

Fasting ketonuria and risk of incident non-alcoholic fatty liver disease with and without liver fibrosis in non-diabetic adults

Yejin Kim, MHS¹, Yoosoo Chang, MD, PhD^{1,2,3}, Min-Jung Kwon, MD, PhD^{1,4}, Yun Soo Hong, MD, MHS⁵, Mi Kyung Kim, PhD⁶, Won Sohn, MD, PhD⁷, Yong Kyun Cho, MD,⁷ Hocheol Shin, MD, PhD^{1,8}, Sarah H. Wild, MB, BChir, PhD⁹; Christopher D Byrne, MB, BCh, PhD^{10,11} Seungho Ryu, MD, PhD^{1,2,3}

¹Center for Cohort Studies, Total Healthcare Center, Kangbuk Samsung Hospital, Sungkyunkwan University School of Medicine, Seoul, Republic of Korea

²Department of Occupational and Environmental Medicine, Kangbuk Samsung Hospital, Sungkyunkwan University School of Medicine, Seoul, Republic of Korea

³Department of Clinical Research Design & Evaluation, SAIHST, Sungkyunkwan University, Seoul, Republic of Korea

⁴Department of Laboratory Medicine, Kangbuk Samsung Hospital, Sungkyunkwan University School of Medicine, Seoul, Republic of Korea

⁵ Department of Epidemiology and Welch Center for Prevention, Epidemiology, and Clinical Research, Johns Hopkins University Bloomberg School of Public Health, Baltimore, MD, USA.

⁶ Department of Preventive Medicine, College of Medicine, Hanyang University.

⁷ Division of Gastroenterology and Hepatology, Department of Internal Medicine, Kangbuk Samsung Hospital, Sungkyunkwan University School of Medicine, Seoul, Republic of Korea

⁸ Department of Family Medicine, Kangbuk Samsung Hospital, Sungkyunkwan University School of Medicine, Seoul, Republic of Korea

⁹ Usher Institute of Population Health Sciences and informatics, University of Edinburgh, Edinburgh, U.K.

¹⁰ Nutrition and Metabolism, Faculty of Medicine, University of Southampton, Southampton, U.K.

¹¹ National Institute for Health Research Southampton Biomedical Research Centre, University Hospital Southampton, Southampton, U.K.

Address for correspondence: Seungho Ryu, MD, PhD, Kangbuk Samsung Hospital, Samsung Main Building B2, 250, Taepyung-ro 2ga, Jung-gu, Seoul, South Korea 04514

E-mail: sh703.yoo@gmail.com. Telephone: 82-2-2001-5137. Fax: 82-2-757-0436.

Co-corresponding author: Yoosoo Chang, MD, PhD, Kangbuk Samsung Hospital, Samsung Main Building B2, 250, Taepyung-ro 2ga, Jung-gu, Seoul, South Korea 04514

E-mail: yoosoo.chang@gmail.com. Telephone: 82-2-2001-5139. Fax: 82-2-757-0436.

Word count: Abstract, 245; Manuscript, 2,996 (Text only)

Number of figures and tables: 1 Figure, 3 Tables

Guarantor of the article: Seungho Ryu, MD, PhD and Yoosoo Chang, MD, PhD

Financial support statement: None to declare.

Conflict of interest statement: The authors have no conflicts of interest to disclose.

Author Contributions:

Yejin Kim: drafting and critical revision of the manuscript

Yoosoo Chang: study concept and design, acquisition of data, interpretation of data, and drafting and critical revision of the manuscript

Min-Jung Kwon: acquisition of data, interpretation of data, and critical revision of the manuscript

Yun Soo Hong: analysis and interpretation of data, and critical revision of the manuscript

Mi Kyung Kim: interpretation of data, and critical revision of the manuscript

Won Sohn: acquisition of data, interpretation of data, and critical revision of the manuscript

Yong Kyun Cho: technical, or material support, and study supervision

Hocheol Shin : technical, or material support, and study supervision

Sarah H. Wild : interpretation of data, and critical revision of the manuscript

Christopher D Byrne: interpretation of data, and critical revision of the manuscript

Seungho Ryu: study concept and design, acquisition of data, analysis and interpretation of data and critical revision of the manuscript

Abbreviations: ALT, alanine transaminase; AST, aspartate aminotransferase; BMI, body mass index; BP, blood pressure; CI, confidence interval; CVD, cardiovascular disease; FIB-4, Fibrosis-4 Index; GGT, gamma-glutamyltransferase; HOMA-IR, homeostasis model assessment of insulin resistance; HR, hazard ratio; hsCRP, high-sensitivity C-reactive protein; LCD, low-carbohydrate diet; NAFLD, nonalcoholic fatty liver disease; NFS, NAFLD fibrosis score;

STUDY HIGHLIGHTS

1) WHAT IS KNOWN

- Ketone bodies are produced by the liver in response to prolonged fasting, carbohydrate-restricted diet, or intense exercise.
- Spontaneous hyperketonemia has been associated with improved metabolic and inflammatory markers.
- The effects of hyperketonemia on the risk of non-alcoholic fatty liver disease (NAFLD) are not known.

2) WHAT IS NEW HERE

- Fasting ketonuria is associated with a reduced risk of incident NAFLD.
- A decreased risk of worsening fibrosis score was also observed in individuals with fasting ketonuria.
- The effects of ketonuria were stronger in non-obese individuals than in obese individuals.
- The role of increased ketosis in the prevention of NAFLD requires further exploration.

ABSTRACT

Objectives

Dietary carbohydrate restriction or ketogenic diets are known to be beneficial in preventing liver fat accumulation. However, the effect of ketonemia on the risk of non-alcoholic fatty liver disease (NAFLD) in non-diabetic population is largely unknown. We investigated the association between fasting ketonuria and risk of incident NAFLD in healthy adults.

Methods

A cohort of 153,076 nondiabetic Koreans with no hepatic steatosis and low probability of fibrosis at baseline was followed-up for a median of 4.1 years. The outcome was incident hepatic steatosis with or without liver fibrosis, and it was assessed by liver ultrasound and noninvasive fibrosis indices, including fibrosis-4 (FIB-4) and the NAFLD fibrosis score (NFS). Parametric proportional hazard models were used to estimate hazard ratios (HRs) for outcome according to ketonuria status.

Results

Within 677,702.1 person-years of follow-up, 31,079 subjects developed hepatic steatosis. Compared to no ketonuria (reference), fasting ketonuria was significantly associated with a decreased risk of incident hepatic steatosis, with multivariable-adjusted HRs (95% CI) of 0.81 (0.78-0.84). The corresponding HRs for incident hepatic steatosis with intermediate-to-high NFS were 0.79 (0.69-0.90). Similar associations were observed replacing NFS with FIB-4. Additionally, the presence of persistent ketonuria at both baseline and subsequent visit was associated with greatest decrease in the aHR for incident NAFLD.

Conclusions

Ketonuria was associated with a reduced risk of developing incident hepatic steatosis with and without intermediate-to-high probability of advanced fibrosis in a large cohort of nondiabetic healthy individuals. The role of hyperketonemia in the prevention of NAFLD

27 requires further exploration.

28

29 **Keywords:** Non-alcoholic fatty liver disease; Hyperketonemia; Ketonuria; Liver fibrosis;

30 Cohort study.

31

32

INTRODUCTION

33

34 Non-alcoholic fatty liver disease (NAFLD) is one of the commonest liver diseases
35 and represents a spectrum extending from simple steatosis to non-alcoholic steatohepatitis
36 (NASH) with or without fibrosis (1, 2). Besides its potential of liver-related complications (1),
37 NAFLD is considered a multisystem disease that is positively associated with cardiovascular
38 disease (CVD) risk factors, CVD mortality and all-cause mortality (3, 4). The first-line
39 management of NAFLD management therefore consists of diet and lifestyle modifications,
40 which are effective in ameliorating the early stages of liver disease and improving the
41 associated cardio-metabolic risk factors (5).

42 Ketone bodies such as acetoacetate, beta-hydroxybutyrate, and acetone, are derived
43 from hepatic beta-oxidation of fatty acids and are used as an alternative energy source under
44 low glucose availability. Mild and controlled production of ketone bodies induced by
45 prolonged fasting or very low carbohydrate intake, known as nutritional ketosis, is
46 distinguishable from pathological ketosis observed in patients with uncontrolled diabetes with
47 hyperglycemia and insulin deficiency (6). In nondiabetic individuals, ketone body levels may
48 increase to >1 mM during periods of extreme fasting, or when on a ketogenic diet (7-9). Non-
49 pathologic or diet-induced hyperketonemia has been associated with improved metabolic and
50 inflammatory markers, including lipids, glycated hemoglobin (HbA1c), high-sensitivity C-
51 reactive protein (hsCRP), and fasting glucose (8, 10-12).

52 Several clinical studies have suggested a benefit of nutritional ketosis in NAFLD. In
53 a small pilot study of five obese patients with biopsy-proven fatty liver, significant weight
54 loss and histologic improvement were achieved after six months of a low-carbohydrate (<20
55 g/d) ketogenic diet (10). Another non-randomized trial reported that one year of intervention
56 through inducing nutritional ketosis improved the surrogates of both NAFLD and advanced
57 fibrosis in T2DM patients (13). However, alongside the limited sample size and follow-up
58 duration, most studies to date have only examined the effects of diet-induced ketosis on

59 NAFLD in patients already presenting with NAFLD at baseline. Until now, the influence of
60 ketonemia on NAFLD development has not been elucidated.

61 The present study aimed to examine the association between fasting ketonuria and
62 hepatic steatosis with or without an intermediate-to-high probability of advanced liver fibrosis,
63 in a large cohort of Korean nondiabetic men and women.

64

65

METHODS

Study participants

67 The present cohort study included participants who underwent a comprehensive
68 health examination between January 2011 and December 2017 and had at least one follow-up
69 visit before December 31, 2019 (n = 336,594). After applying exclusion criteria, the final
70 sample included 153,076 participants. (**Figure 1** and further details in Supplementary
71 materials).

72

Measurement

74 Standardized, self-administered questionnaires including a validated food frequency
75 questionnaire (FFQ) (14), physical measurements, abdominal ultrasonography, and serum
76 biochemical measurements were collected at each visit as part of the basic health check-up
77 program (further details in Supplementary materials). Obesity was defined as body mass
78 index (BMI) ≥ 25 kg/m², the proposed cutoff for diagnosis of obesity in Asians (15). Urinary
79 ketones levels were measured semi-quantitatively by urine dipsticks (URiSCAN urine test
80 strips; YD Diagnostics, Yongin-si, Republic of Korea), and were categorized as absent, trace
81 (50 mg/L), 1+ (100 mg/L), 2+ (500 mg/L), and 3+ (1000 mg/L). Ketonuria status was
82 categorized as 0 (absent or trace), or 1 (presence, $\geq 1+$) (8).

83

Diagnosis of hepatic steatosis and its severity

85 Ultrasonographic diagnosis of fatty liver was made based on an abdominal ultrasound
86 performed by an experienced radiologist using standard criteria, including a diffuse increase
87 in fine echoes in the liver parenchyma in comparison with the kidney or spleen, deep beam
88 attenuation, and bright vessel walls (16). NAFLD was defined as the presence of fatty liver in
89 the absence of excessive alcohol use (<20 and <30 g/day for women and men, respectively)
90 or any other identifiable cause (17). To assess the NAFLD severity, two noninvasive fibrosis
91 indices, NFS and FIB-4, were used (18, 19) (further details in Supplementary Materials).

92

93 *Statistical analysis*

94 Descriptive statistics were used to summarize participant characteristics according to
95 ketonuria status (0, ≥ 1). The primary outcomes were the development of incident hepatic
96 steatosis and hepatic steatosis with an intermediate-to-high probability of advanced fibrosis,
97 which were treated as separate endpoints in each model. Person-years of follow-up accrued
98 from baseline until either the occurrence of primary endpoint, or the final examination
99 conducted prior to December 31, 2019, whichever came first. Incidence rates were calculated
100 as the number of incident cases divided by person-years of follow-up.

101 Parametric proportional hazard models were used to estimate the adjusted hazard ratios
102 (HRs) and the 95% CIs. Model 1 was adjusted for age, center (Seoul or Suwon), year of
103 screening, smoking status (never, past, current, or unknown), alcohol intake (0, <10, ≥ 10
104 g/day, or unknown), physical activity (inactive, minimally active, health enhancing physical
105 activity, or unknown), total energy intake, education level (< community college graduate, \geq
106 community college graduate, or unknown), history of diabetes (only for FIB4 as diabetes is a
107 component of the NFS), history of hypertension, and history of CVD. Previous studies
108 suggest that BMI changes related to ketogenic intervention can be responsible for the health
109 benefits of ketosis, while obesity can be associated with increased insulin levels, which
110 inhibits ketosis (20-22). Thus, we presented a separate model for further adjustment for BMI,

111 in addition to potential confounders (Model 2). For analysis of NAFLD severity, the BMI
112 adjustment was only applied to hepatic steatosis with intermediate-to-high FIB-4 scores since
113 BMI is a component of the NFS. The proportional hazards assumption was assessed via
114 estimated log (-log) survival curves, and no violation of the assumption was found.

115 Predefined subgroup analyses were performed (further details in Supplementary
116 materials); Statistical interactions between ketonuria status and subgroup characteristics were
117 assessed using the likelihood ratio test comparing models with and without the multiplicative
118 interaction terms. All statistical analyses were performed using STATA version 16.0
119 (StataCorp LP, College Station, TX, USA), and p-values < 0.05 were considered statistically
120 significant.

121 RESULTS

122 At baseline (**Table 1**), ketonuria status was positively associated with physical
123 activity, education level, HDL-C, and was inversely associated with male sex, alcohol intake,
124 current smoking, hypertension, history of CVD, obesity, BP, glucose, LDL-C, triglycerides,
125 GGT, and HOMA-IR. Ketonuria status was also associated with a lower level of total energy
126 intake and carbohydrate proportion and a slightly higher proportion of fat intake compared
127 with non-ketonuria status.

128 **Table 2** shows the risk of incident hepatic steatosis and hepatic steatosis with
129 intermediate-to-high probability of advanced fibrosis according to ketonuria status. During
130 follow-up, 31,079 subjects developed hepatic steatosis (incidence rate, 45.9 per 1000 person-
131 years). Median follow-up period was 4.4 years (interquartile range, 2.2-6.3 years, maximum
132 8.9 years) and the median number of visits per participant was 4 (interquartile range, 3-5).
133 Overall, ketonuria was significantly associated with decreased risk of incident hepatic
134 steatosis and hepatic steatosis plus intermediate/high fibrosis score. After adjusting for age,
135 sex, center, year of screening, alcohol consumption, smoking, physical activity, total energy
136 intake, education level, history of diabetes, history of hypertension, and history of CVD

137 (Model 1), the HR (95% CI) for incident hepatic steatosis comparing ketonuria group to the
138 reference was 0.81 (0.78-0.84). The associations remained significant after further adjustment
139 for BMI (Model 2; HR, 0.89; 95% CI, 0.86-0.92), as well as when ketonuria and potential
140 confounders were treated as time-varying covariates. The association between ketonuria and
141 incident hepatic steatosis was stronger in non-obese individuals than those with obesity
142 defined by BMI ≥ 25 kg/m² (*P for interaction*=0.001) (Supplementary Table 1).

143 The multivariable-adjusted HR (95% CI) for hepatic steatosis with intermediate-to-
144 high NFS scores comparing ketonuria to no ketonuria group was 0.79 (0.69-0.90) (Model 1,
145 Table 2). Similarly, in the analysis based on FIB-4 scores, the HR was 0.69 (0.58-0.83).
146 These associations were slightly attenuated after further adjustment for BMI, but remained
147 significant (Model 2; HR, 0.76; 95% CI, 0.64-0.90; *P*=0.002). In the time-dependent model,
148 similar associations were observed (HR, 0.75; 95% CI, 0.63-0.90).

149 When we compared ketonuria status between first and second visits, 91.7 % of
150 participants with no ketonuria at baseline consistently showed no ketonuria at the subsequent
151 visit. Conversely, only 14.5% of those with ketonuria at baseline had ketonuria at the
152 subsequent visit. **Table 3** presents the association between ketonuria change status from
153 baseline to 2nd visit and the development of hepatic steatosis (further baseline characteristics
154 in Supplementary Table 2 and anthropometric details in Supplementary table 3). The
155 multivariable-adjusted HRs (95% CI) for incident hepatic steatosis comparing ‘ketonuria
156 regressed’, ‘ketonuria developed’, and ‘persistent ketonuria’ groups to the reference group
157 were 0.83 (0.79-0.88), 0.79 (0.74-0.84) and 0.64 (0.55-0.74), respectively (Model 1). The
158 association remained significant after BMI adjustment (Model 2) and in the time-dependent
159 model (Table 3). Ketonuria change status was also associated with the risk of hepatic steatosis
160 + intermediate/high fibrosis scores. In the analysis using FIB-4 (Table 3), the same trend was
161 observed, but the association was attenuated and no longer significant after adjustment for
162 BMI as well as after adjustment for the time-varying covariates in the time-dependent model.

DISCUSSION

163

164 Our study showed for the first time that ketonuria was associated with a reduced risk
165 of incident hepatic steatosis, both with/without increased probability of advanced fibrosis, in
166 a large cohort of nondiabetic healthy Korean men and women. None of the 153,076
167 participants had T2DM or NAFLD at baseline, and the significant associations persisted after
168 adjusting for potential confounders including BMI and time-dependent covariates.

169 Mildly or moderately elevated ketone bodies in the serum and urine in response to
170 fasting, ketogenic diets, and prolonged exercise constitute the non-pathological form of
171 ketosis (9). Although blood tests provide better diagnostic accuracy for estimating circulating
172 keto-acid levels compared to urine tests (9), urinary keto-acid levels correlate well with serum
173 concentrations measured quantitatively and therefore are considered useful surrogate
174 biomarkers for hepatic ketone body production (23). While the clinical significance of mild
175 ketonuria has not been established, a cross-sectional study demonstrated that fasting ketonuria
176 was associated with a decreased prevalence of obesity, central obesity, and metabolic
177 syndrome (compared to no ketonuria) (24). Another cohort study also showed that fasting
178 ketonuria was associated with reduced risk of incident diabetes independent of other
179 metabolic factors (8). However, no studies have to date investigated the role of ketonuria in
180 NAFLD development in non-diabetic populations. To the best of our knowledge, our study is
181 the first study on the potential benefit of ketonuria in reducing NAFLD risk and its severity in
182 non-diabetic individuals.

183 While the benefits of ketogenic or severe carbohydrate-restricting diets on hepatic fat
184 content have been well-characterized in several clinical trials with fairly consistent results (20,
185 21, 25, 26), limited evidence exists regarding its effects on the severity of NAFLD with
186 conflicting results. In a meta-analysis of 10 clinical trials regarding the effects of low-
187 carbohydrate diets (LCD) on liver function, LCDs reduced intrahepatic fat content but did not
188 improve liver enzymes (27), whereas a small interventional study on T2DM patients

189 demonstrated that liver fibrosis, as assessed by NFS, and liver enzyme levels significantly
190 improved after 1 year of ketosis-inducing dietary interventions (13). In our study,
191 carbohydrate intake was slightly lower, with fat intake being slightly higher in the ketonuria
192 group than in the non-ketonuria group. However, information on habitual diet was collected
193 via a 103-item self-administered FFQ reflective of usual food intake over the past year which
194 was designed for use in South Korea (14). Thus, the FFQ may not reflect the most recent diet
195 characteristics. The South Korean diet is also typically consumed as pre-seasoned dishes that
196 includes various kinds of seasonings including oils. However, seasonings and oils are not
197 included in this FFQ, and nutrient intake estimated by the FFQ, especially for fat and
198 cholesterol, was noted to be lower than that of the dietary records, which is the reference
199 standard (14), possibly limiting the ability to accurately evaluate the composition of
200 macronutrients in the participants' diets (14). Although the benefits of ketonuria observed in
201 our study cannot be directly linked to certain dietary regimens, our findings clearly indicate
202 that mild ketosis, as reflected in urine test, is associated with a reduced risk of NAFLD and its
203 severity in non-diabetic individuals.

204 In our subgroup analysis, the protective effects of ketonuria against incident NAFLD
205 were significant only in the non-obese group (BMI <25 kg/m²). Such finding may reflect the
206 close association of obesity with hyperinsulinemia, which promotes the activation of acetyl
207 Co-A carboxylase and consequently increases fatty acid synthesis, directing acetyl Co-A
208 away from ketone body production (22, 28, 29). In light of this, our study provides the first
209 evidence that mild fasting ketonuria, a semi-quantitative indicator of increased ketosis, is
210 associated with reduced risk of incident NAFLD and advanced fibrosis, especially non-obese
211 individuals.

212 In many previous studies, weight reduction was reported as an intended outcome or a
213 significant consequence of the ketogenic diet (20, 21, 25, 27). Moreover, the magnitude of
214 weight reduction was shown to be positively associated with a decrease in fibrosis severity

215 (13). It is therefore plausible that the metabolic benefits of induced ketosis on fatty liver
216 shown in these studies may have been mediated by the effects of weight reduction. Although
217 weight-independent benefits of ketogenic diet in NAFLD has been reported in few studies (30,
218 31), these studies were conducted only for a short-term and have focused on the effects of
219 specific dietary regimen, not on physiological ketosis *per se*. Our findings, using urinary
220 ketones as surrogate marker for physiological ketosis, showed a significant inverse
221 association between ketonuria and the risk of incident NAFLD both with and without
222 advanced fibrosis, even after adjusting for BMI and BMI change as a time-dependent variable.
223 Thus, and importantly, changes in BMI did not seem to fully explain the association between
224 ketonuria and NAFLD in our study.

225 Furthermore, our findings suggest that the greatest benefit may be obtained from the
226 presence of ketonuria at both baseline and follow-up. The presence of ketonuria at both
227 baseline and follow up was associated with greatest decrease in the aHR for incident NAFLD.
228 Therefore, we can speculate that persistent ketosis produces a ‘cumulative’ benefit in
229 decreasing NAFLD risk. There is little data on the long-term effects of persistent ketosis with
230 most of the existing studies being conducted in studies of <1 year. However, the long-term
231 continuation of ketogenic diets is not generally recommended due to potential health risks of
232 prolonged ketosis (32). These concerns, however, are mostly applicable to the cases of strict
233 ketogenic diets with extreme carbohydrate restriction which might not be applicable to
234 subjects in our study (in which there was no specific dietary intervention). Further studies are
235 needed in order to confirm our findings and investigate the long-term health effects of mild
236 ketosis in non-diabetic individuals.

237 The mechanisms by which mild ketonuria reduces the risks of liver steatosis and
238 fibrosis are unclear. Ketogenesis has been associated with protecting against liver injury in
239 mice by up-regulation of the levels of the antioxidant enzymes such as SOD2, Gpx1 (33-35),
240 as well as producing favorable changes in liver metabolism and hepatocyte regeneration, via

241 stimulating liver autophagy which is normally deregulated in NAFLD (36). Ketone
242 production was also linked to a rapid increase in mitochondrial beta-oxidation leads to
243 decreased hepatic *de novo* lipogenesis and decreased hepatic fat accumulation (30). Also,
244 peroxisome proliferator-activated receptor (PPAR)-alpha (29) is strongly induced in
245 ketogenesis (37), stimulating FGF21 expression, which is known to suppress hepatic
246 lipogenesis and redirects fatty acids to beta-oxidation (29, 38). Other potential mechanisms
247 may involve ketosis-induced reduction of TGF-beta 1, which plays a critical role in the
248 pathogenesis of liver fibrosis and hepatocellular carcinoma, and anti-inflammatory role of
249 ketone bodies (37, 39, 40). In our study, the risk of incident NAFLD was also decreased in the
250 groups where ketonuria was detected (at either baseline, or 2nd visit). These results are
251 potentially clinically relevant because they suggest that any ketonuria in the fasted state (in
252 subjects who do not have diabetes), is associated with decreased risk of developing NAFLD.
253 Hepatic ketogenesis has been associated with total fat oxidation (41), and ketonuria might be
254 an indication of high fat oxidation ability. Whether this finding reflects increased levels of fat
255 oxidation and subsequent increased ketogenesis in subjects at reduced risk of NAFLD cannot
256 be addressed by our study. Further mechanistic research is needed, specifically to address the
257 relationships between fat oxidation, ketogenesis and development of NAFLD.

258 Several limitations of our study should be considered. First, ultrasonography and
259 liver fibrosis index (NFS and FIB-4) in our analyses was used in lieu of liver biopsy, which is
260 the reference standard for the diagnosis of NAFLD but was considered unfeasible in this
261 large-scale cohort study involving repeat measurements over time. Although liver ultrasound,
262 NFS and FIB-4 have been widely used and well validated by liver biopsy (42, 43), there are
263 other reliable, non-invasive methods to assess liver fibrosis such as transient elastography
264 (44-46). In our study, data on transient elastography were not available because our study was
265 based on de-identified, retrospective cohort data of individuals who participated in a routine
266 health check-up program in which transient elastography was not included. Second, although

267 semi-quantitative ketosis was assessed by ketonuria measures, urine ketone body levels
268 correlate well with serum ketone body concentration. Furthermore, the urine test is widely
269 used as a less expensive alternative to blood testing, rendering it better suited to large
270 epidemiological studies (23, 47). Third, information on fasting duration, recent dietary
271 characteristics and intermittent fasting, which can affect ketosis, was not available in our
272 study. Additionally, we cannot exclude the possibility of potentially unmeasured or other
273 residual confounding in our study. Lastly, our findings from relatively young and middle-aged
274 Koreans used may limit the generalizability to other age groups, populations with a higher
275 prevalence of comorbidities, or other ethnic groups. In addition, the mean BMI of our cohort
276 (21.9 kg/m²) is considerably lower than that in some Western countries (e.g., the United
277 States), which further limits the applicability of the findings to the general population in other
278 countries, especially given our findings that the effects of ketonemia may differ by
279 overweight status.

280 In conclusion, the present study showed that fasting ketonuria was associated with
281 reduced risk of both developing NAFLD and advanced fibrosis in nondiabetic individuals.
282 Our findings suggest potential benefits of hyperketonemia in the prevention of NAFLD and
283 its progression, which warrants further investigation.

284

285 **Acknowledgements**

286 This study was supported by SKKU Excellence in Research Award Research Fund,
287 Sungkyunkwan University, 2020 and by the National Research Foundation of Korea (NRF)
288 funded by the Ministry of Science, ICT & Future Planning (NRF-2017R1A2B2008401).
289 CDB is supported in part by the Southampton NIHR Biomedical Research Centre (IS-BRC-
290 20004), UK.

References

1. Angulo P, Kleiner DE, Dam-Larsen S, et al. Liver Fibrosis, but No Other Histologic Features, Is Associated With Long-term Outcomes of Patients With Nonalcoholic Fatty Liver Disease. *Gastroenterology* 2015;149:389-97 e10.
2. Leoni S, Tovoli F, Napoli L, et al. Current guidelines for the management of non-alcoholic fatty liver disease: A systematic review with comparative analysis. *World J Gastroenterol* 2018;24:3361-3373.
3. Byrne CD, Targher G. NAFLD: a multisystem disease. *J Hepatol* 2015;62:S47-64.
4. Armstrong MJ, Adams LA, Canbay A, et al. Extrahepatic complications of nonalcoholic fatty liver disease. *Hepatology* 2014;59:1174-97.
5. Dyson JK, Anstee QM, McPherson S. Non-alcoholic fatty liver disease: a practical approach to treatment. *Frontline Gastroenterol* 2014;5:277-286.
6. Manninen AH. Metabolic effects of the very-low-carbohydrate diets: misunderstood "villains" of human metabolism. *J Int Soc Sports Nutr* 2004;1:7-11.
7. Gershuni VM, Yan SL, Medici V. Nutritional Ketosis for Weight Management and Reversal of Metabolic Syndrome. *Curr Nutr Rep* 2018;7:97-106.
8. Kim G, Lee SG, Lee BW, et al. Spontaneous ketonuria and risk of incident diabetes: a 12 year prospective study. *Diabetologia* 2019;62:779-788.
9. Laffel L. Ketone bodies: a review of physiology, pathophysiology and application of monitoring to diabetes. *Diabetes Metab Res Rev* 1999;15:412-26.
10. Tandler D, Lin S, Yancy WS, Jr., et al. The effect of a low-carbohydrate, ketogenic diet on nonalcoholic fatty liver disease: a pilot study. *Dig Dis Sci* 2007;52:589-93.
11. Yancy WS, Jr., Olsen MK, Guyton JR, et al. A low-carbohydrate, ketogenic diet versus a low-fat diet to treat obesity and hyperlipidemia: a randomized, controlled trial. *Ann Intern Med* 2004;140:769-77.

12. Foster GD, Wyatt HR, Hill JO, et al. A randomized trial of a low-carbohydrate diet for obesity. *N Engl J Med* 2003;348:2082-90.
13. Vilar-Gomez E, Athinarayanan SJ, Adams RN, et al. Post hoc analyses of surrogate markers of non-alcoholic fatty liver disease (NAFLD) and liver fibrosis in patients with type 2 diabetes in a digitally supported continuous care intervention: an open-label, non-randomised controlled study. *BMJ Open* 2019;9:e023597.
14. Ahn Y, Kwon E, Shim JE, et al. Validation and reproducibility of food frequency questionnaire for Korean genome epidemiologic study. *Eur J Clin Nutr* 2007;61:1435-41.
15. WHO Western Pacific Region, IASO and IOTF. *The Asia-Pacific Perspective: Redefining Obesity and Its Treatment*. Health Communications Australia Pty Limit: Sdney, Australia. 2000.
16. Mathiesen UL, Franzen LE, Aselius H, et al. Increased liver echogenicity at ultrasound examination reflects degree of steatosis but not of fibrosis in asymptomatic patients with mild/moderate abnormalities of liver transaminases. *Dig Liver Dis* 2002;34:516-22.
17. Chalasani N, Younossi Z, Lavine JE, et al. The diagnosis and management of non-alcoholic fatty liver disease: practice Guideline by the American Association for the Study of Liver Diseases, American College of Gastroenterology, and the American Gastroenterological Association. *Hepatology* 2012;55:2005-23.
18. Angulo P, Hui JM, Marchesini G, et al. The NAFLD fibrosis score: a noninvasive system that identifies liver fibrosis in patients with NAFLD. *Hepatology* 2007;45:846-54.
19. McPherson S, Stewart SF, Henderson E, et al. Simple non-invasive fibrosis scoring systems can reliably exclude advanced fibrosis in patients with non-alcoholic fatty liver disease. *Gut* 2010;59:1265-9.
20. Browning JD, Baker JA, Rogers T, et al. Short-term weight loss and hepatic triglyceride reduction: evidence of a metabolic advantage with dietary carbohydrate

restriction. *Am J Clin Nutr* 2011;93:1048-52.

21. Volynets V, Machann J, Kuper MA, et al. A moderate weight reduction through dietary intervention decreases hepatic fat content in patients with non-alcoholic fatty liver disease (NAFLD): a pilot study. *Eur J Nutr* 2013;52:527-35.

22. Soeters MR, Sauerwein HP, Faas L, et al. Effects of insulin on ketogenesis following fasting in lean and obese men. *Obesity (Silver Spring)* 2009;17:1326-31.

23. Coleman MD, Nickols-Richardson SM. Urinary ketones reflect serum ketone concentration but do not relate to weight loss in overweight premenopausal women following a low-carbohydrate/high-protein diet. *J Am Diet Assoc* 2005;105:608-11.

24. Joo NS, Lee DJ, Kim KM, et al. Ketonuria after fasting may be related to the metabolic superiority. *J Korean Med Sci* 2010;25:1771-6.

25. Kirk E, Reeds DN, Finck BN, et al. Dietary fat and carbohydrates differentially alter insulin sensitivity during caloric restriction. *Gastroenterology* 2009;136:1552-60.

26. Perez-Guisado J, Munoz-Serrano A. The effect of the Spanish Ketogenic Mediterranean Diet on nonalcoholic fatty liver disease: a pilot study. *J Med Food* 2011;14:677-80.

27. Haghghatdoost F, Salehi-Abargouei A, Surkan PJ, et al. The effects of low carbohydrate diets on liver function tests in nonalcoholic fatty liver disease: A systematic review and meta-analysis of clinical trials. *J Res Med Sci* 2016;21:53.

28. Kim HJ, Joo NS, Kim KM, et al. Different response of body weight change according to ketonuria after fasting in the healthy obese. *J Korean Med Sci* 2012;27:250-4.

29. Tucker B, Li H, Long X, et al. Fibroblast growth factor 21 in non-alcoholic fatty liver disease. *Metabolism* 2019;101:153994.

30. Mardinoglu A, Wu H, Bjornson E, et al. An Integrated Understanding of the Rapid Metabolic Benefits of a Carbohydrate-Restricted Diet on Hepatic Steatosis in Humans. *Cell Metab* 2018;27:559-571 e5.

31. Ryan MC, Abbasi F, Lamendola C, et al. Serum alanine aminotransferase levels decrease further with carbohydrate than fat restriction in insulin-resistant adults. *Diabetes Care* 2007;30:1075-80.
32. Li Z, Heber D. Ketogenic Diets. *JAMA* 2020;323:386-386.
33. Greco T, Glenn TC, Hovda DA, et al. Ketogenic diet decreases oxidative stress and improves mitochondrial respiratory complex activity. *J Cereb Blood Flow Metab* 2016;36:1603-13.
34. Brandhorst S, Choi IY, Wei M, et al. A Periodic Diet that Mimics Fasting Promotes Multi-System Regeneration, Enhanced Cognitive Performance, and Healthspan. *Cell Metab* 2015;22:86-99.
35. Verweij M, van Ginhoven TM, Mitchell JR, et al. Preoperative fasting protects mice against hepatic ischemia/reperfusion injury: mechanisms and effects on liver regeneration. *Liver Transpl* 2011;17:695-704.
36. Khambu B, Yan S, Huda N, et al. Autophagy in non-alcoholic fatty liver disease and alcoholic liver disease. *Liver Res* 2018;2:112-119.
37. Piccinin E, Moschetta A. Hepatic-specific PPARalpha-FGF21 action in NAFLD. *Gut* 2016;65:1075-6.
38. Zhang Y, Lei T, Huang JF, et al. The link between fibroblast growth factor 21 and sterol regulatory element binding protein 1c during lipogenesis in hepatocytes. *Mol Cell Endocrinol* 2011;342:41-7.
39. Shimazu T, Hirschey MD, Newman J, et al. Suppression of oxidative stress by beta-hydroxybutyrate, an endogenous histone deacetylase inhibitor. *Science* 2013;339:211-4.
40. Youm YH, Nguyen KY, Grant RW, et al. The ketone metabolite beta-hydroxybutyrate blocks NLRP3 inflammasome-mediated inflammatory disease. *Nat Med* 2015;21:263-9.
41. Puchalska P, Crawford PA. Multi-dimensional Roles of Ketone Bodies in Fuel Metabolism, Signaling, and Therapeutics. *Cell Metab* 2017;25:262-284.

42. Hernaez R, Lazo M, Bonekamp S, et al. Diagnostic accuracy and reliability of ultrasonography for the detection of fatty liver: a meta-analysis. *Hepatology* 2011;54:1082-90.
43. Shah AG, Lydecker A, Murray K, et al. Comparison of noninvasive markers of fibrosis in patients with nonalcoholic fatty liver disease. *Clin Gastroenterol Hepatol* 2009;7:1104-12.
44. Castera L, Forns X, Alberti A. Non-invasive evaluation of liver fibrosis using transient elastography. *J Hepatol* 2008;48:835-47.
45. Petta S, Di Marco V, Pipitone RM, et al. Prevalence and severity of nonalcoholic fatty liver disease by transient elastography: Genetic and metabolic risk factors in a general population. *Liver Int* 2018;38:2060-2068.
46. Roulot D, Costes JL, Buyck JF, et al. Transient elastography as a screening tool for liver fibrosis and cirrhosis in a community-based population aged over 45 years. *Gut* 2011;60:977-84.
47. Nakajima K, Oda E. Ketonuria may be associated with low serum amylase independent of body weight and glucose metabolism. *Arch Physiol Biochem* 2017;123:293-296.

Table 1. Baseline characteristics according ketonuria status among 153,076 participants without nonalcoholic fatty liver disease (NAFLD)

Characteristics	Overall	Ketonuria status		<i>P</i> value
		No	Yes	
Number of participants	153,076	133,623	19,453	
Age (years)	36.0 (6.6)	36.1 (6.7)	35.2 (6.0)	<0.001
Men (%)	41.8	42.5	36.8	<0.001
Seoul center (%)	56.6	55.9	61.2	<0.001
Alcohol intake ^a (%)	26.1	26.4	23.7	<0.001
Current smoker (%)	14.6	15.1	10.6	<0.001
HEPA (%)	14.7	14.6	15.7	<0.001
Education level ^b (%)	86.2	86.1	86.9	0.006
Hypertension (%)	4.3	4.5	3.3	<0.001
History of CVD (%)	0.5	0.5	0.4	0.046
Medication for hyperlipidemia (%)	0.7	0.8	0.5	<0.001
Obesity (%)	12.2	12.6	9.2	<0.001
Body mass index (kg/m ²)	21.9 (2.7)	22.0 (2.7)	21.4 (2.6)	<0.001
SBP (mmHg)	105.4 (11.7)	105.5 (11.8)	104.4 (11.5)	<0.001
DBP (mmHg)	67.1 (8.8)	67.3 (8.8)	66.1 (8.5)	<0.001
Glucose (mg/dl)	91.1 (7.5)	91.8 (7.1)	85.7 (8.4)	<0.001
Total cholesterol (mg/dl)	187.3 (31.4)	187.4 (31.3)	187.0 (31.9)	0.084
LDL-C (mg/dl)	113.5 (29.3)	113.6 (29.2)	112.3 (30.3)	<0.001
HDL-C (mg/dl)	62.9 (14.8)	62.4 (14.8)	66.3 (15.0)	<0.001
Triglycerides (mg/dl)	75 (57-103)	78 (59-107)	58 (48-73)	<0.001
ALT (U/L)	15 (11-20)	15 (11-20)	15 (11-20)	0.003
AST (U/L)	18 (15-21)	18 (15-21)	19 (16-22)	<0.001
GGT (U/L)	15 (11-23)	16 (11-23)	14 (11-20)	<0.001
hsCRP (mg/L)	0.3 (0.2-0.6)	0.3 (0.2-0.6)	0.3 (0.2-0.7)	<0.001
HOMA-IR	1.04 (0.70-1.48)	1.09 (0.76-1.53)	0.64 (0.41-0.95)	<0.001
Total energy intake (kcal/d) ^c	1465.2 (1102.5-1860.0)	1469.8 (1106.2-1863.0)	1438.0 (1078.0-1838.4)	<0.001
Carbohydrate proportion (%)	67.9 (61.9-73.1)	67.9 (62.0-73.2)	67.4 (61.2-72.6)	<0.001
Fat proportion (%)	18.4 (14.4-23.1)	18.4 (14.3-23.0)	18.9 (14.8-23.7)	<0.001
Protein proportion (%)	13.5 (12.1-15.3)	13.5 (12.1-15.3)	13.6 (12.1-15.4)	<0.001
Carbohydrate <50 g/day (%)	4.0	3.9	4.4	0.016

Data are expressed as mean (standard deviation), median (interquartile range), or percentage.

Abbreviations: ALT, alanine aminotransferase; AST, aspartate transaminase; GGT, gamma-glutamyl transferase; HEPA, health-enhancing physical activity; HDL-C, high-density lipoprotein-cholesterol; hsCRP, high sensitivity C-reactive protein; HOMA-IR, homeostasis model assessment of insulin resistance; LDL-C, low-density lipoprotein-cholesterol

^a ≥ 10 g of ethanol per day.

^b ≥ College graduate.

^c Among 110,150 participants with plausible estimated energy intake (within three standard deviations of the log-transformed mean energy intake).

Tables 2. Development of nonalcoholic fatty liver disease (NAFLD) and NAFLD with intermediate-to-high probability of advanced fibrosis by ketonuria category in nondiabetic individuals among 153,076 subjects.

Category of ketonuria status	Person-years (PY)	Incident cases	Incidence density (/ 10 ³ PY)	Crude HR (95% CI)	Multivariable-adjusted HR ^a (95% CI)		HR (95% CI) ^b in a model with time-dependent variables
					Model 1	Model 2	
NAFLD							
No ketonuria	587,143.4	27,836	47.4	1.00 (reference)	1.00 (reference)	1.00 (reference)	1.00 (reference)
Ketonuria	90,558.7	3,243	36.8	0.75 (0.72-0.77)	0.81 (0.78-0.84)	0.89 (0.86-0.92)	0.90 (0.86-0.94)
NAFLD + Intermediate/high NFS							
No ketonuria	648,207.5	2,189	3.4	1.00 (reference)	1.00 (reference)		1.00 (reference)
Ketonuria	97,781.8	236	2.4	0.71 (0.62-0.81)	0.79 (0.69-0.90)		0.75 (0.63-0.90)
NAFLD + Intermediate/high FIB-4							
No ketonuria	650,165.4	1,439	2.2	1.00 (reference)	1.00 (reference)	1.00 (reference)	1.00 (reference)
Ketonuria	98,042.4	138	1.4	0.63 (0.53-0.75)	0.69 (0.58-0.83)	0.76 (0.64-0.90)	0.54 (0.41-0.71)

^aEstimated from parametric proportional hazard models. Multivariable Model 1 was adjusted for sex, center, year of screening, alcohol intake, smoking, physical activity, total energy intake, education level, history of diabetes (only for FIB-4), history of hypertension, and history of cardiovascular disease; Model 2: Model 1 plus adjustment for BMI.

^bEstimated from parametric proportional hazard models with ketonuria status, smoking, alcohol consumption, physical activity, BMI (only for FIB-4) and total energy intake as time-dependent categorical variables and baseline sex, center, year of screening, education level, history of diabetes (only for FIB-4), history of hypertension, and history of cardiovascular disease as time-fixed variables.

Abbreviations: BMI, body mass index; CI, confidence interval; HR, hazard ratio.

Table 3. Development of nonalcoholic fatty liver disease (NAFLD) and NAFLD with intermediate-to-high probability of advanced fibrosis by ketonuria change category at baseline among NAFLD-free non-diabetic participants with low probability of advanced fibrosis at baseline among 99,869 subjects.

Ketonuria change category	Ketonuria status at 1st and 2nd visits		Person-years (PY)	Incident cases	Incidence density (/ 10 ³ PY)	Crude HR (95% CI)	Multivariable-adjusted HR ^a (95% CI)		HR (95% CI) ^b in a model with time-dependent variables
	1 st test	2 nd test					Model 1	Model 2	
NAFLD									
None (G1)	None	None	288,182.9	13,794	47.2	1.00 (reference)	1.00 (reference)	1.00 (reference)	1.00 (reference)
Regressed (G2)	Ketonuria	None	42,503.5	1,596	37.0	0.78 (0.74-0.82)	0.83 (0.79-0.88)	0.91 (0.87-0.96)	0.86 (0.82-0.91)
Developed (G3)	None	Ketonuria	29,544.3	966	32.3	0.67 (0.63-0.72)	0.79 (0.74-0.84)	0.81 (0.76-0.87)	0.82 (0.77-0.88)
Persistent (G4)	Ketonuria	Ketonuria	7,808.1	192	24.1	0.50 (0.44-0.58)	0.64 (0.55-0.74)	0.68 (0.59-0.79)	0.66 (0.57-0.76)
NAFLD + intermediate/high NFS scores									
None (G1)	None	None	311,854.0	1,096	3.5	1.00 (reference)	1.00 (reference)		1.00 (reference)
Regressed (G2)	Ketonuria	None	45,294.8	110	2.4	0.69 (0.57-0.84)	0.75 (0.61-0.91)		0.82 (0.66-1.02)
Developed (G3)	None	Ketonuria	31,230.9	72	2.3	0.65 (0.51-0.83)	0.79 (0.62-1.01)		0.87 (0.67-1.13)
Persistent (G4)	Ketonuria	Ketonuria	8,089.1	8	1.0	0.28 (0.14-0.57)	0.39 (0.19-0.78)		0.30 (0.13-0.73)
NAFLD + intermediate/high FIB-4 scores									
None (G1)	None	None	312,601.9	735	2.3	1.00 (reference)	1.00 (reference)	1.00 (reference)	1.00 (reference)
Regressed (G2)	Ketonuria	None	45,376.7	73	1.6	0.69 (0.54-0.88)	0.74 (0.58-0.94)	0.81 (0.64-1.03)	0.78 (0.58-1.03)
Developed (G3)	None	Ketonuria	31,284.7	45	1.4	0.60 (0.45-0.82)	0.73 (0.54-0.98)	0.75 (0.55-1.01)	0.74 (0.51-1.05)
Persistent (G4)	Ketonuria	Ketonuria	8,090.7	7	0.9	0.37 (0.18-0.78)	0.49 (0.23-1.03)	0.53 (0.25-1.11)	0.49 (0.20-1.19)

^aEstimated from parametric proportional hazard models. Multivariable Model 1 was adjusted for sex, center, year of screening, alcohol intake, smoking, physical activity, total energy intake, education level, history of diabetes (only for FIB-4), history of hypertension, and history of cardiovascular disease; Model 2: Model 1 plus adjustment for BMI.

^bEstimated from parametric proportional hazard models with ketonuria change category, smoking, alcohol consumption, physical activity, BMI (only for FIB-4) and total energy intake as time-dependent categorical variables and baseline sex, center, year of screening, education level, history of diabetes (only for FIB-4), history of hypertension, and history of cardiovascular disease as time-fixed variables.

Abbreviations: BMI, body mass index; CI, confidence interval; G1, no ketonuria at baseline and no ketouria at 2nd visit (reference group); G2, ketonuria at baseline and no ketonuria at 2nd visit (ketonuria regressed); G3, no ketonuria at baseline and ketouria at 2nd visit (ketonuria developed); G4, ketonuria at baseline and ketouria at 2nd visit (persistent ketonuria); HR, hazard ratio.

Figure 1. Flow chart of study participants