



University of Dundee

The relationship between acute kidney injury and chronic kidney disease in patients with Type 2 Diabetes

Hapca, Simona; Siddiqui, Moneeza K.; Kwan, Ryan S. Y.; Lim, Michelle; Matthew, Shona; Doney, Alex S. F.

Published in:
Journal of the American Society of Nephrology

DOI:
[10.1681/ASN.2020030323](https://doi.org/10.1681/ASN.2020030323)

Publication date:
2020

Document Version
Peer reviewed version

[Link to publication in Discovery Research Portal](#)

Citation for published version (APA):
Hapca, S., Siddiqui, M. K., Kwan, R. S. Y., Lim, M., Matthew, S., Doney, A. S. F., Pearson, E. R., Palmer, C. N. A., Bell, S. (2020). The relationship between acute kidney injury and chronic kidney disease in patients with Type 2 Diabetes: an observational cohort study. *Journal of the American Society of Nephrology*.
<https://doi.org/10.1681/ASN.2020030323>

General rights

Copyright and moral rights for the publications made accessible in Discovery Research Portal are retained by the authors and/or other copyright owners and it is a condition of accessing publications that users recognise and abide by the legal requirements associated with these rights.

- Users may download and print one copy of any publication from Discovery Research Portal for the purpose of private study or research.
- You may not further distribute the material or use it for any profit-making activity or commercial gain.
- You may freely distribute the URL identifying the publication in the public portal.

Take down policy

If you believe that this document breaches copyright please contact us providing details, and we will remove access to the work immediately and investigate your claim.

The relationship between acute kidney injury and chronic kidney disease in patients with Type 2 Diabetes: an observational cohort study

Simona Hapca^{1,2}, Moneeza K Siddiqui¹, Ryan S.Y. Kwan¹, Michelle Lim³, Shona Matthew¹, Alex S.F. Doney¹, Ewan R. Pearson¹, Colin N.A Palmer^{1*}, Samira Bell^{1,3*}, on behalf of the BEAt-DKD Consortium

¹Division of Population Health and Genomics, School of Medicine, University of Dundee, Dundee, DD1 9SY, UK.

²Division of Computing Science and Mathematics, University of Stirling, Stirling, FK9 4LA, UK.

³Renal Unit, Ninewells Hospital, Dundee, DD1 9SY.

*Both authors have contributed equally to this manuscript.

Corresponding author: Dr Samira Bell

Division of Population Health and Genomics, Ninewells Hospital and Medical School, Dundee DD1 9SY, U.K.

e-mail: s.t.bell@dundee.ac.uk

Significance Statement

There is currently a limited understanding of the interplay between AKI and CKD in people with type 2 diabetes and how this compares to the non-diabetic population. Through development of an algorithm which can be applied to routinely collected biochemistry data, this study has quantified the risk of AKI in patients with diabetes and how this relates to CKD. These findings have both important epidemiological and clinical implications demonstrating that the risk of AKI and associated adverse outcomes in this population of patients is currently underestimated. Increasing awareness may allow for implementation of simple interventions which prevent the occurrence of AKI thereby improving patient outcomes.

Abstract

Background

Type 2 diabetes is one of the leading causes of chronic kidney disease (CKD) and an independent risk factor for Acute Kidney Injury (AKI). This study aims to evaluate rates of AKI and how this relates to CKD status and further renal function decline in patients with and without type 2 diabetes using electronic healthcare records.

Methods

Study design was a retrospective cohort study. The negative-binomial model for counts with follow-up time as offset, adjusted for sex and age was used to evaluate AKI rates in people with and without diabetes depending on CKD status. A mixed effect linear model adjusted for demographic characteristics and co-morbidities was developed to evaluate decline in glomerular filtration rate (GFR) before and after an AKI event depending on diabetes and CKD status.

Results

The cohort was formed of 16700 participants with a median follow-up of 8.2 years. 9417 of these had type 2 diabetes and 7283 had no diabetes. 48.6% (N=4580) of participants with diabetes developed AKI compared to 17.2% (N=1257) of controls. 46.3% (N=4359) of those with diabetes had CKD vs 17.1% (N=1251) of controls. In the absence of CKD, AKI rate was five times higher in people with diabetes than controls (121.5 vs 24.6 per 1000 person-years, Rate Ratio RR=4.9, 95% CI 4.4-5.5), whereas for people with CKD, rate of AKI was twice higher in people with diabetes than controls (384.8 vs 180.0 per 1000 person-years, RR=2.1, 95% CI 1.9-2.4 after CKD date and 109.3 vs 47.4 per 1000 person-years, RR=2.3, 95% CI 1.8-3.0 prior to CKD). Fall in eGFR slope before AKI was steeper in people with diabetes compared to those without diabetes. After AKI episodes, loss of eGFR became steeper in people without diabetes, but did not increase in those with diabetes and pre-existing CKD.

Conclusion

Rates of AKI are significantly higher in patients with diabetes compared to patients without diabetes, and this remains true for individuals with pre-existing CKD.

Keywords: acute kidney injury; chronic kidney disease; type 2 diabetes; epidemiology; incidence.

The relationship between AKI and CKD in patients with T2DM

METHODS



Retrospective cohort study



AKI episodes identified from longitudinal serum creatinine measures



N = 16700
9417 with type 2 diabetes
7283 without diabetes



8.2 years
Median follow up

OUTCOME



No CKD



AKI rates were higher in people with diabetes

Rate Ratio 4.9 (4.4-5.5)

121.5 vs 24.6 per 100 person-years



CKD



AKI rates were higher in people with diabetes

Rate Ratio 2.1 (1.9-2.4)

38.4 vs 18.0 per 100 person-years

Rate Ratio 2.3 (1.8-3.0)

109.3 vs 47.4 per 100 person-years

After CKD date

Prior to CKD



People with diabetes had a significant decrease in eGFR prior to AKI compared to those without diabetes prior to AKI.

CONCLUSION Rates of AKI are significantly higher in patients with diabetes compared to patients without diabetes, and this remains true for individuals with pre-existing CKD.

1 **Introduction**

2 Type 2 diabetes is one of the leading causes of chronic kidney disease (CKD) and end-stage renal disease
3 worldwide ¹. A large proportion of patients who develop CKD experience prior episodes of acute kidney
4 injury (AKI), with evidence suggesting that kidney function does not fully recover following the AKI
5 event¹. Moreover, CKD is a well-known risk factor for AKI, with recent studies suggesting that there is a
6 considerable overlap between the pathophysiology underlying the two conditions ². However the
7 relationship is likely to be complex and remains poorly understood.

8 Type 2 Diabetes (T2D) has been reported as an independent risk factor for AKI in previous observational
9 studies ^{3,4} and progressive decline in kidney function has also been well described in this population ¹.
10 Both AKI and CKD have been identified as risk factors for cardiovascular disease ⁵, which is the most
11 frequent complication in T2D. Despite the increased access to routinely collected health care data,
12 there are few observational studies evaluating the risk of AKI in people with T2D ^{6,7}, and even fewer
13 simultaneously investigating AKI and CKD in this population ¹. As a result, there is a limited
14 understanding of the interplay between AKI and CKD in people with T2D and how this compares to the
15 non-diabetic population. ⁸ Previously, quantification of AKI from routine health care data was limited to
16 the use of hospitalization and death using International Classification of Diseases (ICD) coding ⁶. More
17 recently, the Kidney Disease Improving Global Outcome (KDIGO) definition for AKI based on changes in
18 serum creatinine (SCr) has been universally adopted which has enabled a more uniform approach ^{9,10}.
19 However, this approach comes with its challenges, which mainly relate to the application of the KDIGO
20 definition. In clinical practice AKI can only be identified when previous tests within a time window are
21 available for comparison, which may not be the case when blood testing is infrequent. To overcome
22 this, various time windows to define baseline creatinine have been proposed, including the use of both
23 prior and post index values ¹¹⁻¹⁶. Despite the numerous definitions, the variation in the intensity of blood
24 sampling may still lead to misclassification between AKI and CKD ¹⁰. This highlights the importance of

25 accurate definitions for both AKI and CKD that can be used in database studies to help understand the
26 contribution of AKI to CKD and CKD progression, as well as the risk of developing AKI in patients with
27 CKD.

28 The aim of this study was to develop an algorithm to examine rates of AKI in patients with and without
29 T2D depending on CKD status using routinely collected healthcare data, and to investigate whether the
30 association between AKI on GFR decline is different in people with T2D compared to people without
31 diabetes.

32

33 **Methods**

34 **Study population**

35 The design is a retrospective cohort study of people from the Tayside region of Scotland (n = 402641 on
36 1 January 2012) which represents about 8% of the Scottish population. People with and without type 2
37 diabetes that were matched by age, sex and general practice were recruited in the Genetic of Diabetes
38 Audit and Research in Tayside Study (GoDARTS) from December 1998 to October 2012 which includes
39 either at diabetes or eye screening clinics or through their GP ¹⁷. About 50% of the patients with T2D at
40 that time from Tayside region were recruited into GoDARTS ⁸. Participants attended a clinic at
41 recruitment, where a serum sample was collected to allow a number of routine biochemical measures
42 to be measured. Recruitment was treated as the baseline for this study with participants being followed
43 up until May 2017 using comprehensive electronic records.

44 The current study includes participants from GoDARTS with type 2 diabetes at baseline to form the
45 diabetic group and patients with no diabetes to form the control group. To allow for an accurate
46 estimation of AKI rate in patients without diabetes, patients from GoDARTS who develop diabetes later
47 during the follow-up time were not included in the study. Also, patients without SCr measures on or
48 after recruitment were not included. For the eGFR slope analysis, patients with three or more SCr values

49 with at least one-year gap between the first and last measure prior to the first AKI episode (if applicable)
50 and three or more SCr measures after the AKI episode with at least 90 days gap between the first and
51 last of these measures were included. Patients with an AKI event prior to analysis were excluded.

52

53 **Datasets and variables**

54 The GoDARTS study was linked through an individual-specific anonymised identifier to the following
55 clinical datasets: information on diabetes including type of diabetes and date of diagnosis was acquired
56 from the Scottish Care Information – Diabetes Collaboration (SCI-DC) Diabetes Summary and
57 Longitudinal data ¹⁸. SCr values were obtained from the laboratory biochemistry system, comprising of
58 SCr measures from both primary and secondary care. The Scottish Renal Registry was used to identify
59 patients receiving renal replacement therapy (RRT) and date of therapy initiation ¹⁹. The Scottish
60 Morbidity Records 01 (SMR01) for hospital admission was used to evaluate patient comorbidities
61 including coronary artery disease, congestive heart failure, peripheral vascular disease, cerebrovascular
62 disease and liver disease based on ICD-10 codes at admissions prior to recruitment. The community
63 prescribing data was used to assess whether the patient have been prescribed any of the following
64 classes of anti-hypertensive drugs: diuretics, angiotensin converting enzyme (ACE) Inhibitors,
65 angiotensin receptor blockers (ARBs), beta-blockers and calcium channel blockers ²⁰. The demographics
66 dataset was used to determine participant sex and date of birth which was used to calculate age at
67 recruitment. Patients who had moved out of Tayside health board were treated as lost to follow-up. The
68 Community Health Index death dataset (CHI - the NHS Scotland population register) was used to obtain
69 date of death. Follow-up time was defined as the time from recruitment until May 2017, or date of RRT,
70 or date of death, or date the patient moved out of Tayside health board, which ever occurred first.

71

72

73 **Development of an algorithm to identify AKI episode from serum creatinine tests**

74 SCr measures from Jan 1988 to May 2017 were used in the analysis; measures obtained after initiation
75 of RRT were not included. All assays in the region are done in the same regional laboratory, and SCr
76 measures were adjusted for changes in assays over time. AKI was defined based on the KDIGO criteria ⁹.
77 As testing was infrequent with large time gaps in some patients, leading to a lack of baseline being
78 calculated , we developed an algorithm to calculate baseline creatinine incorporating both prior and
79 post index creatinine measurements in the definition of baseline (Table 1). Severity of AKI (Stages 1-3,
80 Table 1) was defined using KDIGO criteria ⁹. To identify AKI episodes, SCr that were within seven days
81 apart were grouped into single episodes of care. Within the episode of care, a 1.2-fold increase in
82 creatinine from baseline was used to evaluate SCr values measured before and after each Scr value
83 flagged as AKI case in order to assess AKI initiation and recovery and determine the start and the end of
84 the AKI episode ²¹. Furthermore, if two AKI episodes were within seven days apart then the two
85 episodes and SCr values in-between were grouped into one AKI episode ²¹. The length of AKI episode
86 was calculated based on start and end dates of the AKI episode and was used to assess whether AKI had
87 progressed to Acute Kidney Disease (AKD), defined as an AKI lasting more than seven days ²². The
88 highest AKI stage within the episode was used to define the stage of the AKI episode.

89

90 **Estimated Glomerular filtration rate (eGFR) and CKD status**

91 The CKD-EPI formula was used to estimate glomerular filtration rate (eGFR) from serum creatinine ²³.
92 Development of CKD was defined according to the CKD-KDIGO guideline as eGFR < 60 ml/min per
93 1.73m² present on at least two occasions at least 90 days apart ²³. To avoid misclassification between
94 AKI and CKD, eGFR values contained within AKI episodes were first removed from the longitudinal data.
95 The variation in the intensity of blood sampling, led to eGFR estimates either too distant (in healthy
96 individuals) or too dense over time (in sicker patients). As a result a median smoother was applied to the

97 remaining eGFR values based on a set of rules derived from the CKD-KDIGO definition as follows; for
98 each date of index blood test, three eGFR baseline values were calculated using the median eGFR for the
99 period 365 to 91 days prior to the index date, then 7 days prior to 7 days after index, and 91 to 365 days
100 after index date respectively. CKD diagnostic date was established when at least two of the three
101 medians were below 60 ml/min per 1.73m² (Table 2).The CKD date was then compared against
102 recruitment date to determine whether participants had prevalent CKD at recruitment or they
103 developed incident CKD during follow-up.

104

105 **Primary and secondary outcomes**

106 The primary outcome was the number of AKI episodes per person during follow-up, which was used to
107 calculate AKI episode rates per 1000 patients per year (including recurrent events) and AKI rate ratios in
108 people with type 2 diabetes vs non-diabetes depending on CKD status. The secondary outcome was
109 eGFR decline over time calculated as the eGFR slope of the linear regression model per one-year unit
110 increase. Other outcomes were number of patients experiencing AKI during follow-up, length of AKI
111 episodes and AKI stage.

112

113 **Statistical methods to analyse AKI rates depending on CKD status**

114 Counts and proportions for categorical variables and mean and standard deviation (SD) or median and
115 inter-quartile range (IQR) for quantitative data were used to describe the demographic characteristics.
116 These were reported in people with and without diabetes and by CKD status (no-CKD at recruitment or
117 during follow-up, pre-CKD to account for the period prior to CKD development for those that developed
118 CKD during follow-up, and post-CKD to include the post- CKD period for those that had CKD at
119 recruitment or developed CKD during follow-up. The difference between two independent proportions
120 were calculated based on Wilson's method ²⁴. The negative-binomial model for counts with log-link and

121 follow-up time as offset was used to analyse the primary outcome and to estimate rates of AKI episodes
122 in cases and controls depending on CKD status. The relationship between the outcome and the
123 explanatory variable (sex, age and diabetes status) was assumed linear via the log-link function ²⁵. Un-
124 adjusted AKI rates and rates adjusted for age and sex were provided together with the corresponding
125 rate ratios (RRs) for association. Further adjustment for co-morbidities at recruitment was performed to
126 investigate how much of the effect of diabetes on AKI incidence rates can be explained by pre-existing
127 co-morbidities. The chi-square test was used to investigate the association between diabetes and AKI
128 stage and the non-parametric Mann-Whitney test was used to investigate differences in the length of
129 AKI episodes between the T2D vs control groups.

130 Sensitivity analyses was conducted to evaluate and compare incidence rates for stages 2 and stage 3
131 AKIs, and AKIs longer than 48 hrs respectively, as well as for AKIs occurring during hospital admission in
132 people with diabetes vs controls.

133

134 **Statistical methods to analyse of longitudinal eGFR data**

135 eGFR values measured during AKI episodes were first removed from the data and replaced at the start
136 of the episode with a baseline eGFR calculated as the median eGFR for the seven days prior to the AKI
137 episode if measures were available, otherwise the median eGFR of values measured between 365 and 8
138 days prior to the start of the AKI episode was used. A linear-mixed effect model was used to analyse the
139 association between AKI and eGFR decline from the longitudinal eGFR data. AKI was included into the
140 model as a time-varying factor with three levels: no AKI for patient with no AKI event during the follow-
141 up, pre-AKI for patient with an AKI event during follow-up for the period prior to the AKI and post-AKI
142 for the period after the AKI episode ²⁶. To identify significant changes in eGFR slope pre and post AKI
143 event and whether these changes differ between people with T2D and controls an interaction term
144 between AKI, T2D status and time was accommodated into the model. Baseline variables such as sex,

145 age (treated as age groups) and presence of cardiovascular diseases were fitted into the model with
146 both fixed intercept and slope. An interaction between these variable and T2D was also included and
147 Akaike Information Criterion (AIC) was used for variable selection. Given the strong interaction effects
148 between AKI, diabetes and CKD status, the analysis was conducted separately for people with no CKD at
149 recruitment and those that had an established CKD diagnosis prior to recruitment. The mixed model was
150 fitted with both random intercept and slope per individual before and after the AKI episode (when
151 applicable), assuming an unstructured covariance matrix for the random effects.
152 Data linkage and analysis was carried out using SAS® 9.4 (SAS Institute Inc., Cary, NC, USA).

153

154 **Results**

155 **The cohort**

156 A total of 18306 participants were recruited into the GoDARTS cohort, of which 16700 met the selection
157 criteria. 9417 of patients had type 2 diabetes at recruitment and 7283 did not have diabetes at
158 recruitment nor developed it later and formed the control group. 1606 patients were excluded from the
159 current study, of which 681 had other types of diabetes, 720 developed diabetes after recruitment and
160 205 did not have SCr tests on or after recruitment (Figure 1). Table 3 shows baseline characteristics of
161 the cohort. People within type 2 diabetes were older than controls (66.9 vs 60.8 years old, difference 6.0
162 years, 95% CI 5.7-6.4) and 44.0% were females compared to 51.4% in the control group (difference
163 7.4%, 95% CI 5.8-8.9). People with T2D had a lower eGFR at baseline compared to controls (76.6 vs 84.3,
164 difference 7.7, 95% CI (7.1-8.29)), 26.6% of people with T2D had CKD at recruitment compared to only
165 9.1% in the control group (difference 17.5%, 95% CI (16.3-18.6)), and there was a higher percentage of
166 people with cardiovascular disease in the diabetic group compared to control (Table 3). The mean (SD)
167 follow-up time from recruitment was 8.2 (3.5) years for people with type 2 diabetes vs (2.4) for controls.

168

169 **AKI and AKI episodes**

170 Table 4 shows summary statistics of SCr measures from recruitment and describes the frequency of AKI
171 in the two groups. A total of 512615 SCr tests were recorded from recruitment; of those 387657 (75.6%)
172 were from patients with type 2 diabetes. The median (IQR) number of SCr measures per individual
173 during the follow-up were 31 (19-51) in type 2 diabetes vs 11 (4-21) in controls. Including post AKI
174 creatinines in order to calculate a baseline value increased the yield of AKI cases from 28306 to 40567.
175 A breakdown of AKI cases identified using the different baseline SCr definitions using pre and post Index
176 SCr measures is shown in Table S1 in the supplementary material. After grouping successive tests into
177 episodes, a total of 13928 AKI episodes were identified from recruitment until end of follow-up. Of these
178 11647 were experienced by patients with diabetes. AKI occurred in 5837 patients representing 48.6%
179 (N=4580) of patients with type 2 diabetes vs 17.2% (N=1257) of controls (difference 31.4%, 95% CI 30.0-
180 32.7). More than 50% of patients with diabetes experiencing AKI had recurrent AKI, whereas the
181 majority of patients in the control group with AKI had only one episode of AKI during follow-up (Table 5).
182 Overall 54.2% of AKI episodes lasted no more than two days, a further 26.5% between 2 to 7 days, and
183 the remaining 19.3% of AKI episodes were longer than 7 days resulting in AKD. Less than five AKI/AKD
184 episodes were greater than 90 days, however after inspection it was revealed that these occurred
185 during hospitalisation due to other complications. 76.3% of AKI episodes were stage 1 with the rest
186 being stage 2 or 3. Diabetes was significantly associated with increased AKI episode length (p-value
187 <0.001) but not significantly associated with AKI stage (p-value=0.737).

188

189 **AKI and CKD**

190 Figure S1 illustrates the complex interplay between AKI/AKD and CKD and the many trajectories evolving
191 during the course of the disease. The way AKI initiates and develops can take many forms ranging from
192 one acute kidney insult which improves rapidly with full recovery within seven days (figure a2) to one or

193 more acute kidney insults during the course of the disease which progress to AKD requiring more than
194 seven days to resolve. There are also cases when serum creatinine does not fully reverse after an AKI
195 episode leading to the development of CKD (Figure d2). This further shows that, while some patients
196 fully recover following an episode of AKI and never develop CKD (Figure a1-a3), others may experience a
197 rapid kidney decline following an AKI episode (figure d1-d3). At the same time there is also the
198 possibility to develop CKD without prior AKI episodes, and only experience AKI later as superimposed on
199 CKD (figures b1-b3, c1-c3).

200 Table 6 describes the characteristics of people with diabetes vs controls in terms of their sex, age and
201 follow-up time as well as frequency of AKI during follow-up depending on CKD status. 26.6% (N=2504) of
202 people with diabetes had CKD at recruitment and further 19.7% (n=1855) developed the condition
203 during follow-up leading to a total of 46.3% (n=4359) people with CKD in the diabetic group compared
204 to 17.1% (n=1251) in the control group (difference 29.2%, 95% CI 27.8-30.4). In people with diabetes
205 and CKD, 50.3% were female (n=2192) compared to only 38.6% (n=1954) in those without CKD
206 (difference 11.7%, 95% CI 9.7-13.7). Also, people with diabetes developed CKD at a younger age
207 compared to people in the control group (mean age 74.1 vs 77.6 years, difference 3.5 years, 95% CI 3.0-
208 4.0) 66.1% (n=2883) of people with diabetes who developed CKD experienced AKI superimposed on CKD
209 in the diabetic group compared to 45.5% (n=569) in the control group (difference=20.6%, 95% CI 17.5-
210 23.8). Additionally, 26.6% (n=493) of people with diabetes who developed CKD after recruitment had at
211 least one episode of AKI prior to development of CKD, the corresponding figure in the control group
212 being 9.9% (n=58, difference 16.7%, 95% CI 13.3-19.8). The proportion of people experiencing AKI was
213 significantly higher in the diabetic group compared to the control group for those patients who did not
214 have CKD at recruitment nor develop it later; 31.7% (n=1602) vs 10.8% (n=651) in the control group
215 (difference 20.9%, 95% CI 19.4-22.4).

216

217 **Estimating AKI episode rates in people with and without diabetes**

218 Table 6 shows estimates of AKI episode incidence rates and rate ratios for people with diabetes vs
219 control un-adjusted and adjusted for sex and age at recruitment. Regardless of CKD status, adjusted AKI
220 rates were 4.7 times higher in people with diabetes compared to controls (adjusted rate 179.0 vs 38.4
221 per 1000 person-years, RR=4.7, 95% CI 4.3-5.0). In particular, people with diabetes and no CKD
222 experienced AKI at a rate almost five times higher than people with no diabetes (adjusted rate 121.5 vs
223 24.6 per 1000 person-year, RR=4.9, 95% CI 4.4-5.5), whereas in people with CKD rate of AKI for those in
224 the diabetic groups was twice higher than in the corresponding control (adjusted rate 384.8 vs 180.0 per
225 1000 person-year, RR=2.1, 95% CI 1.9-2.4). Similarly, people with diabetes who develop CKD after
226 recruitment experience episodes of AKI at a rate twice higher than those in the control group (adjusted
227 rate 109.3 vs 47.4 per 1000 person-year, RR=2.3, 95% CI 1.8-3.0). It is noteworthy that the AKI rate in
228 people with diabetes in the absence of CKD was very close to AKI rate prior to development of CKD
229 (121.5 vs 109.0 per 1000 person year).

230 Additional model adjustment for other co-morbidities at baseline only partially reduced the association
231 between diabetes and AKI incidence rates (Table S4 in Supplementary material, RR=3.85, 95%CI 3.44-
232 4.32 in people with no CKD at recruitment or during follow-up, and RR=2.01 95%CI 1.82-2.22 in people
233 with CKD at recruitment or during follow-up time).

234

235 **Sensitivity analysis for the AKI rate analysis**

236 The sensitivity analysis conducted to estimate rates for stage 2 and 3 AKIs show consistent results with
237 the main analysis (Tables S2 in the supplementary material). The results show that people with diabetes
238 and no CKD experience stage 2 and 3 AKIs at a rate that is over five time higher than people in the
239 control group (adjusted mean rate 30.6 vs 5.5 per 1000 person-year, RR=5.5, 95% CI 4.6-6.6) whereas in
240 people with CKD rate of AKI for those in the diabetic groups was twice higher than in the corresponding

241 control group (adjusted mean rate 76.5 vs 38.9 per 1000 person-year, RR=2.1, 95% CI 1.8-2.5). Similarly,
242 analysis of rates of AKIs lasting over 48hrs or AKIs during hospital admission show consistent results with
243 the main analysis (Table S3 and Table S4).

244

245 **Estimating the effect of AKI on eGFR slope over time**

246 Of the 16700 people included in the initial analysis, there were 3250 people with AKI prior to
247 recruitment which were not included in the eGFR analysis. A further 2558 people did not meet the
248 selection criteria of which 1324 had an AKI post recruitment (738 with T2D and 386 with no diabetes).
249 As a result a total of 10892 people with 279391 SCr measures were included in the eGFR longitudinal
250 data analysis. Of these 5665 had T2D and 5227 were from the control group (Figure 1, Tables S6 and S7
251 in the supplementary material). Of the 10892, 2470 people experienced an AKI during follow-up of
252 which 1859 had T2D and 611 had no diabetes. People with no CKD at recruitment had a significant
253 higher decline in eGFR in the period pre-AKI compared to no-AKI regardless of diabetes status, but rate
254 of decline was significantly higher in people with diabetes (Figure 2, Table S6 in the supplementary
255 material: eGFR slope pre-AKI vs no-AKI =-1.14, 95% CI (-1.24 to -1.03) in people with T2D and -0.29,
256 95%CI (-0.45 to -0.11) in controls, slope difference=-0.85, 95%CI (-1.05 to -0.65)). A further decrease in
257 rate was observed in the control group in the period post-AKI compared to pre-AKI in both T2D and
258 control groups, the increase in rate of decline was only marginally significant in people with T2D (eGFR
259 slope post-AKI vs pre-AKI =-0.29, 95% CI (-0.59 to 0.01)), whereas it was significant in the control group
260 (eGFR slope post-AKI vs pre-AKI =-0.55, 95% CI (-1.08 to -0.03)), however the difference between T2D
261 group and control was not significant (slope difference=0.26, 95%CI (-0.34 to 0.86)). Sex was significantly
262 associated with eGFR with males having a higher mean eGFR than females in people with T2D and lower
263 in control. No change in eGFR slope was observed between male and females in any of the subgroups.
264 An increase in age was associated with a reduction in eGFR at baseline regardless of diabetes status, but

265 significant differences in eGFR slope among the different age groups were observed only in people with
266 T2D. Furthermore, people with peripheral vascular disease and hypertension had a significant further
267 decline in eGFR slope regardless of diabetes status.

268 People with CKD at recruitment show a higher rate decline in eGFR in the period pre-AKI compared to
269 no-AKI and this result was significant in the T2D group and marginally significant in the control group,
270 but the difference between the two groups was not significant (Figure 2, Table S7 in the supplementary
271 material: eGFR slope pre-AKI vs no AKI = -0.79, 95% CI (-1.05 to -0.52) in people with T2D and -0.40,
272 95%CI (-0.85 to 0.05) in controls, slope difference = -0.38 (-0.90 to 0.14)). The decline in eGFR rate post
273 AKI compared to pre-AKI did not change in people with T2D diabetes (eGFR slope post AKI vs pre
274 AKI = 0.23, 95% CI (-0.24 to 0.71)), whereas AKI was associated with further eGFR decline post AKI
275 compared to pre AKI period in controls (eGFR slope post AKI vs pre AKI = -0.84, 95% CI (-1.73 to 0.06)),
276 with the post-AKI effect being significantly different between T2D and control groups (slope
277 difference = 1.07, 95%CI (0.06 to 2.08)). There was no significant eGFR difference between males and
278 females in people with CKD at recruitment regardless of diabetes status. An increase in age was
279 associated with a reduction in eGFR at baseline regardless of diabetes status, and older people with
280 diabetes appeared to have a lower eGFR decline than younger ones. None of the cardiovascular diseases
281 were significantly associated with eGFR at baseline or eGFR slope, however their effect was an
282 important one as reflected in the model AIC and therefore they were retained in the model.

283

284 **Discussion**

285 In our study, we have quantified rates of AKI in patients with and without diabetes demonstrating the
286 extent of the risk. Rates of AKI are significantly higher in patients with type 2 diabetes compared to
287 those without with a 4.7 fold increase in AKI rate. In people with diabetes and preserved renal function,
288 rate of AKI is 4.9 fold higher than people without diabetes whereas in people with CKD rate of AKI for

289 those in the diabetic group is 2 fold higher than in non-diabetics. More than 50% of the patients with
290 diabetes who develop AKI will suffer from recurrent events. Rates of CKD are also higher in patients with
291 Type 2 diabetes with 46.3% developing CKD compared to 17.1% in those without diabetes.
292 Fall in eGFR slope before AKI was steeper in people with diabetes compared to those without diabetes.
293 After AKI episodes, loss of eGFR became steeper in people without diabetes, but did not increase in
294 those with diabetes and pre-existing CKD.
295 In comparison to other studies, progressive decline leading to CKD has been well described in people
296 with type 2 diabetes ¹, but AKI in diabetes mellitus have been less investigated ^{6,7,27,28}. Girman et al
297 examined 119 966 patients with diabetes and 1 794 516 patients without diabetes from the General
298 Practice Research Database. AKI incidence was markedly higher in their cohort: 198 per 100,000
299 person-years in patients with Type 2 diabetes compared with 27 per 100,000 patients-years among
300 patients without diabetes (crude hazard ratio 8.0, 95% CI 7.4-8.7) ⁶. They did not utilise a biochemical
301 definition for AKI relying on clinical coding which can lead to significant under ascertainment ²⁹. In
302 addition, a meta-analysis by James et al showed that the hazards ratios for AKI were higher in
303 participants with diabetes compared to those without diabetes at any level of eGFR ³⁰. Once again, the
304 definition for AKI relied on administrative codes in these studies thereby under estimating milder forms
305 of AKI. There are very few studies that have examined AKI and CKD simultaneously and recurrent AKI in
306 this group of patients ³¹.
307 Our results are consistent with existing evidence indicating that diabetes is an independent risk factor
308 for AKI ^{3,6,27}. However, reported AKI rates in people with diabetes vary greatly depending on the
309 population studied (e.g. different specialist settings, age range) and the methods used for AKI
310 identification (e.g. medical history, ICD10 coding or changes in SCr) ¹⁰. Most of the prior studies have
311 reported AKI incidence of new AKI cases within a given time window and therefore estimates relate to
312 number of patients experiencing AKI. The algorithm developed in this study allows quantification of AKI

313 rates based on number of AKI episodes including recurrent AKI. Our findings have important clinical
314 implications. AKI is associated with adverse patient outcomes including increased mortality, future
315 development of CKD and increased length of hospital stays ^{3,32,33}. It therefore places a significant
316 financial burden on healthcare resources ³⁴. In our study over 75% of AKI were Stage 1 reflecting a mild,
317 transient increase in serum creatinine. This may be of clinical significance as there is an increasing
318 evidence showing that even mild, transient (lasting less than 24 hours) AKI is associated with poorer
319 long term outcomes ^{35,36} compared to those who do not have AKI. There are currently no effective
320 treatments for AKI once it is established and so earlier detection and prevention is vital. It is, however,
321 important to note that there may be misclassification of chronic decline in renal function in patients
322 with diabetes accounting for some of the observed increased rates of AKI. We have shown that rates of
323 AKI are higher in patients with diabetes both with and without CKD with more than half developing
324 recurrent episodes. To our knowledge, there has been no previous work looking at eGFR slopes prior to
325 developing AKI. We found that those who develop AKI with diabetes have a greater decline in eGFR
326 slope prior to developing AKI than those who do not. These findings are expected as a declining kidney
327 would be more susceptible to episodes of AKI. However, it is surprising that there is less additional
328 decline in eGFR in those with diabetes compared to those without following an episode of AKI compared
329 to prior to an AKI episode. It remains unclear what the mechanism underlying AKI is in diabetic patients.
330 A predisposing factor in these patients may be generalised or intrarenal atherosclerosis. In addition,
331 patients with diabetes are likely to have glomerular hyperfiltration which is masking structural renal
332 damage thereby rendering them more susceptible to AKI than those without diabetes due to their
333 reduced repair capacity and so are susceptible to fluctuations in serum creatinine. A further suggested
334 mechanism is that tubular growth in response to hyperglycemia promotes inflammation, senescence,
335 and tubulointerstitial fibrosis which enhance the susceptibility of the diabetic kidney to episodes of AKI
336 ³⁷. It also remains unclear whether prevention of AKI in these patients would prevent or delay

337 progression of CKD. However, it would seem sensible that these patients are more closely monitoring
338 during intercurrent illnesses with a greater awareness of avoiding high risk medicines such as non-
339 steroidal anti-inflammatories and aminoglycosides. There is currently a lack of awareness among
340 patients with diabetes of the risk of AKI and so patient education on the importance of hydration may
341 play an important in role. We have also shown that in patients with both hypertension and diabetes,
342 there is an additional decline in eGFR highlighting the importance of blood pressure control in addition
343 to ensuring good glycaemic control in this patient group.

344

345 An important strength of the study is the refinement of KDIGO definition enabling a more sensitive
346 estimation of AKI rates which has allowed us to demonstrate the high risk of AKI in patients with
347 diabetes regardless of CKD status. We developed an algorithm to identify AKI episodes from SCr
348 measures. A number of definitions to detect AKI cases based on changes in SCr have been used
349 previously ¹⁶, and NHS England has implemented an algorithm which applies the KDIGO definition to
350 routinely collected SCr tests to automatically produce AKI alerts to support clinical investigations ¹⁵. This
351 algorithm, defines baseline creatinine levels based on SCr one year prior to the index date, potentially
352 leading to undetected AKI when such measurements are not available. The proposed algorithm utilises
353 SCr values both prior and after the index date. Whilst this may not be useful for AKI detection in clinical
354 practice, it may improve AKI detection for epidemiological purpose when applying to routinely collected
355 datasets allowing for a more sensitive estimation of AKI incidence. Our study shows that at least one
356 third of AKI cases remains undetected when baseline creatinine is only based on tests prior to the index
357 date. Previous epidemiological studies of AKI from routinely collected SCr reported AKI cases in
358 isolation, with episodes being defined using either fixed time periods such as 30 days ¹⁴ or admission and
359 discharge dates for hospitalized patients ³¹. The current study is novel through the development of an
360 algorithm which examines consecutive SCr measures to detect the start and the end of an AKI episode,

361 which can be used to calculate the length of the episode and further assess whether the AKI has
362 resolved quickly or it has progressed to AKD. The grouping of AKI cases into AKI episodes was
363 particularly important to allow an accurate estimate of AKI rates when applied to routinely collected
364 data. Identification of the AKI episode start and end dates was also used in the study to clean the SCr
365 data in order to allow assessment of CKD status and correctly determine the CKD onset date, which
366 represents another strength of the study. Another important strength of the study is the development
367 of a statistical framework for the analysis of the eGFR longitudinal data to evaluate decline in eGFR
368 before and after an AKI event depending on diabetes and CKD status.

369 One of the main limitations of the study relates to the nature of routine healthcare data where blood
370 measurements are infrequent, which makes it difficult to calculate baseline creatinine for assessment of
371 AKI. As a result some of the AKI in the longitudinal data might remain undetected leading to
372 misclassification between AKI and progressive CKD. This variation in the intensity of blood sampling may
373 also lead to ascertainment bias in AKI estimation due to more tests that are being performed in sicker
374 patients. In our study, blood tests were performed on average three times more often in people with
375 diabetes than people in the control group. This may partially explain the high AKI rate in people with
376 diabetes compared to controls. It could however be argued that increased testing was performed in
377 response to clinical indication and similarly lack of testing in those who were deemed well. The
378 possibility that the increased AKI is being driven by the increased testing rather than the other way
379 round is diminished by the analysis of more severe (stage 2 and stage 3) AKIs and AKIs lasting more than
380 48hrs, for which a high AKI rate ratio between people with diabetes compared to controls in the
381 absence of CKD were obtained. In addition, diabetes status confers a substantially increased risk for AKI
382 in individuals with pre-existing CKD, where the testing rate is high regardless of diabetes status. These
383 results demonstrates a profoundly increased clinical burden of acute kidney disease in diabetes patients.
384 Another limitation of the study is the potential of selection bias due to the use of consented data from

385 the GoDARTs cohort, a characteristic of most observational studies using consented data, which may
386 lead to AKI rate estimates that are not generalizable. Furthermore calculation of slopes required a
387 number of creatinine measures over a specified time period and so a significant number of patients
388 were excluded from the analysis. This could introduce selection bias which may have affected our
389 findings. However, it is difficult to eliminate this issue when examining eGFR slopes using observational
390 data.

391 In conclusion, we have quantified the risk of AKI in patients with diabetes and its relationship as both a
392 precursor and a consequence of CKD. The risk of AKI in this population of patients is currently
393 underestimated and associated adverse outcomes following AKI are not well understood. Further work
394 to evaluate the pathogenesis for AKI and the risk factors associated with the increased AKI rate in
395 patients with diabetes such as use of medication is required to allow for development and
396 implementation of interventions which both prevent the occurrence of AKI and reduce decline in eGFR
397 thereby improving patient outcomes.

398

399 **Acknowledgments**

400 The research outlined here was conducted as part of the Biomarker Enterprise to Attack Diabetic Kidney
401 Disease (BEAT-DKD) project, an EU Seventh Framework Programme (FP7) and US consortia as part of the
402 Innovative Medicine Initiative (see <https://www.beat-dkd.eu/>).

403 We acknowledge all consortium partners of the BEAt-DKD project for constructive discussions during
404 project meetings. We acknowledge the support of the Health Informatics Centre, University of Dundee
405 for managing and supplying the anonymised data. We are grateful to all the participants who took part
406 in the GoDARTS study, to the general practitioners, to the Scottish School of Primary Care for their help
407 in recruiting the participants, and to the whole team, which includes interviewers, computer and

408 laboratory technicians, clerical workers, research scientists, volunteers, managers, receptionists and
409 nurses.

410

411 **Disclosure Statement**

412 The authors have nothing to disclose

413

414 **Funding**

415 This project has received funding from the Innovative Medicines Initiative 2 Joint Undertaking under
416 grant agreement No 115974 (BEAt-DKD). This Joint Undertaking receives support from the European
417 Union’s Horizon 2020 research and innovation programme and EFPIA with JDRF. The Wellcome Trust
418 United Kingdom Type 2 Diabetes Case Control Collection (supporting GoDARTS) was funded by the
419 Wellcome Trust (072960/Z/03/Z, 084726/Z/08/Z,084727/Z/08/Z, 085475/Z/08/Z, 085475/B/08/Z)

420

421 **Ethics approval and consent to participate**

422 The GoDARTS study was approved by the Tayside Medical Ethics Committee with informed consent
423 being obtained for all participants (REC reference 053/04). Data provision and linkage was carried by the
424 University of Dundee Health Informatics Centre (HIC, <https://www.dundee.ac.uk/hic>), with analysis of
425 anonymised data performed in an ISO27001 and Scottish Government accredited secure safe haven. HIC
426 Standard Operating Procedures have been reviewed and approved by the NHS East of Scotland Research
427 Ethics Service and consent for this study was obtained from the NHS Fife Caldicott Guardian.

428

429 **Author Contributions**

430 S.H. design the study, conducted the data processing and analysis and wrote and revised the
431 manuscript. M.K.S., R.S.Y.K., S.M., A.S.F.D., and E.R.P., contributed to the interpretation of the data and

432 the revision of the manuscript. S.B. and C.N.A.P. contributed to study design, the interpretation of the
433 data and the writing and revision of the manuscript. S.H and C.N.A.P. are guarantors of this work and, as
434 such, had full access to all the data in the study and take responsibility for the integrity of the data and
435 the accuracy of the data analysis.

436

437

438 **Supplemental Table of Contents**

439 Table S1: Number of AKI cases identified using the NHS England algorithm and the modified algorithm
440 broken down by the different criteria used in the definition of the AKI case.

441 Table S2. Incidence rates of stage 2 and 3 AKI episode and rate ratios in the diabetic and non-diabetic
442 groups depending on the CKD status.

443 Table S3. AKI episode incidence rates and rate ratios for AKIs lasting more than 48hrs in the diabetic and
444 non-diabetic groups depending on the CKD status.

445 Table S4. AKI episode incidence rates and rate ratios for AKIs during a hospital admission in the diabetic
446 and non-diabetic groups depending on the CKD status.

447 Table S5. AKI episode incidence rate ratios adjusted for sex, age and comorbidities at recruitment
448 depending on CKD status.

449 Table S6: Parameter estimates of the longitudinal eGFR data analysis for people with and without T2D
450 and no CKD at recruitment

451 Table S7: Parameter estimates of the longitudinal eGFR data analysis for people with and without T2D
452 and no CKD at recruitment

453 Figure S1: Identifying AKI episodes (red circles) from longitudinal serum creatinine test (a1-d1). The
454 different trajectories of AKI episodes (red) during the course of the disease (a2-d2) ranging from rapid
455 recovery within seven days (a2) to longer recovery more than seven days and/or multiple AKI insults
456 leading to AKD (b2-c2), or irreversible AKI leading to AKD and CKD (d2). Cleaning of the eGFR
457 longitudinal data to ascertain CKD status (a3-d3): first AKI flagged eGFR values are removed (red circles),
458 then median eGFR is calculated based on the remaining eGFR values (black line), which is used to
459 determine the date of CKD onset.

460

461

462

463

464

465

466

467

468

469

470

471 **References**

- 472 1. Alicic RZ, Rooney MT, Tuttle KR: Diabetic kidney disease: Challenges, progress, and possibilities.
 473 *Clin. J. Am. Soc. Nephrol.* 12: 2032–2045, 2017
- 474 2. Kaballo MA, Elsayed ME, Stack AG: Linking acute kidney injury to chronic kidney disease: the
 475 missing links. *J. Nephrol.* 30: 461–475, 2017
- 476 3. Bell S, Dekker FW, Vadiveloo T, Marwick C, Deshmukh H, Donnan PT, Van Diepen M: Risk of
 477 postoperative acute kidney injury in patients undergoing orthopaedic surgery--development and
 478 validation of a risk score and effect of acute kidney injury on survival: observational cohort study.
 479 *BMJ* 351: h5639, 2015
- 480 4. Patschan D, Müller GA: Acute Kidney Injury in Diabetes Mellitus. *Int. J. Nephrol.* 2016: 2016
- 481 5. Chawla LS, Eggers PW, Star RA, Kimmel PL: Acute Kidney Injury and Chronic Kidney Disease as
 482 Interconnected Syndromes. *N. Engl. J. Med.* 371: 58–66, 2014
- 483 6. Girman CJ, Kou TD, Brodovicz K, Alexander CM, O'Neill EA, Engel S, Williams-Herman DE, Katz L:
 484 Risk of acute renal failure in patients with Type 2 diabetes mellitus. *Diabet. Med.* 29: 614–621,
 485 2012
- 486 7. Venot M, Weis L, Clec'h C, Darmon M, Allaouchiche B, Goldgran-Tolédano D, Garrouste-Orgeas
 487 M, Adrie C, Timsit JF, Azoulay E: Acute kidney injury in severe sepsis and septic shock in patients
 488 with and without diabetes mellitus: A multicenter study. *PLoS One* 10: 1–10, 2015
- 489 8. Survey SD, Group M: Scottish Diabetes Survey 2003 Scottish Diabetes [Internet]. Available from:
 490 [https://www.diabetesinscotland.org.uk/wp-content/uploads/2019/12/Diabetes-in-Scotland-](https://www.diabetesinscotland.org.uk/wp-content/uploads/2019/12/Diabetes-in-Scotland-website-Scottish-Diabetes-Survey-2011.pdf)
 491 [website-Scottish-Diabetes-Survey-2011.pdf](https://www.diabetesinscotland.org.uk/wp-content/uploads/2019/12/Diabetes-in-Scotland-website-Scottish-Diabetes-Survey-2011.pdf)
- 492 9. KDIGO: Clinical Practice Guideline for Acute Kidney Injury (AKI). *Kidney Int. Suppl.* 2: 4, 2012
- 493 10. Sawhney S, Fraser SD: Epidemiology of AKI: Utilizing Large Databases to Determine the Burden of
 494 AKI. *Adv. Chronic Kidney Dis.* 24: 194–204, 2017
- 495 11. Bell S, Farran B, McGurnaghan S, McCrimmon RJ, Leese GP, Petrie JR, McKeigue P, Sattar N, Wild
 496 S, McKnight J, Lindsay R, Colhoun HM, Looker H: Risk of acute kidney injury and survival in
 497 patients treated with Metformin: an observational cohort study. *BMC Nephrol.* 18: 1–8, 2017
- 498 12. Connelly PJ, Lonergan M, Soto-Pedre E, Donnelly L, Zhou K, Pearson ER: Acute kidney injury,
 499 plasma lactate concentrations and lactic acidosis in metformin users: A GoDarts study. *Diabetes.*
 500 *Obes. Metab.* [Internet] 2017 Available from: <http://www.ncbi.nlm.nih.gov/pubmed/28432751>
- 501 13. Dreischulte T, Morales DR, Bell S, Guthrie B: Combined use of nonsteroidal anti-inflammatory
 502 drugs with diuretics and/or renin-angiotensin system inhibitors in the community increases the
 503 risk of acute kidney injury. *Kidney Int.* 88: 396–403, 2015
- 504 14. Holmes J, Geen J, Phillips B, Williams JD, Phillips AO: Community acquired acute kidney injury:
 505 Findings from a large population cohort. *Qjm* 110: 741–746, 2017
- 506 15. Sawhney S, Fluck N, Marks A, Prescott G, Simpson W, Tomlinson L, Black C: Acute kidney injury -
 507 How does automated detection perform? *Nephrol. Dial. Transplant.* 30: 1853–1861, 2015
- 508 16. Zeng X, McMahon GM, Brunelli SM, Bates DW, Waikar SS: Incidence, outcomes, and comparisons
 509 across definitions of AKI in hospitalized individuals. *Clin. J. Am. Soc. Nephrol.* 9: 12–20, 2014
- 510 17. Hébert HL, Shepherd B, Milburn K, Veluchamy A, Meng W, Carr F, Donnelly LA, Tavendale R,
 511 Leese G, Colhoun HM, Dow E, Morris AD, Doney AS, Lang CC, Pearson ER, Smith BH, Palmer CNA:
 512 Cohort Profile: Genetics of Diabetes Audit and Research in Tayside Scotland (GoDARTS). *Int. J.*
 513 *Epidemiol.* [Internet] 47: 380–381j, 2018 Available from:
 514 [http://academic.oup.com/ije/article/doi/10.1093/ije/dyx140/4107246/Cohort-Profile-Genetics-](http://academic.oup.com/ije/article/doi/10.1093/ije/dyx140/4107246/Cohort-Profile-Genetics-of-Diabetes-Audit-and)
 515 [of-Diabetes-Audit-and](http://academic.oup.com/ije/article/doi/10.1093/ije/dyx140/4107246/Cohort-Profile-Genetics-of-Diabetes-Audit-and)
- 516 18. SCI-Diabetes [Internet]. 2015 Available from: <https://www.sci-diabetes.scot.nhs.uk>
- 517 19. The Scottish Renal Registry.

- 518 20. Duncan ADS, Hapca S, De Souza N, Morales D, Bell S: Quinine exposure and the risk of acute
519 kidney injury: a population-based observational study of older people. *Age Ageing* [Internet]
520 2020 Available from: <https://doi.org/10.1093/ageing/afaa079>
- 521 21. S. S, A. M, N. F, A. L, G. P, C. B: Intermediate and Long-term Outcomes of Survivors of Acute
522 Kidney Injury Episodes: A Large Population-Based Cohort Study. *Am. J. Kidney Dis.* 69: 18–28,
523 2017
- 524 22. Chawla LS, Bellomo R, Bihorac A, Goldstein SL, Siew ED, Bagshaw SM, Bittleman D, Cruz D, Endre
525 Z, Fitzgerald RL, Forni L, Kane-Gill SL, Hoste E, Koyner J, Liu KD, Macedo E, Mehta R, Murray P,
526 Nadim M, Ostermann M, Palevsky PM, Pannu N, Rosner M, Wald R, Zarbock A, Ronco C, Kellum
527 JA: Acute kidney disease and renal recovery: consensus report of the Acute Disease Quality
528 Initiative (ADQI) 16 Workgroup. *Nat. Rev. Nephrol.* 13: 241–257, 2017
- 529 23. KDIGO, CKD: KDIGO CPG for Evaluation & Management of CKD 2013. *Kidney Int. Suppl.* 3: 4–4,
530 2013
- 531 24. Newcombe RG: INTERVAL ESTIMATION FOR THE DIFFERENCE BETWEEN INDEPENDENT
532 PROPORTIONS: COMPARISON OF ELEVEN METHODS. John Wiley & Sons;
- 533 25. Thomsen JL, Parner ET: Methods for analysing recurrent events in health care data. Examples
534 from admissions in Ebeltoft Health Promotion Project. *Fam. Pract.* 23: 407–413, 2006
- 535 26. Brown H, Prescott R: Applied Mixed Models in Medicine [Internet]. 3rd editio. Chichester, UK:
536 John Wiley & Sons, Ltd; Available from: <http://doi.wiley.com/10.1002/0470023589>
- 537 27. Mehta RH, Grab JD, O’Brien SM, Bridges CR, Gammie JS, Haan CK, Ferguson TB, Peterson ED:
538 Bedside Tool for Predicting the Risk of Postoperative Dialysis in Patients Undergoing Cardiac
539 Surgery. *Circulation* 114: 2208–2216, 2006
- 540 28. Moschopoulou M, Ampatzidou FC, Loutradis C, Boutou A, Koutsogiannidis CP, Drosos GE,
541 Sarafidis PA: Diabetes mellitus does not affect the incidence of acute kidney injury after cardiac
542 surgery; a nested case–control study. *J. Nephrol.* 29: 835–845, 2016
- 543 29. Logan R, Davey P, De Souza N, Baird D, Guthrie B, Bell S: Assessing the accuracy of ICD-10 coding
544 for measuring rates of and mortality from acute kidney injury and the impact of electronic alerts:
545 an observational cohort study. *Clin. Kidney J.* [Internet] 2019 Available from:
546 <https://doi.org/10.1093/ckj/sfz117>
- 547 30. James MT, Grams ME, Woodward M, Elley CR, Green JA, Wheeler DC, de Jong P, Gansevoort RT,
548 Levey AS, Warnock DG, Sarnak MJ: A Meta-analysis of the Association of Estimated GFR,
549 Albuminuria, Diabetes Mellitus, and Hypertension With Acute Kidney Injury. *Am. J. Kidney Dis.*
550 66: 602–612, 2015
- 551 31. Thakar C V., Christianson A, Himmelfarb J, Leonard AC: Acute kidney injury episodes and chronic
552 kidney disease risk in diabetes mellitus. *Clin. J. Am. Soc. Nephrol.* 6: 2567–2572, 2011
- 553 32. Coca SG, Yusuf B, Shlipak MG, Garg AX, Parikh CR: Long-term Risk of Mortality and Other Adverse
554 Outcomes After Acute Kidney Injury: A Systematic Review and Meta-analysis. *Am. J. Kidney Dis.*
555 53: 961–973, 2009
- 556 33. Coca SG, Singanamala S, Parikh CR: Chronic kidney disease after acute kidney injury: a systematic
557 review and meta-analysis. *Kidney Int.* 81: 442–448, 2012
- 558 34. Kerr M, Bedford M, Matthews B, O’Donoghue D: The economic impact of acute kidney injury in
559 England. *Nephrol. Dial. Transplant.* 29: 1362–1368, 2014
- 560 35. Uchino S, Bellomo R, Bagshaw SM, Goldsmith D: Transient azotaemia is associated with a high
561 risk of death in hospitalized patients. *Nephrol. Dial. Transplant.* 25: 1833–1839, 2010
- 562 36. Bucaloiu ID, Kirchner HL, Norfolk ER, Hartle JE, Perkins RM: Increased risk of death and de novo
563 chronic kidney disease following reversible acute kidney injury. *Kidney Int.* 81: 477–485, 2012
- 564 37. Vallon V: Do tubular changes in the diabetic kidney affect the susceptibility to acute kidney
565 injury? *Nephron. Clin. Pract.* 127: 133–138, 2014

Table 1. Definition of AKI cases, AKI episodes and AKI stages

| | |
|--|--|
| Definition of AKI cases using the NHS algorithm (one of the three criteria) (19): | |
| Criterion 1: | Serum creatinine \geq 1.5 times higher than median of all creatinine measures in the 8-365 days prior to index. |
| Criterion 2: | Serum creatinine \geq 1.5 times higher than the lowest creatinine in the 7 days prior to index. |
| Criterion 3: | Serum creatinine $>$ 26 $\mu\text{mol/L}$ higher than the lowest creatinine in the 48 hours prior to index. |
| Definition of AKI cases using the modified algorithm (one of the four criteria): | |
| Criterion 1: | Serum creatinine \geq 1.5 times higher than median of all creatinine measures in the 8-365 days prior to index |
| Criterion 2: | Serum creatinine \geq 1.5 times higher than the lowest creatinine in the 7 days prior to or post index |
| Criterion 3: | Serum creatinine $>$ 26 $\mu\text{mol/L}$ higher than the lowest creatinine in the 2 days prior to or post index |
| Criterion 4: | Serum creatinine \geq 1.5 times higher than median of all creatinine measures in the 8-365 days post index |
| Definition of AKI episode: grouping AKI cases into episodes | |
| Step 1: | Serum creatinine tests measured within 7 days were grouped into episodes of care |
| Step2: | If any value within an episode of care was flagged as AKI then the whole episode was flagged as AKI |
| Step3: | Within each episode of care Serum creatinine values before and after an AKI case that were greater than 1.2 fold increase in baseline were included in the AKI episodes and used to determine the start and the end of the AKI episode |
| Step 4 | AKI episodes occurring within 7 days further linked to assess AKD |
| Step 5: | AKD of length greater than 90 days flagged as potential CKD |
| Classification criteria for AKI stages (19): | |
| Stage 1 | Rise in creatinine $>$ 26 $\mu\text{mol/L}$ within 48 h (2 days) or $1.5 \leq \text{index/baseline} < 2$ |
| Stage 2 | $2 \leq \text{index/baseline} < 3$ |
| Stage 3 | $\text{index/baseline} \geq 3$ |

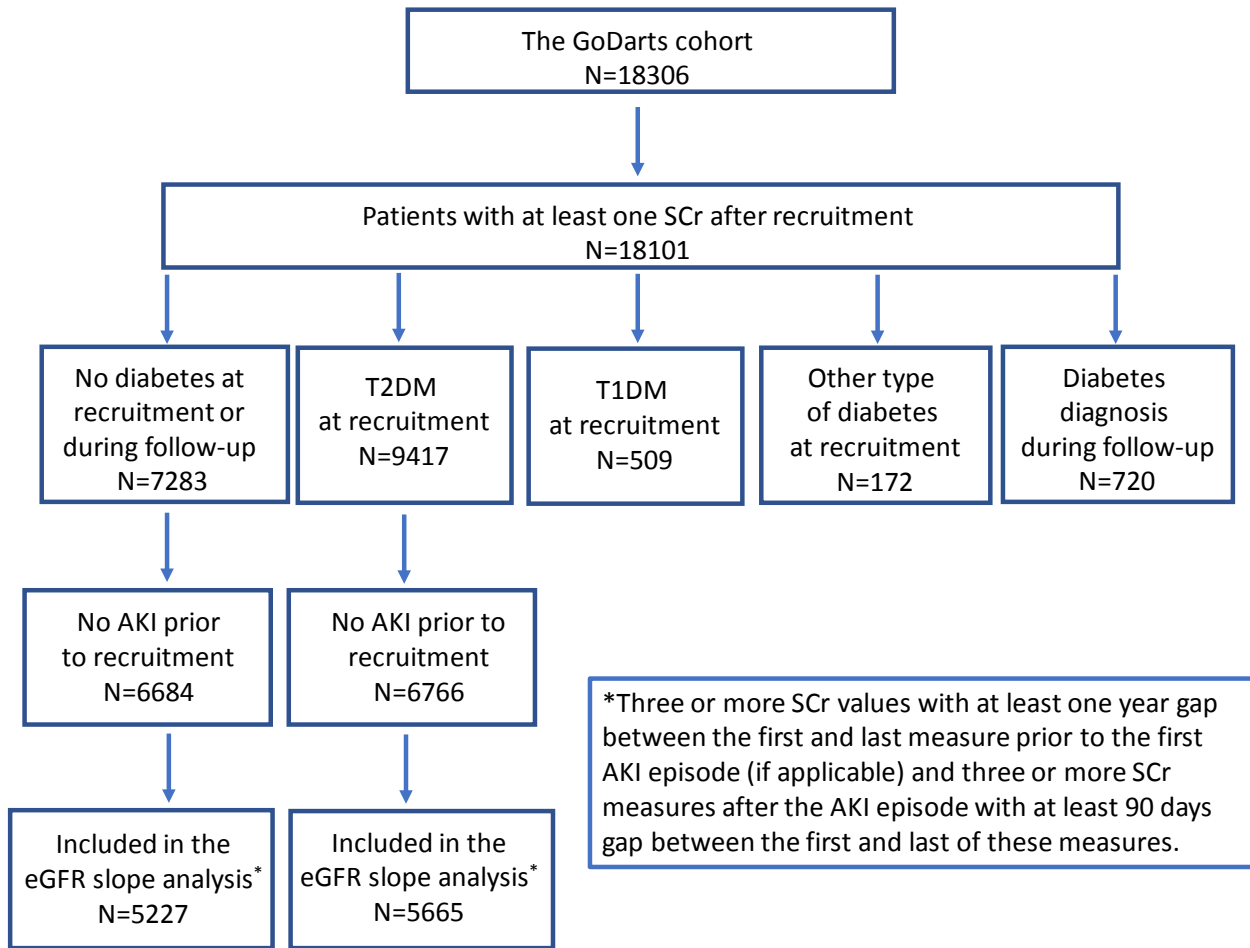
568 Table 2. Establishing CKD date and CKD status from the longitudinal eGFR data.

| | |
|--|---|
| Implementation of the median smoother to the eGFR data to ascertain CKD | |
| Step 1: | eGFR values contained within AKI episodes were removed from the data |
| Step 2: | Calculate the median eGFR for the 91 to 365 days prior to index: <i>Median</i> _{91-365d prior} . |
| Step 3: | Calculate the median eGFR for the 7 days prior to 7 days post index: <i>Median</i> _{7d prior-7d post} . |
| Step 4: | Calculate the median eGFR for the 91 to 365 days post index: <i>Median</i> _{91-365d post} . |
| Step 5: | Define <i>Median</i> _{eGFR} as the median of the three medians defined in steps 2-4 |
| Step 6: | CKD date establish when at least two of the medians in steps 2-4 are available and less than 60 ml/min per 1.73m ² |
| Definition of CKD status | |
| No CKD | At recruitment or during follow-up. |
| Pre-CKD | The period from recruitment until development of CKD, for those people that developed CKD later. |
| Post-CKD | The period after recruitment, for those that had CKD at recruitment, or post CKD, for those that developed the condition later, until end of follow-up. |

569
570
571
572
573
574
575
576
577
578
579
580
581
582
583

584 Figure 1: Flow chart of patient selection in the current study

585



586

587

588

589

590

591

592

593

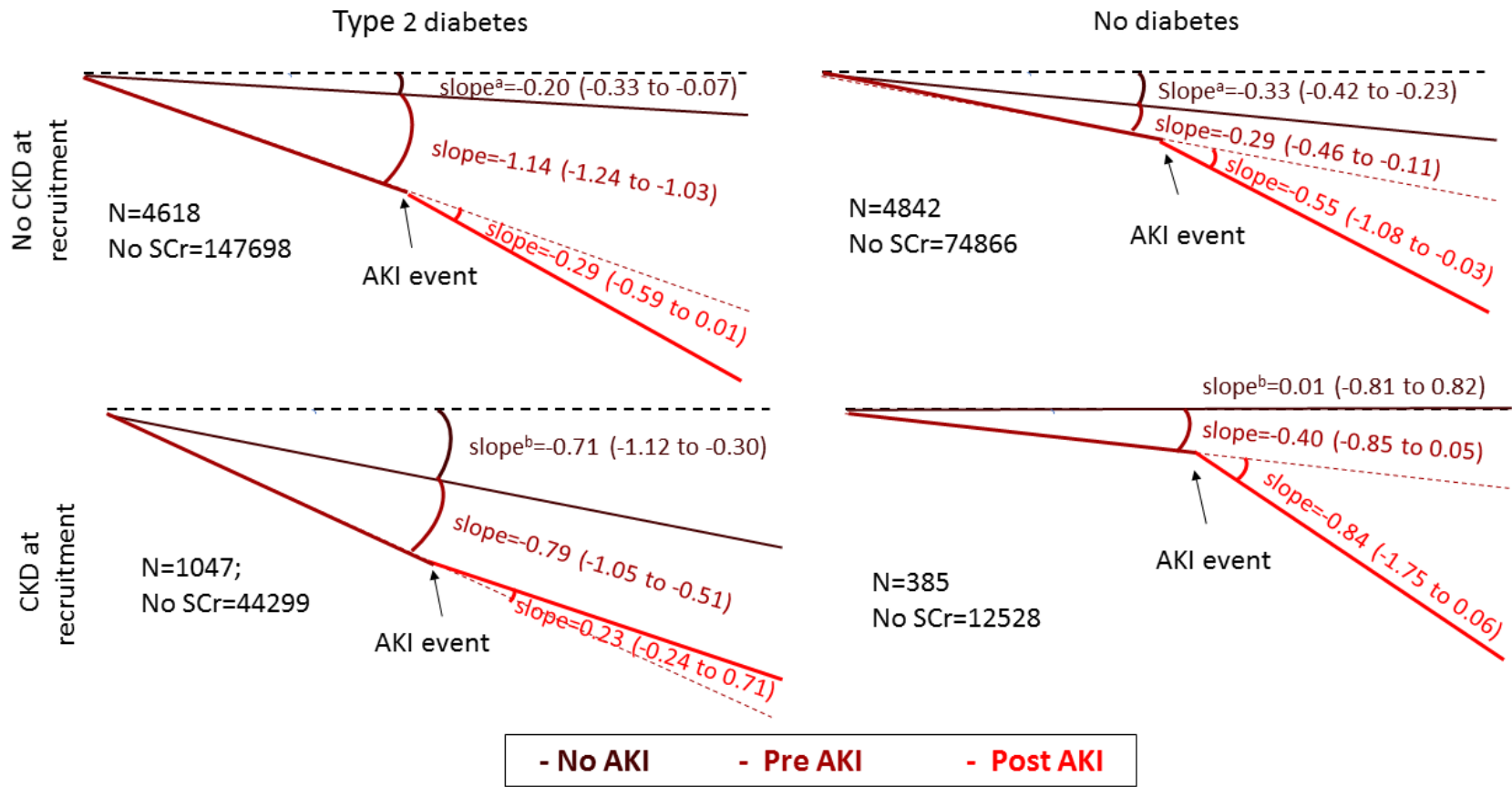
594

595

596

597

598 Figure 2: Visual representation of the eGFR slope estimates in people without AKI (No AKI), prior to the AKI (Pre AKI) and after the AKI event (Post AKI) depending on diabetes status and CKD status at recruitment (°Reference group includes: No AKI during follow-up, female, 49 and
 599 below, no cardiovascular disease; °Reference group includes: No AKI during follow-up, female, 50 to 64, no cardiovascular disease)
 600



601

602

603

| | All patients (N=16700) | T2DM (N=9417) | Control (N=7283) |
|---|---------------------------|------------------|---------------------|
| Sex: Female N (%) | 7888 (47.2) | 4146 (44.0) | 3742 (51.4%) |
| Age at recruitment: mean (SD) | 64.3 (12.5) | 66.9 (11.3) | 60.8 (13.3) |
| eGFR at recruitment: mean (SD) ^a | 79.9 (19.7) | 76.6 (21.0) | 84.3 (16.9) |
| CKD at recruitment: N(%) ^b | 3168(18.9) | 2503 (26.6) | 665 (9.1) |
| Cardiovascular disease at recruitment | | | |
| Coronary Artery Disease (CAD): N (%) | 3271 (19.6) | 2489 (26.4) | 782 (10.7) |
| Congestive Heart Failure (CHF): N (%) | 670 (4.0) | 587 (6.2) | 83 (1.1) |
| Peripheral Vascular Disease (PVD): N (%) | 636 (3.8) | 540 (5.7) | 95 (1.3) |
| Cerebrovascular Disease (CD): N (%) | 786 (4.7) | 644 (6.8) | 142 (1.9) |
| Hypertension: N (%) | 9863 (59.1) | 7271 (77.2) | 2592 (35.6) |

^aeGFR at recruitment was missing for 145 people

^b 2442 additional participants developed CKD during follow-up

604

605

Table 3. Baseline characterises of the cohort broken down by diabetes status

| | All patients (N=16700) | Type 2 diabetes (N=9417) | Control (N=7283) |
|--|---------------------------|--------------------------------|---------------------|
| Number of SCr tests | 512615 | 387657 | 124958 |
| Number of SCr tests per patient: median (IQR) | 22 (10-39.5) | 31 (19-51) | 11 (4-21) |
| Number of SCr tests flagged as AKI | | | |
| Old algorithm (retrospective tests) | 28306 | 24257 | 4049 |
| Modified algorithm (retrospective and prospective tests) | 40567 | 34469 | 6098 |
| Number of AKI episodes | 13928 | 11647 | 2281 |
| Number of SCr tests within AKI episodes | 65316 | 55401 | 9915 |
| Number of patients with AKI during follow-up | 5837 | 4580 (48.6) | 1257 (17.2) |
| Number of episodes per person: median (IQR) | 2 (1-3) | 2 (1-3) | 1 (1-2) |
| Length of AKI episode: median (IQR) | 3 (1-7) | 3 (1-7) | 3 (1-6) |
| AKI episode ≤ 2days | 7544 (54.2) | 6237 (53.6) | 1307 (57.3) |
| AKI episode > 2days and ≤ 7days | 3697 (26.5) | 3114 (26.7) | 583 (25.6) |
| AKI episode > 7days | 2687 (19.3) | 2296 (19.7) | 392 (17.2) |
| AKI stages | | | |
| Stage 1 | 10633 (76.3) | 8895 (76.4) | 1738 (76.2) |
| Stage2 | 2285 (16.4) | 1901 (16.3) | 387 (16.8) |
| Stage 3 | 1010 (7.3) | 851 (7.3) | 159 (7.0) |

Table 4. Descriptive statistics showing number of SCr tests from recruitment, number of SCr test flagged by AKI using the NHS England algorithm vs the modified algorithm, number of AKI episodes and number of patients experiencing AKI during the follow-up time as well as characteristics of the AKI episodes in terms of length and severity in the diabetic and control groups.

| Patients' groups | Sex Female number (%) | Age at recruitment | Follow-up time (years) Mean (SD) | Number of SCr tests per patient per year: median (IQR) | AKI patients N (%) | Number of AKI episodes |
|---------------------------------|-----------------------------|-------------------------|--|---|-----------------------|---------------------------|
| All patients (N=16700) | 7888 (47.2) | 64.3 (12.5) | 8.8 (3.2)* | 2.6 (1.2-5.2) | 5837(35.0) | 13928 |
| Control (N=7282) | 3742 (51.4) | 60.8 (13.3) | 9.6 (2.4) | 1.1 (0.4-2.3) | 1257 (17.3) | 2281 |
| Type 2 diabetes (N=9417) | 4146 (44.0) | 66.9 (11.3) | 8.2 (3.5) | 3.8 (2.4-7.4) | 4580 (48.6) | 11647 |
| No CKD (N=11090) | 5089 (45.9) | 59.9 (11.8) | 9.2 (2.9)* | 1.8 (0.8-3.2) | 2263 (20.4) | 3952 |
| Control (N=6032) | 3135 (52.0) | 57.9 (12.1) | 9.8 (2.3) | 0.9 (0.4-1.7) | 651(10.8) | 951 |
| Type 2 diabetes (N=5058) | 1954 (38.6) | 62.4 (11.0) | 8.4 (3.4) | 2.9 (2.0-4.7) | 1602 (31.7) | 3001 |
| CKD (N=5610) | 2799 (49.9) | 72.8 (8.9) | 8.1 (3.4)* | 5.1 (3.0-9.4) | 3584 (63.9) | 9976 |
| Control (N=1251) | 607 (48.5) | 75.3 (8.1) | 8.7 (3.0) | 3.3 (2.0-6.4) | 606 (48.4) | 1330 |
| Type 2 diabetes (N=4359) | 2192 (50.3) | 72.1 (9.0) | 8.0 (3.5) | 5.7 (3.4-10.3) | 2978 (68.3) | 8646 |
| Prior to CKD diagnosis (N=2442) | 1114 (45.6) | 69.2 (8.9) | 4.42 (3.1) [†] | 2.9 (1.8-4.6) | 571 (23.4) | 942 |
| Control (N=587) | 273 (46.5) | 72.7 (8.2) | 4.7 (2.9) | 1.8 (1.1-3.3) | 58 (9.9) | 120 |
| Type 2 diabetes (N=1855) | 841 (45.3) | 68.2 (8.9) | 4.3 (3.1) | 3.2 (2.2-5.0) | 493 (26.6) | 822 |
| Post CKD diagnosis (N=5610) | 2799 (49.9) | 74.9 (8.3) [§] | 6.2 (3.5) [‡] | 5.7 (3.2-11.1) | 3352 (59.8) | 9034 |
| Control (N=1251) | 607 (48.5) | 77.6 (7.7) | 6.5 (3.5) | 4.0 (2.3-7.5) | 569 (45.5) | 1210 |
| Type 2 diabetes (N=4359) | 2192 (50.3) | 74.1 (8.3) | 6.1 (3.5) | 6.3 (3.6-12.0) | 2883 (66.1) | 7824 |

*from recruitment until end of follow-up (RRT/death/out with HB/May 2017 whichever happened first).

[†]from recruitment until development of CKD.

[‡]from development of CKD/recruitment, whichever happened last, until end of follow-up.

[§]Age at recruitment or development of CKD, whichever happened last.

Table 5. Descriptive statistics showing sex, age, follow-up time and number of SCr tests as well as number of patients experiencing AKI and number of AKI episodes in the diabetic vs control groups depending on CKD status.

| Patients' groups | AKI episodes per 1000 person-years | | | |
|---------------------------------|------------------------------------|--------------------|--------------------------|---------------------|
| | Un-adjusted | | Adjusted for age and sex | |
| | Mean rate (SE) | Rate ratio (95%CI) | Mean rate (SE) | Rate ratio (95% CI) |
| All patients (N=16700) | 131.6 (126.8-136.6) | - | 114.8 (110.5-119.5) | - |
| Control (N=7282) | 38.2 (36.0-40.5) | 1.0 | 38.4 (36.2-40.8) | 1.0 |
| Type 2 diabetes (N=9417) | 204.8 (196.4-213.6) | 5.4 (5.0-5.8) | 179.0 (171.5-186.9) | 4.7 (4.3-5.0) |
| No CKD (N=11090) | 54.6 (51.4-58.0) | - | 66.3 (61.1-72.1) | - |
| Control (N=6032) | 18.0 (16.6-19.6) | 1.0 | 24.6 (22.3-27.2) | 1.0 |
| Type 2 diabetes (N=5058) | 101.1 (93.9-108.8) | 5.6 (5.0-6.3) | 121.5 (111.0-133.0) | 4.9 (4.4-5.5) |
| CKD (N=5610) | 276.0 (265.1-187.3) | - | 267.0 (252.1-282.8) | - |
| Control (N=1251) | 148.5 (135.8-162.3) | 1.0 | 130.1 (117.7-143.8) | 1.0 |
| Type 2 diabetes (N=4359) | 312.6 (299.2-326.6) | 2.1 (1.9-2.3) | 299.3 (282.4-317.2) | 2.3 (2.1-2.5) |
| Prior to CKD diagnosis (N=2442) | 93.8 (85.4-108.0) | - | 92.9(81.0-106.1) | - |
| Control (N=587) | 45.8 (36.7-57.2) | 1.0 | 47.4 (37.2-60.5) | 1.0 |
| Type 2 diabetes (N=1855) | 109.9 (99.3-121.6) | 2.4 (1.9-3.1) | 109.3 (94.8-126.1) | 2.3 (1.8-3.0) |
| Post CKD diagnosis (N=5610) | 337.2 (323.3-351.7) | - | 350.8 (321.8-382.5) | - |
| Control (N=1251) | 187.3 (170.5-205.8) | 1.0 | 180.0 (159.1-203.8) | 1.0 |
| Type 2 diabetes (N=4359) | 379.2 (362.1-397.1) | 2.0 (1.8-2.2) | 384.8 (353.1-419.3) | 2.1 (1.9-2.4) |

Table 6. AKI episode rates and rate ratios in the diabetic and non-diabetic groups depending on the CKD status

