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Supplementary appendix

This appendix formed part of the original submission and has been peer reviewed. We post it as supplied by the authors.

Supplement to: Narula S, Yusuf S, Chong M, et al. Plasma ACE2 and risk of death or cardiometabolic diseases: a case-cohort analysis. *Lancet* 2020; **396:** 968–76.

9 Supplementary Appendix 1: Supplementary Methods

10 **Selection of Countries**

- 11 The following information on the PURE study is excerpted from our previously published protocol and subsequent
- publications which describe the design, sampling, and adjudication in detail.¹ The choice and number of countries
13 selected in PURE reflects a balance between involving a large number of communities in countries at dif
- selected in PURE reflects a balance between involving a large number of communities in countries at different
- 14 economic levels, with substantial heterogeneity in social and economic circumstances and policies, and the
15 feasibility of centers to successfully achieve long-term follow-up. Thus, PURE included sites in which inve
- 15 feasibility of centers to successfully achieve long-term follow-up. Thus, PURE included sites in which investigators
- 16 are committed to collecting good-quality data for a low-budget study over the planned 10-year follow-up period and 17 did not aim for a strict proportionate sampling of the entire world. The following countries and terr
- 17 did not aim for a strict proportionate sampling of the entire world. The following countries and territories participate
18 in the PURE study: Argentina, Bangladesh, Brazil, Canada, Chile, China, Colombia, Ecuador, Indi
- 18 in the PURE study: Argentina, Bangladesh, Brazil, Canada, Chile, China, Colombia, Ecuador, India, Iran, 19
19 Kazakhstan, Kyrgyzstan, Malaysia, Pakistan, Palestine, Peru, Philippines, Poland, Russia, Saudi Arabia, S 19 Kazakhstan, Kyrgyzstan, Malaysia, Pakistan, Palestine, Peru, Philippines, Poland, Russia, Saudi Arabia, South
- 20 Africa, Sweden, Tanzania, Turkey, United Arab Emirates, Uruguay, Zimbabwe.
- $\frac{21}{22}$

22 **Selection of Communities** 23 Within each country, urban and rural communities were selected based on broad guidelines (see Guidelines for
24 Selection of Countries, Communities, Households, and Individuals Recruited to PURE). A common definition i 24 Selection of Countries, Communities, Households, and Individuals Recruited to PURE). A common definition for
25 "community" that is applicable globally is difficult to establish. In PURE, a community was defined as a gr 25 "community" that is applicable globally is difficult to establish. In PURE, a community was defined as a group of 26 people who have common characteristics and reside in a defined geographic area. A city or large town was not
27 usually considered a single community, rather communities from low-, middle-, and high-income areas were 27 usually considered a single community, rather communities from low-, middle-, and high-income areas were 28 selected from sections of the city and the community area defined according to a geographical measure (e.g., a set of 29 contiguous postal code areas or a group of streets or a village). The primary sampling unit for 29 contiguous postal code areas or a group of streets or a village). The primary sampling unit for rural areas in many
30 countries was the village. The reason for inclusion of both urban and rural communities is that for 30 countries was the village. The reason for inclusion of both urban and rural communities is that for many countries,
31 urban and rural environments exhibit distinct characteristics in social and physical environment, an 31 urban and rural environments exhibit distinct characteristics in social and physical environment, and hence, by
32 sampling both, we ensured considerable variation in societal factors across PURE communities. sampling both, we ensured considerable variation in societal factors across PURE communities. 33

34 The number of communities selected in each country varied, with the aim to recruit communities with substantial
35 heterogeneity in social and economic circumstances balanced against the capacity of local investigators 35 heterogeneity in social and economic circumstances balanced against the capacity of local investigators to maintain
36 follow-up. In some countries (e.g., India, China, Canada, and Colombia), communities from several st 36 follow-up. In some countries (e.g., India, China, Canada, and Colombia), communities from several states/provinces
37 were included to capture regional diversity, in policy, socioeconomic status, culture, and physical e were included to capture regional diversity, in policy, socioeconomic status, culture, and physical environment. In 38 other countries (e.g. Iran, Poland, Sweden, and Zimbabwe), fewer communities were selected.

39

40 **Selections of Households and Individuals** 41 Within each community, sampling was designed to achieve a broadly representative sample of that community of 42 adults aged between 35 and 70 years. The choice of sampling frame within each center was based on both 42 adults aged between 35 and 70 years. The choice of sampling frame within each center was based on both 43 "representativeness" and feasibility of long-term follow-up, following broad study guidelines. Once a com 43 "representativeness" and feasibility of long-term follow-up, following broad study guidelines. Once a community 44 was identified, where possible, common and standardized approaches were applied to the enumeration of 44 was identified, where possible, common and standardized approaches were applied to the enumeration of households, identification of individuals, recruitment procedures, and data collection. households, identification of individuals, recruitment procedures, and data collection.

46
47 47 The method of approaching households differed between regions. For example, in rural areas of India and China, a
48 community announcement was made to the village through contact of a community leader, followed by in-pe 48 community announcement was made to the village through contact of a community leader, followed by in-person door-to-door visits of all households. In contrast, in Canada, initial contact was by mail followed by telephon door-to-door visits of all households. In contrast, in Canada, initial contact was by mail followed by telephone 50 inviting members of the households to a central clinic. Households were eligible if at least 1 member of the household was between the ages of 35 and 70 years and the household members intended to continue living 51 household was between the ages of 35 and 70 years and the household members intended to continue living in their 52 current home for a further 4 years. current home for a further 4 years.

53
54 54 For each approach, at least 3 attempts at contact were made. All individuals within these households between 35 and 55 70 years providing written informed consent were enrolled. When an eligible household or eligible individual in a 56 household refused to participate, demographics and self-reported data about CVD risk factors, education, and history
57 of CVD, cancers and deaths in the households within the 2 previous years were recorded. 57 of CVD, cancers and deaths in the households within the 2 previous years were recorded.

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- 58 59 To ensure standardization and high data quality, we used a comprehensive operations manual, training workshops, 60 DVDs, regular communication with study personnel and standardized report forms. We entered all data in a
- 60 DVDs, regular communication with study personnel and standardized report forms. We entered all data in a
- 61 customized database programmed with range and consistency checks, which was transmitted, electronically to the
- 62 Population Health Research Institute in Hamilton (Ontario, Canada) where further quality checks were implemented.
- 63

64 **Guidelines for Selection of Countries, Communities, Households, and Individuals Recruited to PURE**

Countries

1. High-income countries, middle-income countries, and low-income countries, with the bulk of the recruitment from low- and middle-income regions.

2. Committed local investigators with experience in recruiting for population studies.

Communities

1. Select both urban and rural communities. Use the national definition of the country to determine urban and rural communities.

2. Select rural communities that are isolated (distance of >50 km or lack easy access to commuter transportation) from urban centers. However, consider ability to process bloods samples, e.g., villages in rural developing countries should be within 45-min drive of an appropriate facility.

3. Define community to a geographical area, e.g., using postal codes, catchment area of health service/clinics, census tracts, areas bordered by specific streets or natural borders such as a river bank.

4. Consider feasibility for long-term follow-up, e.g., for urban communities, choose sites that have a stable population such as residential colonies related to specific work sites in developing countries. In rural areas, choose villages that have a stable population. Villages at greater distance from urban centers are less susceptible to large migration to urban centers.

5. Enlist a community organization to facilitate contact with the community, eg, in urban areas, large employers (government and private), insurance companies, clubs, religious organizations, clinic or hospital service regions. In rural areas, local authorities such as priests or community elders, hospital or clinic, village leader, or local politician.

Individual

1. Broadly representative sampling of adults 35 to 70 years within each community unit.

2. Consider feasibility for long-term follow-up when formulating community sampling framework, e.g., small percentage random samples of large communities may be more difficult to follow-up because they are dispersed by distance. In rural areas of developing countries that are not connected by telephone, it may be better to sample entire community (i.e., door-to-door systematic sampling).

3. The method of approach of households/individuals may differ between sites. In MIC and HIC, mail, followed up by phone contact may be the practical first means of contact. In LIC, direct household contact through household visits may be the most appropriate means of first contact.

4. Once recruited, all individuals are invited to a study clinic to complete standardized questionnaires and have a standardized set of measurements.

PURE Data Collection Procedures

 Data have been collected at national, community, household, and individual levels with standardized questionnaires (cite). Questions about age, sex, education, smoking status, hypertension, type 2 diabetes, and obesity were identical 71 to those in the INTERHEART and INTERSTROKE studies.^{2,3} We obtained blood pressure (BP) measurements in individuals and hypertension was defined as a BP >140/>90 mmHg or in individuals who were already receiving treatment. Fasting glucose was available in most individuals (76%) and type 2 diabetes was defined as those 74 individuals reporting type 2 diabetes or those with a fasting plasma glucose ≥ 7.0 mmol/L or a HbA1c $\geq 6.5\%$ or a 2-75 hour plasma glucose on oral glucose tolerance test $\geq 11 \cdot 1$ mmol/L. In most of the low-income countries (LIC) and medium-income countries (MIC) there was no central system of death or event registration. Therefore, to arrive at a probable diagnosis or cause of death, we (1) obtained information on prior medical illness and medically certified causes of death, where available, or (2) captured the best available information from reliable sources when medical information was not available. Event documentation was based on information from household interviews and medical records, death certificates and other sources. We also used Verbal Autopsies to ascertain cause of death in addition to medical records, which were reviewed by a health professional. This approach has been used in several studies 82 conducted in LIC and MIC.

 To ensure a standard approach and accuracy for the classification of events across all countries and over time, the first 85 100 CVD events (deaths, myocardial infarction (MI), strokes, heart failure (HF)) for China and India, and 50 cases for other countries were adjudicated locally and by the adjudication chair. If necessary, further training was provided.

 Every year thereafter, 50 cases for China and India and 25 cases for each of the remaining countries were adjudicated as above.

 The standard operating procedure of the PURE study with regard to collection and storage consisted of drawing fasting and non-fasting blood samples from individuals. Samples were subsequently separated into six equal volumes, and 92 frozen immediately at -20° C or -70° C after processing. Samples were shipped in nitrogen vapor tanks from every site 93 to a blood storage site, where they were stored at -160° C in liquid nitrogen (Hamilton). Samples from China, India,

Turkey and Malaysia are kept locally because of legislations prohibiting export of biological specimens. Blood

95 samples were previously analyzed for total cholesterol, HDL cholesterol, apoB, apoA1 and glycated hemoglobin.

Selection for the Case-Cohort Analysis

This PURE biomarker analysis is a subsample/sub-study of the original PURE study. Eligibility for the biomarker

- analysis in PURE needed to maximize the opportunity for assessing novel protein and genetic markers of risk in a
- statistically appropriate manner, while doing so in a manner that was cost-effective from the perspective of genotyping
- 101 and multiplex biomarker analysis. As such, the case-cohort design was deemed the most reasonable design. Eligibility
- 102 at the outset was determined in the following manner:

Inclusion criteria

- Member of a major ethnicity in a residing country (i.e. European Caucasian in Sweden)
- Blood sample available for biomarker and genetic analysis
-

Exclusion criteria

- Country does not allow export of biological sample (China, India, Turkey, Malaysia) *
- 109 Non-fasting blood only, or missing/inadequate blood sample
- * Future targeted validation/replication studies may be possible.

 Among the ~55,000 PURE participants with biological specimen stored at our institution locally, "cases" (those not in sub-cohort) were selected if they had at least one major adverse health event , including myocardial infarction

114 (MI), stroke, heart failure (HF), type 2 diabetes (T2D) or death (from all causes, including cardio-vascular diseases).
115 Corresponding members of the 'control' group were selected by frequency-matching according to Corresponding members of the 'control' group were selected by frequency-matching according to major country

- specific ethnicity. This procedure is described as follows:
- **(1)** Incident MI, stroke, HF, T2D, and death were tabulated by major country-specific ethnicity.
-

 (2) The number of controls to be selected in each major country-specific ethnicity is the sum of the adverse health events mentioned above. This approach guaranteed that all cases (by country and ethnicity) had matched controls.

 (3) Among the 55,246 PURE participants with biological specimen stored at PHRI, **a random sample of subjects**

 equal to the controls counted in step 2 was selected in each major country-specific ethnicity. Importantly, *selected controls may have had adverse health events as per case-cohort design*.

 (4) After this initial selection process, 12,066 participants were deemed eligible prior to proteomic quality control measures (described further in further detail below)

 (5) A subsequent selection process was undertaken, where individuals whose measurements did not meet quality

control standards was undertaken. This yielded 11,287 participants. In other words, after running samples through

the proteomics platform 779 participants (12,066 – 11,287), were further deemed ineligible for analysis.

PURE Subjects meeting eligibility criteria = 55,246

Randomly sampled for sub-

participants

143 **PURE Biomarker Sub-study Case-Cohort Sampling Depiction:**

144

Incident outcomes collected as part of the PURE Biomarker sub-study include death, myocardial

Rest of the Participants with Outcome= 5669*

*Note: These represent the number of participants available for analysis after accounting for samples that failed genomic and proteomic quality control and/or participants with extreme or missing values in variables of interests

Standardized Event Definitions in PURE

 Prospective Follow-up for Cardiovascular Events and Mortality: History of disease was collected at baseline from every participant with standardized questionnaires regarding history of a) hypertension, b) diabetes c) stroke d)

angina/myocardial infarction/coronary artery disease e) heart failure f) other heart disease.

 Information on specific events (death, myocardial infarction, stroke, heart failure, cancer, hospitalizations, new diabetes, injury, tuberculosis, human immunodeficiency viral infections, malaria, pneumonia, asthma, chronic

- obstructive pulmonary disease) were obtained from participants or their family members (events were reported by
- the participants if alive or by a relative if the individual had died). This information was adjudicated centrally in
- each country by trained physicians using standardized definitions. Because the PURE study involves urban and rural
- areas from middle- and low-income countries, supporting documents to confirm cause of death and/or event varied
- in degrees of completion and availability. In most of middle- and low-income countries there was no central system of death or event registration. Therefore, information was obtained about prior medical illness and medically
- certified cause of death where available, and, second, best available information was captured from reliable sources
- in those instances where medical information was not available in order to be able to arrive at a probable diagnosis
- or cause of death. Event documentation was based on information from household interviews and medical records,
- death certificates and other sources. Verbal autopsies were also used to ascertain cause of death in addition to
- medical records which were reviewed by a health professional. This approach has been used in several studies
- conducted in middle- and low-income countries.
- To ensure a standard approach and accuracy for classification of events across all countries and over time, the first
- 100 CVD events (deaths, MI, strokes, heart failure or cancers) for China and India, and 50 cases for other countries
- were adjudicated both locally and also by the adjudication chair, and if necessary further training was provided.
- Thereafter, every year, 50 cases for China and India and 25 cases for each of the remaining countries were
- adjudicated as above.
-

FATAL EVENTS

- **Cardiovascular Death – Definitions**
- 174 01.00 DEATH DUE TO CARDIOVASCULAR EVENTS
- 01·10 Sudden unexpected Cardiovascular Death (SCVD)
- Without evidence of other cause of death, death that occurred suddenly and unexpectedly (examples: witnessed
- collapse, persons resuscitated from cardiac arrest who later died) or persons seen alive less than 12 hours prior to
- discovery of death (example persons found dead in his/her bed).
- 179 SCVD is either definite, probable or possible according to the following characteristics:

181 01:30 Fatal Myocardial Infarction (MI)

182 Symptoms of Myocardial Infarction:

183 Typical symptoms or suggestive symptoms of MI according to physician are characterized by severe anterior chest

184 pain as tightness, crushing, burning, lasting at least 20 minutes, occurring at rest, or on exertion, that may radiate to

185 the arms or neck or jaw and may be associated with dyspnea, diaphoresis and nausea. However, death associated with nausea and vomiting with or without chest pain not due to another cause may be considered as possible M with nausea and vomiting with or without chest pain not due to another cause may be considered as possible MI if

187 ECG and cardiac markers are not done. These symptoms may have occurred the last month before death.

188 Fatal myocardial infarction is either definite, probable or possible according to the following characteristics:

- 190 The Minnesota codes for MI is taken from Rose and Blackburn and published in their book "Evaluation Methods of 191 Cardiovascular Disease WHO 1969".
- 192 Definite MI is Q/R ratio $\geq 1/3$ and Q duration ≥ 0.03 second in one of the following leads: I, II, V2, 3, 4, 5, 193 6. (code 1-1-1)
- 194 Probable MI is Q/R ratio ≥1/3 and Q duration between 0·02 and 0·03 second in one of the following leads: 195 I, II, V2, 3, 4, 5, 6. (code 1-2-1)
- 196 Possible MI is Q/R ratio between 1/5 and 1/3 and Q duration between 0.02 and 0.03 second in one of the 197 following leads: I, II, V2, 3, 4, 5, 6. (code 1-3-1)
- 198

199 $01 \cdot 40$ Fatal Stroke

200 Fatal stroke is either definite or possible according to the following characteristics:

202 01.50 Fatal Congestive Heart Failure

203 Fatal congestive heart failure is either definite or possible according to the following characteristics:

205 01·60 Death Due to Other Cardiovascular Deaths *(other causes [1·10 to 1·50 above] having been excluded)*

207 NON-FATAL EVENTS

208 Cardiovascular Events – Definitions

209 10·00 NON-FATAL CARDIOVASCULAR EVENTS

- 210 10·10 Non-Periprocedural Myocardial Infarction (MI)
- 211 MI is considered either definite, probable or possible according to the following characteristics:
- 212

214

215

216 10·20 Periprocedural Myocardial Infarction

- 218 The Minnesota codes for MI is taken from Rose and Blackburn and published in their book "Evaluation Methods of 219 Cardiovascular Disease WHO 1969".
- 220 Definite MI is Q/R ratio $\geq 1/3$ and Q duration ≥ 0.03 second in one of the following leads: I, II, V2, 3, 4, 5, 221 6. (code 1-1-1) 6. $(code 1-1-1)$
- 222 Probable MI is Q/R ratio $\geq 1/3$ and Q duration between 0·02 and 0·03 second in one of the following leads: 223 I, II, V2, 3, 4, 5, 6. (code 1-2-1)
- 224 Possible MI is Q/R ratio between 1/5 and 1/3 and Q duration between 0·02 and 0·03 second in one of the 225 following leads: I, II, V2, 3, 4, 5, 6. (code 1-3-1)
- 226 10·30 Stroke/Transient Ischemic Attack (TIA)

228 10·40 Congestive Heart Failure

229 **Additional notes on Statistical Methods**

230 While 12,066 individuals were considered eligible at the outset, following proteomic quality control, an additional 231 779 samples were considered unsuitable for analysis. As such, this case-cohort study includes 11.2 231 779 samples were considered unsuitable for analysis. As such, this case-cohort study includes 11,287 participants 232 from PURE study. These 779, because they were not suitable for analysis, were deemed ineligible for 232 from PURE study. These 779, because they were not suitable for analysis, were deemed ineligible for analysis and
233 as such were believed to have no impact with regards to biasing final estimates. Among these 11,287, 233 as such were believed to have no impact with regards to biasing final estimates. Among these 11,287, a total of 534 234 subjects were excluded from the study sample (subjects with missing or out of range values in systolic blood 235 pressure, diabetes or smoking status at baseline, BMI, ancestry, last known date and subjects with out of range total 236 cholesterol or HDL). We imputed Total cholesterol, HDL, LDL and triglycerides. The missing data pattern was
237 arbitrary and we used PROC MI to generate 5 imputed data sets with 'FCS' (fully conditional specification) 237 arbitrary and we used PROC MI to generate 5 imputed data sets with 'FCS' (fully conditional specification) method.
238 We used sex as a classification variable and the data were imputed using age, sex and ancestry. In 238 We used sex as a classification variable and the data were imputed using age, sex and ancestry. In order to adjust for the effects of antihypertensive medication on systolic blood pressure, we added 15mmHg to the measu 239 the effects of antihypertensive medication on systolic blood pressure, we added 15mmHg to the measured systolic 240 blood pressure.^{4,5} In order to account for the effects of cholesterol lowering medication on blood lipid concentrations, all individuals on lipid lowering medications were corrected in the following manner: 241 concentrations, all individuals on lipid lowering medications were corrected in the following manner: total 242 cholesterol/0.8 and LDL/0.7. HDL and trigly certial were not adjusted.⁶ 242 cholesterol/0.8 and LDL/0.7. HDL and triglycerides were not adjusted.⁶

243
244 244 For the analysis of ACE2 determinants, coefficients of the ordinary least squares regression were pooled using 245 Rubin's rules. The adjusted R^2 for the final model (which included age, sex, smoking, BMI, ancestry, diabetes, 246 blood pressure, and LDL cholesterol) was 0.199. For each cardiovascular outcome and mortality outcome, case-247 cohort analyses were performed using weighted proportional hazard model and used Self and Prentice weights. 248 PROC MIANLYZE was used to pool the estimates to account for the variability introduced by imputations. The association measure was presented as a hazard ratio per 1 standard deviation (SD) unit increase in the marker, 249 association measure was presented as a hazard ratio per 1 standard deviation (SD) unit increase in the marker,
250 adjusted for the following: age, sex, smoking, BMI, systolic blood pressure, non-HDL cholesterol, and g 250 adjusted for the following: age, sex, smoking, BMI, systolic blood pressure, non-HDL cholesterol, and geographic 251 ancestry. Each outcome was also adjusted for diabetes status, however, in the diabetes analysis, individuals with 252 confirmed diabetes status were excluded. We assess the proportionality assumption using Schoenfeld Residual plots 253 over time. Final effect estimates of ACE2 relationship with outcomes are presented with sex, non-HDL cholesterol 254 and BMI as time dependent covariates to the model as these covariates violates the assumption. 255

256 Variable Ranking:

- Predictors were ranked on the basis of a likelihood ratio chi square statistic. Variable rankings were performed on
- the first imputed dataset generated. We began by fitting the full model. In this, the full model was fit and compared
- to the model without each variable. For example, the full model was compared to the same model without non-HDL
- cholesterol in order to obtain a chi-square statistic. Subsequently, the full model was compared to the model without
- 261 sex. This was done iteratively for each variable.

Ethical Considerations

 All Centers are required to obtain approval from their respective ethics committees (Institutional Review Boards). All subjects' data are confidential and only authorized individuals will have access to study related documents at study Centers. Subjects' identification will be protected for documents (e.g. CRF) transmitted to the Coordinating Office, as well as biomarker and genetic data. Informed consent to obtain the baseline information, to collect and store the genetic and other biological specimens was obtained from all individuals.

ACE2 Assay Validation

270 Plasma ACE2 levels were measured by proximity extension assay using the Olink Proseek Cardiovascular II96×96

(CVDII) reagent kit (Olink, Uppsala, Sweden), which enable the analysis of 92 CVD-related proteins across 96

individual samples simultaneously. Analytical performance of this panel has been previously validated and can be

found elsewhere (https://www.olink.com/products/cvd-ii-panel/). Briefly, coefficient of variation (CV) of the ACE2

- assay calculated from linearized NPX values over the limit of detection, is of 8% for the intra-assay (within-run) precision, and of 11% for the inter-assay (between-run) precision. Intra-assay CV <10% and inter-assay CV <15% are
- considered as optimal (PMID: 12414755). The validated analytical range for ACE2 is from 15·26pg/mL to
- 62·5ng/mL.

ACE2 Data Quality Controls

279 Quality controls of biomarker data generated through the CVDII panel, including ACE2, were evaluated in four steps. First, biomarkers were pre-processed using the NPX Manager, a built-in Olink software for quality control. Participant samples were spiked with 4 internal quality controls, including 2 incubation controls, 1 extension control, and 1 amplification/detection control that monitored assay performance. 3 external controls, including an inter-plate control, a negative control, and a pool plasma sample were also included in each plate to monitor for inter- and intra-plate 284 precision. Samples with at least one internal control that deviated more than ± 0.3 NPX units from the plate median were flagged and excluded from further analyses. Overall, 649 samples were excluded with a pass quality control rate of 94·8% for this panel. An additional 611 samples (5%) were also identified to have ACE2 levels below the lower limit of quantification (ie. 15·26pg/mL for ACE2). These samples were flagged but retained in following analyses. Second, inter-plate normalization was performed to minimize technical sources of variation between plates. This was achieved by calculating the plate-specific median and overall lot median across all samples. Biomarker levels were subsequently centralized to the overall lot median by taking the difference between the measured biomarker level and

- the plate-specific median and adding it to the overall median.
- Third, the distribution of ACE2 was scrutinized as follows. The shape of the distribution was quantified using
- 293 skewness and kurtosis metrics. Next, the modality of the distribution was assessed using the Hartigan dip test.⁷
- Differences in the mean, median, and distribution of levels between sex, ethnic group, and reagent lot were
- 295 examined. It should be noted that the participant cohort was analyzed using two different reagent lots. As such,
296 quantile normalization was applied to each reagent lot separately and later combined to minimize pote
- 296 quantile normalization was applied to each reagent lot separately and later combined to minimize potential batch
297 effects. Olink provides data on the sensitivity of individual biomarker assays in the CVDII panel to effects. Olink provides data on the sensitivity of individual biomarker assays in the CVDII panel to contamination
- by plasma or serum hemolysate. We defined a biomarker to be hemolysis-sensitive if assay performance was

299 affected by 5mg/mL or less of haemolysate. ACE2 is not a haemolysis-sensitive biomarker. The mean, median, and
300 distribution of ACE2 was then re-assessed to evaluate quality control performance. distribution of ACE2 was then re-assessed to evaluate quality control performance.

Genetic Analysis

- Genotyping on the Thermofisher Axiom Precision Medicine Research Array (r.3) was attempted for 11,683 PURE
- study participants consenting to research with suitable DNA quantities. 96-plex plates were scanned on the
- GeneTitan instrument, each including 95 PURE samples and a universal control sample shared across all study
- plates. Genotype calling was performed according to manufacturer's best practices using a combination of *Axiom*
- *Power Tools* and in-house scripts. Genotype calling was performed in three separate batches of approximately equal
- size (n1=3,778; n2=3,862; n3=3,781) grouping samples by the order in which plates were processed. As per
- manufacturer recommendations, samples were removed if they had low signal-to-noise contrast (Dish Quality
- 311 Control < 0.82) or low quality control call rate (OCCR < 0.97).

Genotyping Quality Control

- Additional quality control procedures were implemented using PLINK, R, GCTA, and KING softwares with in-
- 314 house scripts. Sample-level quality control checks included assessments of sample completeness (call rate > 0.95),
- potential sample mix-ups (discrepancies between reported vs. genetically determined sex and/or ethnicity), genetic
- duplicates, and sample contamination (excess heterozygosity). Genetically determined ancestry for PURE
- participants was derived via principal component analysis of directly genotyped common variants alongside a
- reference set of ancestrally diverse samples (1000Genomes). The top four principal components were plotted to
- assess clustering of genetic ancestry with self-reported ancestry. Samples exhibiting non-ambiguous discrepancies
- between genetic and self-reported ancestry were removed. Variant-level quality control checks included assessments of variant completeness (call rate > 0·985), plate and batch effects, non-Mendelian segregation within families
- (Mendelian errors), Hardy Weinberg Equilibrium deviations (HWE P-value < 1x10-5), and variant frequency (minor
- 323 allele frequency > 0). After sample and variant quality control procedures, 11,112 samples and 749,783 variants
- 324 remained. The average genotyping call rate among passing samples was 0.996535.

Imputation Quality Control

- For phasing and imputation of genotypes, the 749,783 directly genotyped variants in 11,1112 samples were
- uploaded to a cloud imputation server hosted by the Sanger Wellcome Trust Institute
- (https://imputation.sanger.ac.uk/). Genotypes were phased using EAGLE2 and then imputed using PBWT for
- 95,270,199 variants on the 1000Genomes and UK10K combined reference panel. Quality control of imputed
- 330 genotypes included removal of variants with: (i) poor imputation quality (INFO<0·30), (ii) violations of Hardy
- Weinberg equilibrium (P<1x10-5), and (ii) low allele frequency (MAF<0·01). After quality control of imputed
- genotypes, 2 variants remained. 10,480 (94%) out of the 11,112 samples passing genotyped QC also had passing
- ACE2 measurements, which were used for all subsequent genetic analyses.

Mendelian Randomization Analyses

- Mendelian Randomization analysis is conventionally applied to assess causal effects of circulating biomarkers on
- disease outcomes with the intent of identifying causal mediators of disease that may represent effective therapeutic
- targets ("forward Mendelian Randomization"), but extensions such as "reverse Mendelian Randomization" may
- 338 allow for more specific and sensitive diagnostic biomarkers for disease.⁸ We extend this framework to
- understanding how antecedents of cardiovascular disease may causally affect circulating ACE2 levels. We
- conducted Mendelian Randomization analyses for the subset of modifiable clinical risk factors associated with

 ACE2 levels in the cross-sectional PURE analyses, specifically: body mass index, systolic blood pressure, diabetes status, smoking status.

Genetic Variant Selection

344 Common genetic variants (minor allele frequency > 0.01) that were strongly associated with clinical risk factors

(P<5x10-8) in large European genome-wide association studies were selected as proxies for clinical risk factors.

346 Genetic variants associated with body mass index were derived from Yengo *et al.* $(N \sim 700,000)^9$; systolic blood 347 pressure were derived within the UKBiobank study (N~400,000)¹⁰, diabetes status derived from Mahajan *et al.*

(N=1,232,901)¹¹ and smoking initiation status were derived from Liu *et al* (N=1,232,091).¹² Beta coefficients (or

- log(odds) for discrete risk factors) and standard errors were extracted for each variant.
- *Harmonization of External Genetic Datasets with PURE*

The impact of the pre-selected variants on circulating ACE2 levels was ascertained through a genome-wide

association study within a subset of 8699 PURE participants. To mitigate the confounding effect of ethnicity on

genetic variation, genetic analyses were restricted to PURE participants of self-reported Latin (n=4058), European

(n=3372), or Persian (n=1269) ancestry. African (n=659), South Asian (n=604), East Asian (n=314), and Arab

(n=204) participants were excluded from the present analyses because harmonization of PURE with external genetic

datasets, which are primarily comprised of European individuals presently, necessitated exclusion of non-European

groups. Self-identified Latin and Persian individuals were included in the present genetic analyses because these

groups genetically overlap with Europeans. Furthermore, to gauge the transferability of genetically predicted risk

factors across these ethnic groups in PURE, we demonstrate similarly strong predictions across European, Latin, and

Persian subgroups with a polygenic risk score derived using European weights (Supplementary Table 5).

 Pre-selected genetic variants were cross-referenced against the PURE variant set, and matching variants shared between PURE and the external dataset were retained. To account for correlation between genetic variants, variants

were first prioritized based on statistical significance and then proximal SNPs correlated with the index variant at (r2

 $364 \rightarrow 0.01$ in 1000Genomes Europeans) were iteratively removed to generate an independent set of genetic variants.

This process was repeated separately for each clinical risk factor to maximize retention of suitable genetic

instruments.

For the remaining independent set of genetic variants present in both external and internal genetic datasets, we

conducted genetic association testing within PURE to derive their corresponding effects on plasma ACE2 levels (i.e.

outcome betas). The GCTA mixed linear model association with leave-one-chromosome-out method was used

assuming an additive model. Covariates included age, sex, recruitment centre, season in which the blood specimen

was collected, blood specimen storage time, OLINK processing batch, genotype calling batch, and 10 intra-ethnic

genetic principal components. GWAS were conducted separately for European (n=3372), Latin (n=4058), and

- Persian (n=1269) participants and then combined via inverse-variance-weighted fixed effects meta-analysis with the
- METAL software.

Mendelian Randomization Framework

Two-sample Mendelian Randomization analyses were conducted wherein the effects of genetic variants on the

exposure (i.e. clinical risk factors from external datasets) were obtained from independent datasets from outcome

effects (i.e. circulating ACE2 levels within PURE). All MR testing was conducted in R using the TwoSampleMR

package (v.0·5·2). Several complementary MR methods were employed including: Inverse Variance Weighted

(IVW), Median Weighted, and MR-EGGER regression methods. The IVW method has the greatest statistical power

but also makes the most assumptions. Accordingly, MR effect estimates were reported from the IVW model in the

- main manuscript only when there were no signs of pleiotropic confounding (horizontal, directional or idiosyncratic).
- Potential for pleiotropic confounding, whereby an instrument influences the outcome via a mechanism beyond the
- exposure's mediating effect, was detected using the Cochran's Q and MR-PRESSO tests for global heterogeneity
- and the EGGER intercept test for directional pleiotropy. The impact of outlying variants (idiosyncratic pleiotropy) on distorting the overall causal effect estimate was evaluated by inspection of leave-one-out-analyses plots and MR-
- PRESSO. MR-PRESSO testing was run using 1000 simulations; outliers detected by MR-PRESSO were removed
- and the causal effects were re-estimated without outliers using the aforementioned MR methods. If significant global
- heterogeneity persisted after outlier removal, the median weighted MR estimate was reported; if directional
- pleiotropy persisted, the EGGER-regression MR estimate was reported. To facilitate comparison with
- epidemiological effect estimates, MR effect estimates were scaled to the same units when possible (i.e. body mass
- 392 index: per 5 kg/m2 increase; systolic blood pressure: per 10 mm Hg increase; diabetes and smoking status: mean
- difference between cases and controls).
- *Impact of Common Antihypertensive Drugs on Circulating ACE2*
- We also applied the same Mendelian Randomization framework to assess the effects of common blood pressure-

lowering medications on circulating ACE2 levels. Genetic variants approximating the effects of antihypertensive

397 medication were selected according to previously derived instruments.^{13,14} Specifically, genetic variants (i) were

located proximally to the genes encoding the therapeutic protein targets and (ii) demonstrated association with

- circulating protein levels (ACE) and/or blood pressure (ACE/CCB/BB). MR effect estimates were scaled to a 10
- mmHg reduction in systolic blood pressure for CCB and BB; for ACE inhibitors, results were expressed per 1 SD decrease in circulating ACE levels.
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Sensitivity Analyses

 We conducted a series of sensitivity analyses to assess the robustness of MR results. First, to more sensitively identify potential pleiotropic SNPs, we searched phenoscanner for genome-wide significant variants laying outside 405 the intended causal pathway and then repeated MR analyses excluding such variants. Second, we excluded cases with cardiovascular disease or diabetes (N=5234) at baseline and reperformed association testing of genetic 407 instruments on circulating ACE2 levels in this disease-free subcohort (N=3465). Third, we conducted MR analyses using a more stringent pairwise r2 threshold of 0·001 as opposed to 0·01. Fourth, we conducted MR analyses using ethnicity-specific effects on ACE2 levels to evaluate consistency of MR effect estimates across ethnic groups or conversely population-specific effects.

- 412 Supplementary Appendix 2: Additional Results -- Supplementary Tables
- 413 **Supplementary Table 1:** Subgroup Analysis to Assess Heterogeneity of Effect of ACE2 on Cardiovascular
- 414 Outcomes*
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 *An exploratory analysis was carried out examining possible heterogenous effect across subgroups as it relates to the cardiovascular outcomes (defined by fatal and non-fatal myocardial infarction, stroke, heart failure, or another fatal cardiovascular disease). In order to account for multiple hypothesis testing, a subgroup required a p-value of 0·05/5 = 0·01 to account for the 5 interaction tests being carried out. Models are adjusted for age, sex, geographic

421 ancestry, smoking, diabetes, body mass index, systolic blood pressure, and non-HDL cholesterol excluding the

422 subgroup variable from the model.

424 **Supplementary Table 2:** Comparisons of the associations of ACE 2 and other common continuous risk factors

425 using minimally Adjusted Standardized Coefficients (per SD)

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428 *Coefficients are hazard ratios per 1 standard deviation increase. Each coefficient presented is minimally adjusted

429 (for age, sex, ancestry). For example, the HR presented for ACE2 is adjusted for age, sex, and ancestry only. The

430 HR presented for blood pressure is adjusted for age, sex, and ancestry only. Continuous risk factors were selected in

431 order to place all variables on a common interpretable scale (per 1 SD) increase. In all mortality related outcomes,

432 ACE2 had the strongest association with the outcome. These results align with the order of our variable ranking

433 plots presented in the main paper.

436 **Supplementary Table 3:** Split Sample Estimation of ACE2 Relationship With Cardiovascular Outcomes and

- 437 Mortality
- 438

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440 We performed a random split estimation of the independent non-overlapping samples. We find that our

441 associations remain consistent and significant across the data splits, with the exception of heart failure whose

442 effect loses statistical significance likely due to the smaller number of heart failure events in the study.

444 **Supplementary Table 4:** Impact of Cardiovascular Disease Adjustment on Risk Factor and Demographic

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447 We performed the cross-sectional multivariable regression analysis of ACE2 determinants and found no change in effects after controlling for cardiovascular disease status.

effects after controlling for cardiovascular disease status.

450 **Supplementary Table 5:** Impact of Variable Ranking Metric on ACE2 Rank

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453 We performed additional analyses for ranking ACE2 on the basis of the absolute magnitude of the Chi-square
454 statistic. Different ranking metrics yielded the same results as it related to the relative rank of ACE2 co statistic. Different ranking metrics yielded the same results as it related to the relative rank of ACE2 compared to 455 clinical risk factors.

457 **Supplementary Table 6:** Results of Mendelian Randomization Analyses of Clinical Risk Factors vs. circulating 457
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ACE2 levels.

461 Bolded font indicates the MR method selected for each trait considering the potential presence of heterogeneity or 462 directional pleiotropy.

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464 * In the original MR analysis of LDL cholesterol, MR-PRESSO detected four SNP outliers (rs2642438, rs1169288, 465 rs492602, rs2954029), which led to significant heterogeneity (Cochran Q and MR-PRESSO P-values < 0·001). 466 While attenuated after removal, significant heterogeneity persisted (Cochran Q and MR-PRESSO P-values < 0·001).

467 **In the original MR analysis of T2D, MR-PRESSO detected two SNP outliers (rs61946386; rs56348580) which

468 led to significant heterogeneity (Cochran Q and MR-PRESSO P-values < 0·001). Information presented in the table

469 reflects MR results after outlier removal.

472 **Supplementary Table 7**: Results of Mendelian Randomization Analyses of Antihypertensive Agents vs. circulating ACE2 levels.

474 Bolded font indicates the MR method selected for each trait considering the potential presence of heterogeneity or

475 directional pleiotropy. Results for the ACE inhibitor analysis are expressed per 1 SD decrease in circulating ACE2

476 levels. Results are expressed per 10 mmHg decrease in systolic blood pressure except for ACE inhibitor analysis

477 which is expressed per 1 SD decrease in serum ACE concentration.

- 479 **Supplementary Table 8:** Association of European polygenic scores in PURE participants of European (n=3372),
- Latin (n=4058), and Persian (n=1269) ethnicity

- 481 Effects are expressed as change in the trait per 1 standard deviation increase in the exposure PRS.
- *Systolic Blood Pressure adjusted for medication use (+15mmHg) as per Evangelou *et al*⁵ 482 *.*
- 483 **** Calculated using Nagelerke's R2

- Supplementary Appendix 3: Additional Results Supplementary Figures
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 Supplementary Figure 1: Difference in plasma ACE2 by blood pressure medication (Cross-sectional phenotypic analysis)

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Supplementary Figure 1: The plot presents the adjusted coefficients (mutually adjusted for each other as well as age,

- sex, blood pressure, diabetes, smoking, diabetes, ancestry, and LDL cholesterol) for blood pressure medication on plasma ACE2 levels.
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495 Supplementary Figure 2: Difference in plasma ACE2 concentration by ancestry

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497 Supplemental Figure 2: Using European levels as the reference group, these adjusted coefficient plots show how

498 each ancestral group varies with respect to ACE2 concentration. Estimates are adjusted for age, sex, blood pressure,

499 LDL-c, BMI, smoking, and diabetes.

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505 Supplementary Figure 3: Kaplan-Meier of total mortality assessed in the randomly sampled sub-cohort. ACE2 506 concentration was split in three tertiles. The dashed lines indicate participants who were censored. The red curve 507 corresponds to the lowest plasma ACE2 concentration level (the lowest tertile, n=1695; 50 death events), the green 508 curve corresponds to intermediate levels of ACE2 concentration (the middle tertile, n=1694; 86 death events), and 509 the blue curve corresponds to the highest plasma ACE2 concentration (the highest tertile, n=1695; 152 death 510 events). Individuals with higher concentrations of ACE2 had a higher rate of death relative to those with lower 511 concentrations of ACE2 (log rank p-value < 0.0001). $\frac{1}{\sqrt{2}}$ ditanty asse

Supplementary Figure 4: Comparison of MR estimates for clinical risk factors vs. ACE2 levels using the full PURE dataset (n=8699) vs. a healthy subset (members of the random subcohort with no history of CVD or diat (PURE dataset (n=8699) vs. a healthy subset (members of the random subcohort with no history of CVD or diabetes) $(n=3465)$

Supplementary Figure 6: Manhattan Plot for the GWAS Meta-analysis of ACE2.

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Average ACE2 Concentration by Country in PURE Biomarker Study

540 Supplementary Figure 8: We perform a variable ranking procedure (on the basis of a likelihood ratio chi-square) in 541 1000 bootstrap generated datasets. The number in each box corresponds to the proportion of times (o 541 1000 bootstrap generated datasets. The number in each box corresponds to the proportion of times (out of 1000) that particular variable ended up in that rank. As it relates to ACE2, ACE2 was the strongest relative pred particular variable ended up in that rank. As it relates to ACE2, ACE2 was the strongest relative predictor in 555 of 543 the bootstrapped datasets (0·555 was rounded up to 0·56), second strongest in 288, and third strongest in 157
544 datasets. However, this provides sufficient reason for us to see the importance of those top 3 variable 544 datasets. However, this provides sufficient reason for us to see the importance of those top 3 variables (ACE2, smoking, and diabetes) relative to the bottom 3 (BMI, SBP, and Cholesterol) as none of the bottom 3 variab smoking, and diabetes) relative to the bottom 3 (BMI, SBP, and Cholesterol) as none of the bottom 3 variables emerge as a top variable in any of the 1000 datasets. This shows a clear hierarchy of importance as it relates to 547 overall mortality in our group of patients and that ACE2 has a strong relationship with mortality relative to
548 commonly measured risk factors. These ranking distributions were consistent when using the Wald chi squa commonly measured risk factors. These ranking distributions were consistent when using the Wald chi square statistics as the basis of ranking (for both analyses using Self-Prentice and Lin Ying derived Wald statistics).

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