11–1.67), respectively. Patients in Groups 1 and 2, on the other hand, were not significantly associated with dementia. Furthermore, the severe hypoglycemia events occurring during follow-up period also posed a moderate but significant impact on incident dementia, with an HR of 1.14 (95% CI, 1.10–1.18).

### DISCUSSION

The associations between and mechanisms of hypoglycemia and
dementia have been documented. The dose-gradient effect of hypoglycemic episodes on dementia has also been reported. However, to the best of our knowledge, this is the first study to investigate long-term dynamic trajectories of severe hypoglycemic episodes using the national medical claims data of the entire population of a country, the number of which may be sufficient for reliable trajectory grouping and comparison. Our findings not only provide further support for the notion that severe hypoglycemia may modestly increase the risk of dementia in people with diabetes but also highlight the potential adverse effect of early manifestation of severe hypoglycemia on subsequent risk of dementia.

Few (5.3%) patients with type 2 diabetes experienced severe hypoglycemia within 3 years after type 2 diabetes was newly diagnosed. Among them, individuals in Groups 3 and 4 had severe hypoglycemia that manifested at an earlier time during the 3-year baseline period, representing 43.25% and 5.50%, respectively, of the study cohort. Severe hypoglycemic events were sustained for the entire 3-year baseline period for Group 4 patients, who were identified as more likely to be men, younger, and living in more affluent areas. This group also had fewer comorbidities. This finding is consistent with results reported by Yen et al, who examined factors that influenced continuing care participation of patients with type 2 diabetes and factors contributing to interrupted participation of patients with diabetes enrolled in a diabetes pay-for-performance (P4P) program in Taiwan. They determined that interruption of P4P program participation occurred in 78,759 (44.33%) of the enrolled patients with diabetes and was correlated with male sex, younger age (<35 years), residence in areas with the highest urbanization levels, and greater severity of diabetes complications.

Even after adjustment for various sociodemographic characteristics and selected comorbidities, patients with early manifestation of severe hypoglycemia (ie, Groups 3 and 4) were associated with significantly increased risk of dementia. Three possible explanations may account for this. First, patients with early occurrence of severe hypoglycemic events are prone to dysglycemia (ie, fluctuation of blood sugar levels) and have a greater chance of resultant lower white and gray matter volume, as well as reduced visuospatial function and cognitive speed. Moreover, previous studies have proposed that poor glycemic controls, such as impaired HbA1C levels and fluctuation of glucose values, are associated with higher risk of hypoglycemia-related cognitive impairment among patients with type 2 diabetes. Second, patients newly diagnosed as diabetic with early manifestation of hypoglycemia abstracted from the medical claims may have actually had diabetes for a longer period because type 2 diabetes has a high likelihood of delayed and under-diagnosis. The International Diabetes Federation has reported that undiagnosed type 2 diabetes ranges from 24.1% to 75.1% among adult diabetes patients. Third, the baseline period was 3 years in our study design. Because Group 3 and 4 individuals developed severe hypoglycemia at an earlier time than those in Groups 1 and 2, they may be expected to have a longer duration of exposure to severe hypoglycemia, which increases the risk of dementia.

We further compared Group 3 and Group 4 trajectories and noted that Group 4 had more sustained severe hypoglycemic events and represented slightly higher overall and age-specific AsHRs, although the age-specific AsHRs were revealed to be nonsignificant. Theoretically, early and persistent manifestation of hypoglycemia (eg, Group 4 patients) would demonstrate the highest risk of dementia. Animal models have demonstrated that severe hypoglycemia may induce hippocampal neuronal damage, directly resulting in learning and memory deficits. Other clinical studies of patients with diabetes have noted that severe hypoglycemia alters brain structure and causes significant cognitive damage. Hence, sustained hypoglycemic episodes are likely interrelated with dementia through the extent of neuronal damage following various forms of central nervous system insults (eg, stroke) in both preclinical and clinical stages, which may account for the significantly increased risk of dementia in Group 4 patients. The elevated but nonsignificant risk of dementia in the sex- and age-specific analyses of Group 4 patients could be due to inadequate sample size. The possible pathophysiological mechanism for the relationship between sustained severe hypoglycemic events and dementia might be that severe hypoglycemia is likely to interrelate with dementia through the counterbalance of glucose-sensing neurons between glucose-excited or glucose-inhibited neuronal activities, resulting in neuronal cell death. Therefore, early severe hypoglycemic episodes, especially with a persistent pattern, may be a novel risk factor, in addition to conventional factors, for subsequent dementia among patients with type 2 diabetes.

A noteworthy strength of this study was the novel use of severe hypoglycemia trajectories in association with the risk of dementia. Our results clearly demonstrated that not only the presence of severe hypoglycemia but also its trajectories were significantly associated with the risk of dementia, which has imminent clinical implications. Another methodological strength is that we considered death a competing risk event in our analysis, avoiding overestimation of the risk of dementia in relation to severe hypoglycemia.

Despite these strengths, the algorithm used to ascertain disease might be subject to inadequate sensitivity, specificity, positive predictive value, and negative predictive value because the algorithm was solely dependent upon electronic medical records (EMR). We preferably need a high positive predictive value in identifying our cohort patients with severe hypoglycemia. In addition, a high specificity is essential for our claim data to classify dementia status. It is unfortunate that the complete information concerning the above validity-related criteria is still lacking for Taiwan’s NHIRD datasets. Apart from the potential problems with the use of EMR, there are still some other weaknesses that need to be discussed. First, information for blood glucose level and cognitive function was not available in the NHIRD because such information is not required for claims reimbursement. Individuals with mild hypoglycemia or mild cognitive impairment may not necessarily be identified in the medical claims data. Second, neither clinical parameters, including genotypes, HbA1C level, blood pressure, or body mass index, nor health-related behaviors related to blood sugar control such as hypoglycemia awareness, physical exercise, alcohol consumption, smoking, missed meal, or diet control were available in the NHIRD. In addition, indicators of socioeconomic status, such as educational attainment, have been documented to affect both hypoglycemia and dementia in patients with diabetes. Omitting these variables from the analyses may have resulted in a degree of residual confounding. Third, we included patients with type 2 diabetes who survived at least 3 years following the enrollment date (ie, the 3-year baseline period), which might have entailed a potential for selection bias if
those who died earlier had specific trajectories of severe hypoglycemia. Fourth, although we managed to correctly identifying the events of type 2 diabetes, severe hypoglycemia, and dementia using certain algorithms, the potential for disease misclassification may not be entirely avoided. Misclassification of severe hypoglycemia was likely to be non-differential as the degree of misclassification is unlikely to be affected by dementia status, which occurred years later. Non-differential misclassification of severe hypoglycemia is likely to attenuate the association between severe hypoglycemia trajectory and dementia,\textsuperscript{3,54} which could contribute to the null association of dementia with both Groups 1 and 2. On the other hand, there might be a potential for detection bias in which diabetes patients with severe hypoglycemia might have a higher chance of being diagnosed as dementia due to their frequent clinical visits. To address this concern, we calculated the average annual number of inpatient/outpatient visits at the 3-year baseline period and then adjusted the average annual number of clinical visits in the regression model. The mean annual number of clinical visits for patients in Group 1 to Group 4 was 35.69 (SD, 23.09), 36.28 (SD, 23.58), 38.83 (SD, 24.87), and 33.99 (SD, 21.98), respectively, which were all higher than the figure for controls (29.86; SD, 19.25).

Although the ORs of dementia associated with various trajectories of severe hypoglycemia slightly reduced, the results were essentially very similar, suggesting small magnitude of detection bias in our study. Because the ascertainment of disease from EMR could be involved in both non-differential and differential disease misclassification, it is very difficult to assess the overall influence of disease misclassification on our study findings.

Conclusion
We demonstrated that early manifestation and uninterrupted clusters of severe hypoglycemia within a 3-year period after new diagnosis of type 2 diabetes were significantly associated with an increased risk of subsequent dementia. As such, early or persistently recurrent severe hypoglycemia can be used as a measure for risk stratification of dementia in patients with type 2 diabetes. We conclude that patients with type 2 diabetes experiencing early or persistent hypoglycemic episodes after a new diagnosis should be managed promptly not only for any underlying comorbidities, such as vascular diseases, but also for their glucose levels to reduce the subsequent risk of dementia.

ACKNOWLEDGMENTS
We thank Taiwan’s National Health Insurance Administration for supporting the data and Tsaoitun Psychiatric Center, Ministry of Health and Welfare of Taiwan for supporting this study.

Ethics approval and consent to participate: The study was approved by the Institutional Review Board of National Cheng Kung University Hospital (A-EX-106-001).

Consent for publication: Not applicable.

Funding: The funding of this study was supported by a grant from the Ministry of Science and Technology (MOST 106-2314-B-006-025).

Authors’ contributions: Conceptualization, CYL, CLL, WHH and SM; Methodology, CYL, CLK, CLL, WHH and SM; Validation, CYL, YHC, and CLL; Formal Analysis, CYL and WHH; Resources, CYL, CLK; Data Curation, CYL, YHC and WHH; Writing – Original Draft Preparation, CYL, CLL, YHC, WHH and SM; Writing – Review & Editing, CYL, CLK, CLL, YHC, WHH and SM. The author(s) read and approved the final manuscript.

Availability of data and materials: The data that support the findings of this study are available from [Taiwan’s National Health Insurance Administration] but restrictions apply to the availability of these data, which were used under license for the current study, and so are not publicly available. Data are however available from the authors upon reasonable request and with permission of [Taiwan’s National Health Insurance Administration].

Conflicts of interest: None declared.

APPENDIX A. SUPPLEMENTARY DATA
Supplementary data related to this article can be found at https://doi.org/10.2188/jeaJE20200518.

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