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Israr, Muhammad Zubair; Zhan, Hong; Salzano, Andrea; Voors, Adriaan A.; Cleland, John G.; Anker, Stefan D.

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1 **Full title:** Surrogate markers of gut dysfunction are related to heart failure severity and
2 outcome – from the BIOSTAT-CHF consortium

3 **Short title:** Gut dysfunction, severity and outcomes in heart failure

4
5 Muhammad Zubair Israr ^{*1}, Hong Zhan ^{*2}, Andrea Salzano ^{*3}, Adriaan A Voors ⁴,
6 John G Cleland ⁵, Stefan D Anker ⁶, Marco Metra ⁷, Dirk J van Veldhuisen ⁴, Chim C Lang ⁸,
7 Faiez Zannad ⁹, Nilesh J Samani ¹, Leong L Ng ¹, Toru Suzuki ^{1,10};
8 on behalf of the BIOSTAT-CHF investigators (full author list as appendix)

9 * contributed equally to this manuscript

1 **Affiliations**

2 ¹ Department of Cardiovascular Sciences, University of Leicester and NIHR Leicester
3 Biomedical Research Centre, Leicester, UK

4 ² Tellgen Corporation, Shanghai, China

5 ³ IRCCS SDN, Diagnostic and Nuclear Research Institute, Naples, Italy

6 ⁴ University of Groningen, University Medical Center Groningen, Department of Cardiology,
7 Groningen, The Netherlands

8 ⁵ Robertson Centre for Biostatistics, Institute of Health and Wellbeing, University of
9 Glasgow, Glasgow and National Heart & Lung Institute, Imperial College, London, UK

10 ⁶ Department of Cardiology (CVK); and Berlin Institute of Health Center for Regenerative
11 Therapies (BCRT); German Centre for Cardiovascular Research (DZHK) partner site Berlin;
12 Charité Universitätsmedizin Berlin, Germany

13 ⁷ Institute of Cardiology, Department of Medical and Surgical Specialties, Radiological
14 Sciences and Public Health, University of Brescia, Brescia, Italy

15 ⁸ School of Medicine Centre for Cardiovascular and Lung Biology, Division of Medical
16 Sciences, University of Dundee, Ninewells Hospital & Medical School, Dundee, UK

17 ⁹ Inserm CIC 1433, Université de Lorraine, CHU de Nancy, Nancy, France

18 ¹⁰ The Institute of Medical Science, The University of Tokyo, Tokyo, Japan

19

20 **Address for Correspondence:**

21 Prof Toru Suzuki

22 University of Leicester and NIHR Leicester Cardiovascular Biomedical Research Centre
23 Glenfield Hospital, Leicester, LE3 9QP, UK

24 Email: ts263@le.ac.uk Tel: (0044) 116 204 4741

25

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1 **ABSTRACT**

2 **Background:** The contribution of gut dysfunction to heart failure (HF) pathophysiology is
3 not routinely assessed. We sought to investigate whether biomarkers of gut dysfunction
4 would be useful in assessment of HF (e.g., severity, adverse outcomes) and risk stratification.

5 **Methods:** A panel of gut-related biomarkers including metabolites of the choline/carnitine-
6 pathway [acetyl-L-carnitine, betaine, choline, γ -butyrobetaine, L-carnitine and
7 trimethylamine-N-oxide (TMAO)] and the gut peptide, Trefoil Factor-3 (TFF-3), were
8 investigated in 1,783 patients with worsening HF enrolled in the systems BIOlogy Study to
9 Tailored Treatment in Chronic Heart Failure (BIOSTAT-CHF) cohort and associations with
10 HF severity and outcomes, and use in risk stratification were assessed.

11 **Results:** Metabolites of the carnitine-TMAO pathway (acetyl-L-carnitine, γ -butyrobetaine, L-
12 carnitine and TMAO) and TFF-3 were associated with the composite outcome of HF
13 hospitalisation or all-cause mortality at 3 years [HR 2.04-2.93 (95% CI 1.30-4.71) $p \leq 0.002$].
14 Combining the carnitine-TMAO metabolites with TFF-3, as a gut dysfunction panel, showed
15 a graded association; a greater number of elevated markers was associated with higher New
16 York Heart Association class ($p < 0.001$), higher plasma concentrations of B-type natriuretic
17 peptide ($p < 0.001$), and worse outcome [HR 1.90-4.58 (95% CI 1.19-6.74) $p \leq 0.008$]. Addition
18 of gut dysfunction biomarkers to the contemporary BIOSTAT HF risk model also improved
19 prediction for the aforementioned composite outcome [C-statistics $p \leq 0.011$, NRI 13.5-21.1
20 (95% CI 2.7-31.9) $p \leq 0.014$].

21 **Conclusions:** A panel of biomarkers of gut dysfunction showed graded association with
22 severity of HF and adverse outcomes. Biomarkers as surrogate markers are potentially useful
23 for assessment of gut dysfunction to HF pathophysiology and in risk stratification.

24

1 INTRODUCTION

2 Heart failure (HF) pathophysiology involves complex regulation by multiple systemic
3 conditions (i.e. neuroendocrine activation, metabolic impairment, iron deficiency/anemia,
4 etc.)¹ compounded on to cardiac dysfunction. However, the contribution of gut dysfunction
5 to HF pathophysiology is not routinely assessed. Bowel perfusion, gut permeability², and the
6 gastro-intestinal (GI) microbiome³ contribute to HF pathophysiology, and their assessment
7 may aid in better understanding disease severity and adverse outcomes⁴. We sought to
8 investigate whether biomarkers as surrogate markers of gut dysfunction would be useful to
9 assess contribution of gut dysfunction to HF pathophysiology (e.g., severity, adverse
10 outcomes) and risk stratification.

11 Gut-derived metabolites of the carnitine/choline metabolic pathway, reflecting
12 alterations of the gut microbial flora, have recently been shown to exert toxic effects on the
13 heart and blood vessels⁵, and promote inflammation⁶ that contributes to HF severity⁷ and
14 adverse outcomes in acute^{8,9} and chronic¹⁰⁻¹³ HF. This metabolic pathway of choline/carnitine
15 links cardiovascular disease risk and the Western diet which is rich in red meat and eggs¹⁴⁻¹⁶.
16 While there has been increasing interest in a pivotal molecule of this pathway, trimethylamine-
17 N-oxide (TMAO), TMAO is only one component of a complex metabolic pathway and is
18 generated from two pathways; 1) betaine -> choline -> TMAO and 2) acetyl-L-carnitine/ γ -
19 butyrobetaine -> carnitine -> TMAO¹⁷. Recent evidence suggests that multiple metabolites of
20 the choline/carnitine-TMAO pathway also contribute to outcomes of HF¹⁴. A more
21 comprehensive panel of gut-related metabolites might therefore provide further insight.

22 In addition, a peptide biomarker of gut dysfunction, Trefoil Factor-3 (TFF-3), is part of
23 a family of peptides expressed in mucous membranes¹⁸, including the GI tract, and involved

1 in repair and protection of epithelial surfaces ^{18,19}. TFF-3 has been shown to predict the risk of
2 cardiovascular events outcome in HF ²⁰, and might add value to gut-derived metabolites.

3 This report investigates the association of a panel of biomarkers as surrogate markers
4 of gut dysfunction with HF pathophysiology (e.g., severity, adverse outcomes) and identifies a
5 graded association that is potentially useful for risk stratification of the condition.

1 **METHODS**

2 Study Population

3 The BIOlogy Study to TAilored Treatment in Chronic Heart Failure (BIOSTAT-CHF)
4 study was a multicentre, prospective, observational study that enrolled patients in 69 centres
5 from 12 European countries that was designed to characterise biological pathways related to
6 response to HF guideline recommended therapy²¹. Patients were enrolled between 2010-2014
7 with progressive worsening or new-onset symptoms of HF, confirmed by either left ventricular
8 EF of $\leq 40\%$ or B-type natriuretic peptide (BNP) and/or NT-proBNP plasma concentrations
9 $>400\text{pg/ml}$ or $>2000\text{pg/ml}$, respectively. All patients had to require a dose of furosemide
10 $\geq 40\text{ mg/day}$ or equivalent for the control of congestion and received $\leq 50\%$ of target doses of
11 angiotensin-converting enzyme inhibitors or angiotensin II receptors (ACEi/ARBs) and beta-
12 blockers at enrolment. Informed consent was obtained from each patient. This study was
13 approved by the local ethics committee and adhered to the Declaration of Helsinki.

14 The primary outcomes were all-cause mortality and a composite of mortality with
15 rehospitalisation due to HF (mortality/HF) at 3 years from enrolment.

16 Biomarker measurements

17 Plasma was aliquoted and stored at -80°C until analysis. At the time of analysis,
18 samples were thawed at room temperature, prepared and analysed immediately. One-thousand
19 seven hundred and eighty-three ($n=1783$) patients had available baseline plasma samples and
20 were therefore used in this study.

21 The gut microbiome-related metabolites, of the choline (choline and betaine), and
22 carnitine (acetyl-L-carnitine, γ -butyrobetaine, L-carnitine) metabolic pathway of TMAO were
23 extracted from plasma using stable-isotope dilution and analysed by ultra-performance liquid

1 chromatography-tandem mass spectrometry (UPLC-MS/MS), using a recently developed
2 method with amendments followed by validation (see Supplementary Material for amended
3 method) ²².

4 TFF-3 levels were measured using a high-throughput technique using the Olink Proseek
5 Multiplex Cardiovascular (CVD) III96x96 kit (Olink Proteomics, Uppsala, Sweden) ²³.
6 Normalised protein expression (NPX) values were converted to the linear scale for use in this
7 study (i.e., NPX values can be converted into linear scale: $2^{\text{NPX}} = \text{linear NPX}$).

8 All other clinical biomarker measurements were done at a local hospital site or within
9 the BIOSTAT-CHF central laboratory. BNP was measured using Luminex multiplexed bead-
10 based immunoassays (Alere, San Diego, CA, USA) ²¹.

11 Statistical analyses

12 Analyses used a non-imputed BIOSTAT-CHF database as described elsewhere ^{11,24,25}.
13 Association with outcomes was performed using Cox proportional hazards regression analyses.
14 Outcome prediction accuracies were assessed by calculating the area under the curve (AUC)
15 for the receiver operator characteristics (ROC) curve analysis and using net reclassification
16 index (NRI) for the markers across end-points, after adjustment for the compact and extended
17 risk models made from previously defined BIOSTAT-CHF models ²⁶. Kaplan-Meier survival
18 curves were generated to demonstrate cumulative incidences of events for tertile groupings of
19 gut dysfunction markers with the Mantel-Cox log rank tests used to report the significance of
20 stratification. Kaplan-Meier survival analyses were conducted using graded response of gut
21 dysfunction markers (i.e., the number of elevated metabolites above the median concentration
22 for each particular metabolite).

23 Statistical analyses were performed using IBM SPSS Statistics (V26, IBM Corp.,
24 Armonk, New York, USA). A p-value <0.05 was considered statistically significant.

1 RESULTS

2 Study population

3 From the total BIOSTAT cohort (n=2,516), baseline acetyl-L-carnitine, betaine,
4 choline, γ -butyrobetaine, L-carnitine, TMAO and TFF-3 were analysed in 1,783 patients (71%)
5 based on the availability of adequate volume of sample. Baseline demographics are shown in
6 Table 1. Most patients were men (74%) with a median age of 70 years and in New York Heart
7 Association (NYHA) class III-IV (62%).

8 Association of gut markers with adverse outcomes of HF

9 Measured gut biomarkers were all associated with mortality and the composite outcome
10 (HF hospitalisation or death) at 3 years on univariate analysis ($p < 0.001$), with the exception of
11 betaine (Table 2). A logistic risk prediction model (backward) showed that for death that acetyl-
12 L-carnitine, TMAO and TFF-3 remained in the final model ($p \leq 0.006$), whereas for death/HF
13 hospitalization that the carnitine metabolites (acetyl-L-carnitine, L-carnitine and γ -
14 butyrobetaine) remained alongside TFF-3 (Supplementary Table 1) but not the choline pathway
15 metabolites (choline, betaine). Based on this, the carnitine pathway metabolites (acetyl-L-
16 carnitine, L-carnitine and γ -butyrobetaine), TMAO and TFF-3 were combined using logistic
17 regression to develop a composite variable to assess their association with the composite
18 outcome of HF hospitalisation or death at 3 years. On univariate analysis, the hazard ratio of
19 the gut dysfunction panel was >5-fold higher than for individual markers [HR 16.67-27.79
20 (95% CI 10.84-46.15) $p < 0.001$] (Table 2).

21 Kaplan-Meier survival analysis was conducted by splitting the variable into tertiles.
22 Results showed that elevated plasma concentrations of both individual and the panel of markers
23 was associated with poor survival ($p < 0.001$) (Supplementary Figures 1 & 2).

24

1 Association of graded/combined contribution of gut dysfunction markers to adverse outcomes

2 Kaplan-Meier survival analysis showed that patients with ≤ 1 marker elevated had the
3 best prognosis and a graded relationship for 2, 3, 4 and 5 elevated markers, with those who had
4 increases in all five metabolites having the worst outcome (Figure 1). Patients with only one
5 elevated metabolite did not show any significant differences compared to the reference group
6 ($p \geq 0.582$) (Figure 2). The number of increased biomarkers of gut dysfunction was also
7 associated with worse NYHA class (chi-square $p < 0.001$) and higher plasma concentrations of
8 BNP ($p < 0.001$) (Supplementary Figures 3A and B).

9 Patient demographics with respect to the groupings of elevated gut markers showed that
10 patients with an increasing number of elevated markers were likely to be older, ischaemic
11 aetiology, COPD and had previous HF hospitalisation ($p \leq 0.003$). They were also likely to have
12 reduced diastolic BP, heart rate, haemoglobin, eGFR and sodium levels ($p \leq 0.034$) (Table 1).

13 Risk stratification using gut dysfunction markers with BNP

14 A biomarker risk score was constructed using the six biomarkers of BNP, TFF-3,
15 acetyl-L-carnitine, γ -butyrobetaine, L-carnitine and TMAO, with each independent predictor
16 assigned a value of 1 or 0 based on elevated levels above or below the median. Based on this,
17 the BIOSTAT-CHF cohort attained an average risk prediction score of 2.99 points (Figure 3A).
18 Logistic regression showed an association between biomarker score and the composite
19 outcome at 3 years ($p \leq 0.018$), and the odds ratio increased progressively from an odds ratio of
20 2 for one biomarker to >10 when using all six biomarkers (Figure 3B).

21 Revised BIOSTAT risk prediction models with inclusion of gut dysfunction

22 Carnitine pathway metabolites (acetyl-L-carnitine, γ -butyrobetaine, L-carnitine),
23 TMAO and TFF-3 showed associations after adjustment for the BIOSTAT compact and
24 extended models ²⁶ for mortality [HR 1.46-3.76 (95% CI 1.13-6.63) $p \leq 0.018$], with the

1 carnitine pathway metabolites and TFF-3 also associated with the composite outcome [HR
2 1.97-2.91 (95% CI 1.36-4.73) $p \leq 0.001$] (Table 2).

3 When adjusted for the compact and extended BIOSTAT models, the hazard ratios for
4 the gut dysfunction model (carnitine pathway metabolites + TMAO + TFF-3) were greater than
5 2-fold higher than individual metabolites for death [HR 6.18-7.27 (95% CI 3.02-14.46)
6 $p < 0.001$] or the composite outcome [HR 4.28-4.90 (95% CI 2.22-8.50) $p < 0.001$] (Table 2),
7 resulting in improved C-statistics ($p \leq 0.044$). NRI analysis demonstrated total overall
8 improvement for the gut dysfunction model when added to the compact and extended models
9 for both mortality and the composite outcome at 3 years ($p \leq 0.014$) (Table 3).

1 **DISCUSSION**

2 The present study investigated whether biomarkers as surrogate markers of gut dysfunction
3 could be used to assess contribution to HF pathophysiology and risk stratification. A panel of
4 biomarkers including gut-derived metabolites of carnitine metabolism and the peptide
5 biomarker, Trefoil Factor-3 (TFF-3), when used in combination showed a graded association
6 with heart failure severity and worsening outcomes, and an additive role in risk stratification.
7 Biomarker-based assessment of contribution of gut dysfunction to HF pathophysiology is a
8 potentially promising method to allow routine assessment of this under-appreciated
9 contribution of gut dysfunction to HF pathophysiology and risk stratification.

10 Pathophysiological implications of the gut-heart axis

11 There is increasing evidence of a ‘gut-heart axis’ in HF ^{7,15,16}. Systemic congestion and
12 reduced cardiac output can trigger intestinal mucosal ischaemia/oedema and impaired barrier
13 function resulting in increased bacterial translocation, with an increase in blood endotoxins
14 contributing to the inflammatory responses seen in HF ^{2,7}. The microbiota is an important
15 protective factor of the gut against disease with regards to bacterial translocation and products
16 that affect the gut environment, while its perturbation affects the mucosal community which
17 contributes to HF pathogenesis ²⁷. Alterations in the gut microbiota makes the gut susceptible
18 to the growth of anaerobic bacteria ²⁸ which affects the permeability to metabolites produced
19 in the gut and subsequently on the functional and structural integrity of the mucosal barrier
20 ^{8,12,15,22}.

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1 Surrogate markers of gut dysfunction in HF assessment

2 The present study investigated whether biomarkers as surrogate markers of gut
3 dysfunction would be useful to assess contribution to HF pathophysiology (e.g., severity,
4 adverse outcomes) and risk stratification.

5 Recent investigations have identified the role of gut-derived metabolites of the
6 choline/carnitine pathway to HF pathophysiology ²². Association of one of the metabolites of
7 this pathway, TMAO, has received attention in HF pathophysiology and risk stratification
8 ^{8,10,15}. Circulating levels of TMAO have been previously reported in the BIOSTAT-CHF
9 cohort to be associated with HF adverse outcomes ¹¹; the present analysis investigated the
10 extended metabolic pathway through carnitine/choline metabolism and shows that acetyl-L-
11 carnitine, γ -butyrobetaine, and L-carnitine in addition to TMAO to be associated with adverse
12 outcomes. Findings of contribution of the carnitine-TMAO pathway but not the choline-TMAO
13 pathway is consistent with a previous single-center study that showed carnitine rather than the
14 choline pathway contributes to HF outcomes ²² and validates findings in a larger real-world
15 multi-center setting. Higher levels of carnitine derivatives (acetyl-carnitine, trimethyllysine,
16 octanoyl-carnitine, and palmitoyl-carnitine) have been independently reported to be associated
17 with the severity of HF as well ²⁹.

18 Carnitine has an essential role in fatty acid and carbohydrate metabolism by
19 transporting long-chain acyl groups from fatty acids into the mitochondrial matrix to be
20 metabolised through β -oxidation to acetyl CoA via the citric acid cycle, and is ingested mainly
21 through red meat as its dietary source ³⁰. Carnitine and its acyl-derivatives are disturbed in HF,
22 and have been implicated in cardiac cachexia/sarcopenia which is common in advanced/severe
23 HF ^{31,32}, and carnitine insufficiency is commonly seen in HF patients and associated with
24 reduced left ventricular diastolic function. Carnitine supplementation has been reported to be a

1 potential treatment of mitochondrial dysfunction in HF ^{33,34}, and to lead to improvement in
2 clinical symptoms, cardiac morphology/function, natriuretic peptide levels, and renal function;
3 however, no clear effects on mortality have been demonstrated ³⁵. These beneficial effects are
4 linked both to the metabolic effect on myocardial cells ³⁶ through an increase in glucose
5 utilisation (rather than a normalisation of the fatty acid metabolism), and to the anti-catabolic
6 effect on skeletal muscle cells resulting in the L-carnitine anti-wasting effects ³⁷.

7 Trefoil Factor-3 (TFF-3), another biomarker of gut dysfunction, is a thermostable and
8 protease-resistant peptide that is expressed in the gastrointestinal tract and reported to play a
9 role in mucosal protection against damage ³⁸, showed added value when used alone or in
10 combination with the aforementioned carnitine metabolites for assessment of HF severity and
11 adverse outcomes. TFF-3 is involved in the reconstitution of epithelial barriers after injury;
12 more specifically, it is required to maintain the integrity of the mucosal barrier to prevent
13 environmental insult and promote wound repair ³⁹, and has been previously reported to be
14 associated with more severe HF and worse outcomes ⁴⁰.

15 Of notable interest is the combined/graded manner of association of the aforementioned
16 carnitine metabolites and TFF-3 with HF severity and adverse outcomes. This allowed for a
17 scoring scale to assess the degree of contribution of biomarkers to HF assessment which will
18 be useful for clinical application to quantify contribution of gut dysfunction. Added value to
19 risk stratification was also shown in a revised contemporary model of HF outcomes (BIOSTAT
20 risk model) when incorporating these biomarkers of gut dysfunction. The graded scoring shows
21 that gut dysfunction is more involved with increasing number of gut-related biomarkers, and
22 adds a new dimension of quantitative assessment of contribution of gut dysfunction to
23 management of HF.

1 Further investigations to add additional biomarkers reflecting different
2 pathophysiological facets of gut dysfunction to a surrogate biomarker panel are warranted to
3 further develop/extend the concept of the ‘gut-heart axis’ in a comprehensive/systematic
4 manner and to clinically translate assessment of gut dysfunction to HF management with the
5 present investigation serving as an important first step (proof-of-concept) to this aim.

6 Study limitations

7 The observational design of the BIOSTAT-CHF study does not allow to infer a
8 causative role of the gut biomarkers and outcome. In addition, information regarding diet and
9 physical activity to adjust for these confounding factors were not available. All patients in this
10 study had a recent HF hospitalisation that may limit the generalisability of the findings.

11 **CONCLUSIONS**

12 The present investigation showed that biomarkers of gut dysfunction, carnitine pathway
13 metabolites and TFF-3, together were associated in a graded/combinatorial manner to adverse
14 HF outcomes and disease severity, and add to current risk models of HF. Use of biomarkers as
15 surrogate markers potentially allows for assessment of contribution of gut dysfunction to HF
16 pathophysiology and risk stratification.

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7 **CONFLICT OF INTEREST**

8 SDA reports receiving fees from Abbott, Bayer, Boehringer Ingelheim, Cardiac Dimension,
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17 **AUTHOR CONTRIBUTIONS**

18 All authors listed in this manuscript have substantially contributed to the study's conception,
19 design, analysis, drafting, reviewing and performance as per the journal guidelines.

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1 **APPENDIX. List of investigators of the BIOSTAT-CHF consortium**

2 **WP1: Project Management team: A.A. Voors (WP-leader),** S.D. Anker, J.G. Cleland, K.
3 Dickstein, G. Filippatos, H.L. Hillege, C.C. Lang, MD, M. Metra, L. Ng, P. Ponikowski, N.
4 Samani, D.J. van Veldhuisen, F. Zannad, A.H. Zwinderman.

5 **WP2: Protocols: M. Metra (WP-leader):** M. Bulgari (Brescia), C. Lombardi (Brescia), V.
6 Carubelli (Brescia), Valentina Lazzarini (Brescia); Riccardo Rovetta (Brescia), Marco
7 Magatelli (Brescia), Isotta Castrini (Brescia), Luca Bettari (Brescia); Franco Cosmi (Arezzo);
8 Michele Correale (Foggia); Matteo Di Biase (Foggia); Simona Fratini (Roma); Giuseppe
9 Limongelli (Napoli); Gianfranco Parati (Milano); Maria Penco (Roma, L'Aquila); Valerio
10 Zaccà (Siena).

11 **WP3: Biomarkers: S. D. Anker (WP-leader):** A.A. Voors, S. von Haehling (Berlin), N.
12 Ebner (Berlin), J. Springer (Berlin), M. Diek (Berlin), M Lainscak (Berlin & Slovenia), J.G.
13 Cleland, P. Ponikowski

14 **WP4: Genomics: N. J. Samani (WP-leader),** Andrea Koekemoer (Leicester), Manolo
15 Papanikolaou (Leicester), Leanne M Hall (Leicester), Simon R Romaine (Leicester),
16 Christopher P Romaine (Leicester), John R Thompson (Leicester), Pim van der Harst
17 (Groningen)

18 **WP5: Proteomics: L. Ng (WP-leader):** D.J.L. Jones, R. Willingale, H.T. Cao, J.K. Sandhu,
19 P.A. Quinn, H. Patel, J. Auluck, A. Hakimi

20 **WP6: Clinical Study: H.L. Hillege (WP-leader); participating centers and their principal**
21 **investigators:**

22 D.J. van Veldhuisen, MD, PhD, University Medical Center Groningen, Groningen, The
23 Netherlands, H.W.O. Roeters van Lennep, MD, A. Liem, MD, A. Ghraboghly MD, Admiraal
24 de Ruyter hospital, Goes, The Netherlands. P.H.J.M. Dunselman, MD, PhD, Amphia hospital,
25 Breda, The Netherlands, P.A.M. Hoogslag, MD, Zorgcombinatie Noorderboog,

1 Diaconessenhuis, Meppel, The Netherlands, G.C.M. Linssen, MD, PhD, Ziekenhuis Groep
2 Twente, Almelo, The Netherlands , P.L. Van Haelst, MD, PhD, Antonius hospital, Sneek, The
3 Netherlands, D.J. Lok, MD, PhD, Deventer hospital, Deventer, The Netherlands, P.Y. Zinzius,
4 MD, CHU Brabois, service de cardiologie, Vandoeuvre les, Nancy, France, J.P. Godenir, MD,
5 CH Marie Madeleine, service de cardiologie, Forbach, France, J.Y. Thisse, MD, Hôpital Bel
6 Air, service de cardiologie, Thionville, France, M. Martelet, MD, CH de Langres, service de
7 cardiologie, Langres, France, M.F. Deforet, MD, CHBM site André Bouloche, service de
8 cardiologie, Montbéliard, France, N. Delarche, MD, Hôpital François Mitterrand, service de
9 cardiologie, Pau, France, J.J. Leduc, MD, Hôpital Saint Vincent de Paul, service de cardiologie,
10 Lille, France, M. Galinier, MD, Hôpital Rangueil, service de cardiologie, Toulouse, France, Y.
11 Neuder, MD, Hôpital A. Michallon, service de cardiologie, Grenoble, France, R. Eschaliér,
12 MD, Dr. G. Clerfond, CHU Gabriel Montpied, service de cardiologie Clermont Ferrand,
13 France, A. Benetos, MD, CHU, Brabois, service de gériatrie, Vandoeuvre , les Nancy, France,
14 K. Khalife, MD, Hôpital de Mercy, service de cardiologie, Metz, France, H. Düngen, MD,
15 Charité Universitätsmedizin Berlin, Berlin, Germany, V. Petrović, MD, Health Center Vršac,
16 Vršac, Serbia, A. Bratislav, MD, Health Center Kruševac, Kruševac, Serbia, P. Otašević, MD,
17 PhD, Institute for cardiovascular disease Dedinje, Belgrade, Serbia, N. Trifunović, MD, Health
18 Center Užice, Užice, Serbia, P. M. Seferović, MD, PhD, Clinical Center Serbia, Belgrade,
19 Serbia, M. Pavlović, MD, PhD, Clinical Center Niš, Niš, Serbia, A.N. Nešković, MD, PhD,
20 Clinical Hospital Center Zemun, Belgrade, Serbia, S. Radovanović, MD, Clinical Hospital
21 Center Bezanijska Kosa, Belgrade, Serbia, M. Lainščak, MD, PhD, University Clinic of
22 Pulmonary and Allergic Diseases Golnik, Golnik, Slovenia, T. Ravnikar, MD, General
23 Hospital Izola, Izola, Slovenia, S. Dimković, MD, PhD, Clinical Hospital Center 'Zvezdara',
24 Belgrade, Serbia, F. Kolokathis, MD, PhD, Athens, Akkros, Athens, Greece, A. Karavidas,
25 MD, PhD, FESC, Athens, Geniko Kratiko, Athens, Greece, S. Patsilnakos, MD, PhD, FESC,

1 Geniko Nosokomeio Agia Olga, Athens, Greece, M. Kitsiou, MD, PhD, FESC, Sismanoglio
2 Hospital, Athens, Greece, Z. Kyriakidis, MD, PhD, FESC, Korgialenio Benakio Erytros
3 Stayros, Athens, Greece, P. Makridis, MD, PhD, Hospital of Edessa, Edessa, Greece, I. Mantas,
4 MD, PhD, Hospital of Halkida, Halkida, Greece, A. Douras, MD, PhD Hospital of Volos,
5 Volos, Greece, E. Rentoukas, MD, PhD, Athens Hospital of Amalia Fleming, Athens, Greece,
6 J. Barbetseas, MD, PhD, Polikliniki Athinon, Athens, Greece, H. Karvounis, MD, PhD, Axepa
7 University Hospital, Thessaloniki, Greece, M. Metra, MD, PhD, University and civil hospital
8 Brescia, Italy, M. Penco, MD, PhD, Policlinico Casilino, Roma, Italy, V. Zacà, MD, Ospedale
9 Santa Maria alle Scotte, Siena, Italy, R. Calabrò, MD, PhD, Ospedale dei Colli, Napoles, Italy,
10 M. Di Biase, MD, PhD, Ospedali Riuniti, Foggia, Italy, G. Parati, MD, PhD, Istituto auxologico
11 italiano-ospedale S. Luca, Milan, Italy , F. Cosmi, MD, Ospedale S. Margherita, Cortona, Italy,
12 M. Penco, MD, PhD, Ospedale San Liberatore, Atri, Italy, K. Dickstein, MD, PhD, University
13 of Bergen, Stavanger University Hospital, Stavanger, Norway, U. Dahlström, MD, PhD, FESC,
14 FACC, Linköping University Hospital, Linköping, Sweden, L.H. Lund, MD, PhD, Karolinska
15 Institutet, Karolinska, Sweden, H. Persson, MD, PhD, Karolinska Institutet Danderyd Hospital,
16 Danderyd, Sweden, J.E. Otterstad, MD, PhD, FESC, Hospital of Vestfold, Tønsberg, Norway,
17 J. Jortveit, MD, Arendal Hospital, Arendal, Norway, T.H.O. Hole, MD, PhD, FESC, Ålesund
18 Hospital, Ålesund, Norway, E. Gjertsen, MD, Vestre Viken Hospital in Drammen, Drammen,
19 Norway. E. Aaser, MD, Vestre Viken Hospital trust, Department of Internal Medicine Bærum
20 Hospital, Bærum, Norway, P. Ponikowski, MD, PhD, Medical University of Wroclaw,
21 Department of Cardiac Diseases, Wroclaw, Poland, P. Berkowski, MD, PhD, Hospital in
22 Klodzko, Department of Cardiology, Klodzko, Poland, M. Ogorek, MD, PhD, Private
23 Cardiological Practice, Piotkow Trybunalski, Poland, A. Jurczyk, MD, PhD, A. Sokolowski
24 MD, Specialistic Hospital in Walbrzych, Department of Cardiology, Walbrzych, Poland, B.
25 Szafran, MD, Cardiological Center Pro Corde in Wrocław, Pro Corde Wroclaw, Poland,

1 **WP7: Systems Biology: A.H. Zwinderman (WP-leader):** S.D. Anker, H.L. Hillege, M.H.P.
2 Hof, C.C. Lang, M. Metra, L. Ng, W. Ouwerkerk, P. Ponikowski, N. Samani, D.J. van
3 Veldhuisen, A.A. Voors.

4 **WP8: Validation Study: C.C. Lang (WP-leader)** TAYSIDE: Prof C C Lang, Prof A D Struthers, Dr
5 A M Choy, Dr A Doney, Prof C Palmer, Prof A Morris, Prof B Guthrie, Dr H Parry, Dr R
6 Tavendale, Duncan Heather, Lynn Rutherford, Helen Waldie, Mohanpradeep Mohan, Fatima
7 Baig, Pippa Hopkinson, Daniel Levin FIFE HOSPITALS: Dr Mark Francis, Valerie Bryson,
8 ABERDEEN ROYAL INFIRMARY: Dr Dana Dawson, Professor Michael Frenneaux; EDINBURGH
9 ROYAL INFIRMARY: Dr Martin Denvir, Laura Flint, Shirley Robertson; GLASGOW GOLDEN
10 JUBILEE HOSPITAL: Dr Roy Gardner, Marion McAdam, Kirsty McGovern; GLASGOW
11 WESTERN INFIRMARY: Prof J McMurray, Dr Ross Campbell, Dr Jane Cannon

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1 TABLES

2 **Table 1.** Patient characteristics for the total cohort and after grouping for the number of elevated gut dysfunction markers

	Number of patients N (%)	Total cohort	Elevated [#] number of gut dysfunction markers						p Value
			0	1	2	3	4	5	
Number of patients	1783 (100%)	1783	236	332	325	339	304	247	-
Age	1783 (100%)	70 [61-78]	65 [55-73]	66 [58-75]	69 [59-78]	71 [63-79]	74 [65-79]	74 [68-80]	<0.001
Male	1783 (100%)	74%	68%	72%	75%	73%	79%	76%	0.102
Current smoker	1780 (99.8%)	14%	19%	14%	15%	15%	12%	11%	0.200
Ischemic aetiology	1748 (98%)	53%	45%	51%	49%	59%	59%	62%	<0.001
Diabetes mellitus	1783 (100%)	32%	25%	32%	27%	34%	32%	44%	<0.001
COPD	1783 (100%)	18%	13%	15%	15%	19%	24%	21%	0.003
Previous HF hospitalisation	1783 (100%)	31%	25%	27%	30%	35%	30%	40%	0.003
NYHA class									
I	1729 (97%)	2%	2%	3%	1%	2%	1%	2%	
II		36%	42%	39%	42%	37%	32%	21%	
III		49%	47%	48%	47%	49%	50%	57%	<0.001
IV		13%	8%	10%	10%	12%	17%	20%	
LV ejection fraction (%)	1608 (90%)	30 [25-36]	30 [25-35]	30 [25-35]	30 [25-35]	30 [25-38]	30 [25-38]	30 [23-36]	0.424
Pulmonary congestion	1732 (97%)	52%	50%	48%	50%	56%	58%	59%	0.038
Peripheral oedema	1478 (83%)	58%	53%	49%	56%	61%	65%	66%	<0.001
Systolic blood pressure (mmHg)	1779 (99.8%)	120 [110-139]	125 [110-140]	120 [110-140]	125 [110-140]	120 [110-140]	120 [110-130]	120 [110-131]	<0.001
Diastolic blood pressure (mmHg)	1779 (99.8%)	73 [66-81]	80 [70-88]	80 [70-85]	75 [65-85]	74 [66-80]	70 [63-80]	70 [62-80]	<0.001
Heart rate (beat/min)	1778 (99.7%)	77 [67-90]	80 [70-95]	77 [67-90]	75 [65-85]	76 [66-90]	77 [69-88]	75 [66-85]	0.034
Beta-blocker	1783 (100%)	83%	90%	83%	81%	83%	84%	81%	0.078
ACE inhibitor or ARB	1783 (100%)	72%	78%	80%	73%	71%	67%	63%	<0.001
Haemoglobin (g/dL)	1720 (96%)	13.3 [11.9-14.5]	13.8 [12.6-14.9]	13.5 [12.4-14.5]	13.5 [12.1-14.9]	13.2 [11.9-14.4]	13.0 [11.6-14.2]	12.4 [11.2-13.8]	<0.001
Urea (mmol/L)	1567 (88%)	11.4 [7.6-18.2]	8.2 [6.0-12.8]	8.6 [6.3-13.5]	10.8 [7.6-15.7]	11.4 [8.0-17.9]	14.4 [9.6-21.8]	19.7 [12.3-28.9]	<0.001
eGFR* (ml/min/1.73m²)	1782 (99.9%)	62 [47-78]	79 [68-94]	74 [61-87]	66 [54-81]	57 [45-72]	52.9 [42.9-67.8]	39.6 [30.0-51.3]	<0.001
Sodium (mmol/L)	1749 (98%)	140 [137-142]	140 [138-142]	140 [138-142]	140 [138-142]	139 [137-142]	139 [137-141]	139 [135-141]	<0.001
BNP (pg/mL)	1730 (97%)	237 [96-480]	201 [80-378]	178 [67-379]	189 [81-378]	239 [105-507]	284 [116-564]	370 [147-808]	<0.001
Protein intake (g/day)	1650 (93%)	54 [46-62]	56 [48-65]	56 [47-66]	54 [46-61]	53 [46-62]	52 [45-59]	52 [45-59]	<0.001

Gut dysfunction markers

Acetyl-L-carnitine (μmol/L)	1783 (100%)	8.4 [6.2-11.5]	5.5 [4.5-6.7]	6.6 [5.1-8.0]	7.2 [5.7-9.4]	9.2 [7.6-11.5]	10.8 [8.9-14.2]	14.7 [11.3-19.5]	<0.001
Betaine (μmol/L)	1783 (100%)	31.6 [24.0-42.6]	28.0 [21.5-36.5]	29.8 [23.6-38.1]	31.1 [23.4-41.9]	32.1 [24.2-45.1]	34.7 [26.2-48.6]	35.4 [26.6-47.6]	<0.001
Choline (μmol/L)	1783 (100%)	12.2 [9.9-15.3]	10.1 [8.4-12.1]	10.9 [9.2-13.4]	11.9 [9.5-14.3]	12.6 [10.6-15.3]	14.7 [11.2-17.3]	14.8 [12.1-19.6]	<0.001
γ-butyrobetaine (μmol/L)	1783 (100%)	1.2 [0.9-1.5]	0.9 [0.7-1.0]	0.9 [0.8-1.1]	1.1 [0.9-1.3]	1.3 [1.1-1.5]	1.4 [1.2-1.7]	1.7 [1.4-2.2]	<0.001
L-carnitine (μmol/L)	1783 (100%)	86.1 [68.3-110.4]	65.6 [52.8-75.9]	71.6 [56.5-82.1]	80.7 [66.0-98.1]	91.3 [74.8-108.7]	106.9 [92.3-127.6]	129.7 [109.2-158.0]	<0.001
Trefoil Factor-3	1783 (100%)	35 [24-54]	23 [17-29]	28 [21-36]	31 [23-47]	38.8 [27.5-54.3]	47.2 [33.6-69.2]	65.4 [46.8-102.7]	<0.001
Trimethylamine N-oxide (μmol/L)	1783 (100%)	6.4 [3.9-11.6]	3.4 [2.3-4.6]	4.5 [3.1-6.4]	5.7 [3.7-8.8]	7.3 [4.8-13.4]	9.1 [6.2-15.9]	14.7 [9.8-26.6]	<0.001

Endpoints

3 years

Death	1783 (100%)	468	14%	15%	22%	27%	34%	48%	<0.001
Death/HF	1783 (100%)	727	26%	26%	38%	47%	50%	61%	<0.001

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2 Data are presented as median [interquartile range] for continuous variables and % for categorical values.

3 * Estimated by Chronic Kidney Disease Epidemiology Collaboration formula.

4 # Elevated is defined by those patients with biomarker levels above the median concentration

5 Groupings were compared using the independent samples Kruskal-Wallis test for continuous variables and the Fisher Exact test for categorical variables.

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1 **Table 2.** Independent prediction abilities of gut-related metabolites for outcomes of all-cause
2 mortality (death) and the composite endpoint of death and/or rehospitalisation due to HF
3 (death/HF) at 3 years

	Univariate		Compact model		Extended model	
	HR [95% CI]	p Value	HR [95% CI]	p Value	HR [95% CI]	p Value
Death						
Acetyl-L-carnitine	6.85 [4.58-10.25]	<0.001	3.13 [1.96-4.99]	<0.001	2.74 [1.69-4.44]	<0.001
Betaine	1.44 [0.92-2.25]	0.113	1.25 [0.79-1.99]	0.345	1.26 [0.78-2.04]	0.338
Choline	3.08 [1.66-5.71]	<0.001	1.36 [0.70-2.67]	0.369	1.25 [0.63-2.48]	0.520
γ-butyrobetaine	6.80 [4.02-11.53]	<0.001	2.34 [1.27-4.32]	0.007	2.14 [1.14-4.02]	0.018
L-carnitine	6.47 [3.81-11.00]	<0.001	3.76 [2.13-6.63]	<0.001	3.06 [1.68-5.58]	<0.001
TMAO	2.35 [1.90-2.92]	<0.001	1.59 [1.24-2.04]	<0.001	1.46 [1.13-1.89]	0.003
TFF-3	5.60 [4.31-7.27]	<0.001	2.75 [1.93-3.92]	<0.001	2.51 [1.73-3.65]	<0.001
Gut dysfunction model	27.79 [16.74-46.15]	<0.001	7.27 [3.66-14.46]	<0.001	6.18 [3.02-12.62]	<0.001
Death/HF						
Acetyl-L-carnitine	4.20 [3.03-5.82]	<0.001	2.47 [1.73-3.53]	<0.001	2.21 [1.51-3.23]	<0.001
Betaine	1.57 [1.09-2.25]	0.015	1.38 [0.92-2.07]	0.115	1.34 [0.90-2.01]	0.155
Choline	2.84 [1.73-4.66]	<0.001	1.84 [1.07-3.16]	0.027	1.51 [0.86-2.63]	0.150
γ-butyrobetaine	5.68 [3.70-8.70]	<0.001	2.91 [1.79-4.73]	<0.001	2.37 [1.40-3.99]	0.001
L-carnitine	3.24 [2.12-4.94]	<0.001	2.66 [1.69-4.19]	<0.001	2.16 [1.36-3.43]	0.001
TMAO	1.84 [1.55-2.19]	<0.001	1.36 [1.12-1.66]	0.002	1.22 [0.98-1.50]	0.070
TFF-3	4.16 [3.35-5.17]	<0.001	2.20 [1.65-2.91]	<0.001	1.97 [1.42-2.75]	<0.001
Gut dysfunction model	16.67 [10.84-25.64]	<0.001	4.90 [2.82-8.50]	<0.001	4.28 [2.22-8.25]	<0.001

4 **Compact model for all-cause mortality (mortality):** age, blood urea (log-transformed),
5 BNP (log-transformed), haemoglobin and use of beta-blockers at baseline.

6 **Extended model for mortality:** compact model plus ischaemic aetiology, COPD, diastolic
7 blood pressure and sodium.

8 **Compact model for mortality and/or rehospitalisation due to HF (mortality/HF):** age,
9 previous HF hospitalisation, peripheral oedema, systolic blood pressure, BNP (log-
10 transformed), haemoglobin, sodium and use of beta-blockers at baseline.

11 **Extended model for mortality/HF:** compact model plus current smoker, COPD and eGFR.

12 Gut dysfunction combined- acetyl-L-carnitine + γ-butyrobetaine + L-carnitine + TMAO +
13 TFF-3

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1 **Table 3.** Reclassification analysis using continuous reclassification of adding gut-related
 2 metabolites to the BIOSTAT-CHF risk models

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	C-statistic			NRI [95% CI]	p value
	without metabolite	with metabolite	p value		
Mortality at 3 years					
Compact	0.729				
Acetyl-L-carnitine		0.738	0.058	19.9 [8.3-31.4]	<0.001
Betaine		0.730	0.261	8.4 [-3.1-20.0]	0.152
Choline		0.729	0.968	5.7 [-5.9-17.2]	0.335
γ -butyrobetaine		0.732	0.244	15.2 [3.6-26.7]	0.010
L-carnitine		0.739	0.072	15.3 [3.8-26.9]	0.009
Trimethylamine N-oxide		0.734	0.166	16.5 [5.0-28.1]	0.005
Trefoil factor-3		0.740	0.032	29.2 [17.7-40.8]	<0.001
Gut dysfunction model		0.739	0.023	25.3 [13.7-36.8]	<0.001
Extended	0.745				
Acetyl-L-carnitine		0.751	0.129	16.6 [4.9-28.4]	0.005
Betaine		0.745	0.755	11.4 [-0.3-23.1]	0.057
Choline		0.745	0.835	7.7 [-4.1-19.4]	0.200
γ -butyrobetaine		0.747	0.459	14.5 [2.8-26.2]	0.015
L-carnitine		0.750	0.116	11.3 [-0.2-23.0]	0.058
Trimethylamine N-oxide		0.749	0.175	11.7 [0.0-23.5]	0.050
Trefoil factor-3		0.753	0.076	25.3 [13.6-37.0]	<0.001
Gut dysfunction model		0.753	0.044	23.7 [12.0-35.5]	<0.001
Mortality/HF at 3 years					
Compact	0.716				
Acetyl-L-carnitine		0.727	0.009	24.9 [14.1-35.6]	<0.001
Betaine		0.717	0.478	7.7 [-3.0-18.5]	0.160
Choline		0.718	0.366	0.0 [-10.8-10.8]	1.000
γ -butyrobetaine		0.726	0.012	19.2 [8.4-29.9]	<0.001
L-carnitine		0.723	0.066	17.9 [7.2-28.7]	0.001
Trimethylamine N-oxide		0.720	0.206	10.8 [0.1-21.6]	0.048
Trefoil factor-3		0.728	0.012	21.0 [10.3-31.8]	<0.001
Gut dysfunction model		0.730	0.001	21.1 [10.4-31.9]	<0.001
Extended	0.727				
Acetyl-L-carnitine		0.735	0.031	17.3 [6.5-28.0]	0.002
Betaine		0.728	0.615	5.8 [-5.0-16.5]	0.293
Choline		0.728	0.855	0.0 [-10.8-10.8]	1.000
γ -butyrobetaine		0.733	0.042	12.6 [1.8-23.4]	0.022
L-carnitine		0.731	0.223	10.2 [-0.6-20.9]	0.064
Trimethylamine N-oxide		0.728	0.687	9.8 [-1.0-20.5]	0.075
Trefoil factor-3		0.734	0.079	13.0 [2.2-23.7]	0.018
Gut dysfunction model		0.736	0.011	13.5 [2.7-24.3]	0.014

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1 **Compact model for all-cause mortality (mortality):** age, blood urea (log-transformed),
2 BNP (log-transformed), haemoglobin and use of beta-blockers at baseline.

3 **Extended model for mortality:** compact model plus ischaemic aetiology, COPD, diastolic
4 blood pressure and sodium.

5 **Compact model for mortality and/or rehospitalisation due to HF (mortality/HF):** age,
6 previous HF hospitalisation, peripheral oedema, systolic blood pressure, BNP (log-
7 transformed), haemoglobin, sodium and use of beta-blockers at baseline.

8 **Extended model for mortality/HF:** compact model plus current smoker, COPD and eGFR.

9 Data are presented as net reclassification index (NRI), and 95% confidence interval (CI).

10 Gut dysfunction model- acetyl-L-carnitine + γ -butyrobetaine + L-carnitine + TMAO + TFF-3

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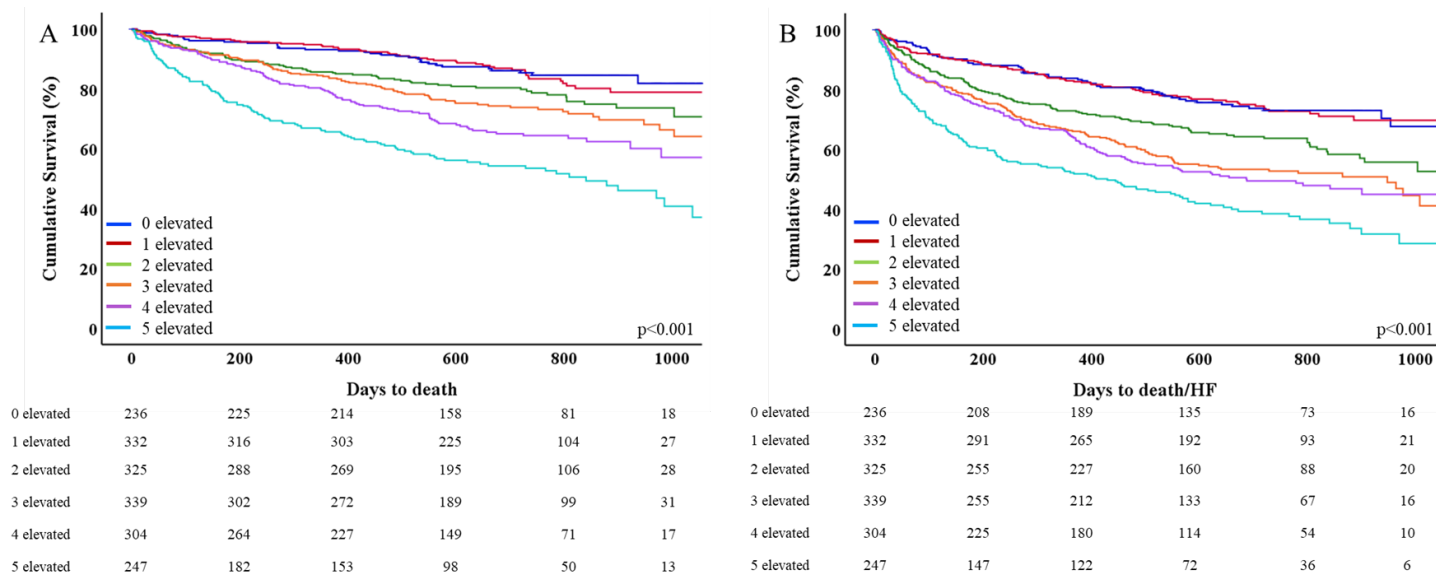
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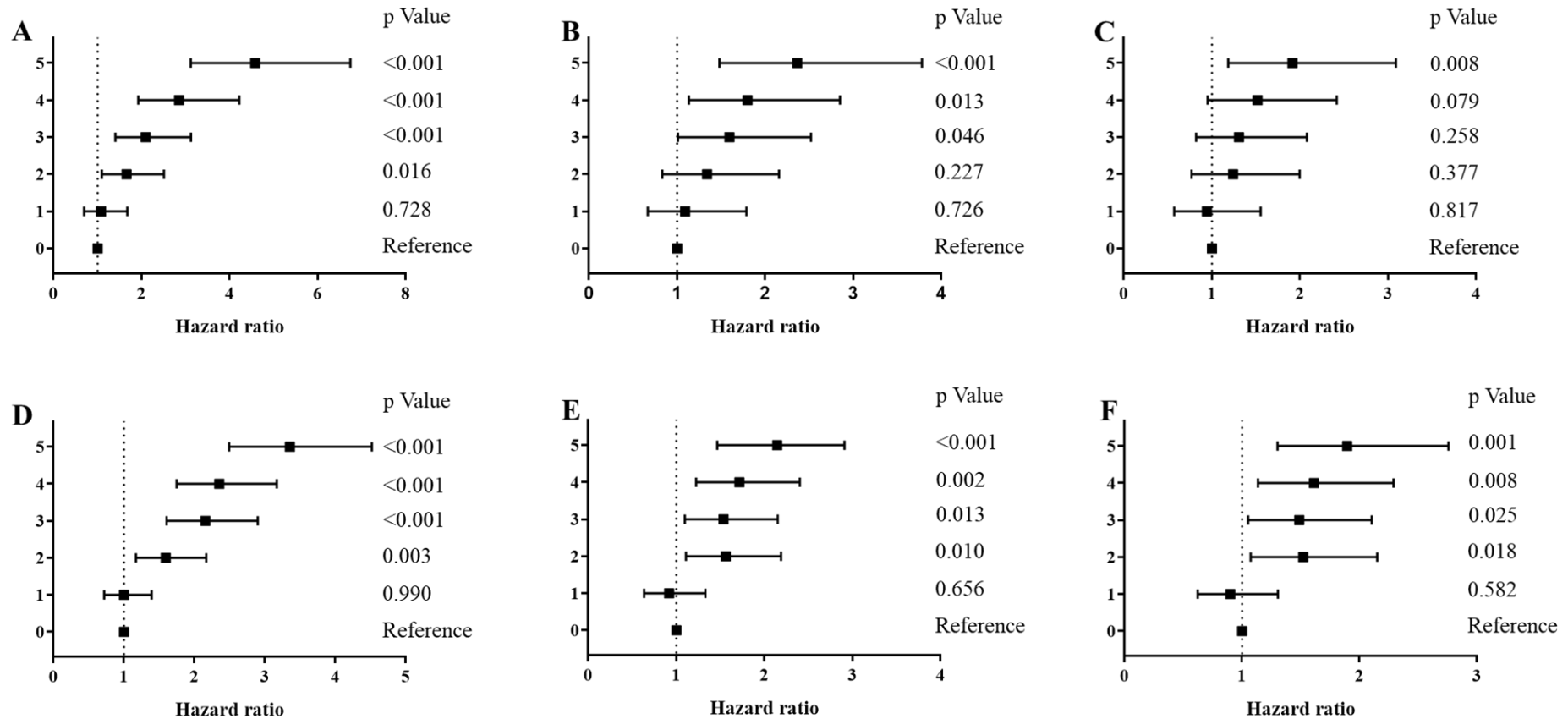
1 **FIGURE TITLES**

2 **Figure 1.** Kaplan-Meier survival curves for (A) death and (B) all cause death and/or rehospitalisation due to heart failure stratified by the
 3 number of elevated gut dysfunction markers



	1 elevated		2 elevated		3 elevated		4 elevated		5 elevated	
	Chi-square	p Value	Chi-square	p Value	Chi-square	p Value	Chi-square	p Value	Chi-square	p Value
(A) 0 elevated	0.166	0.684	5.946	0.015	13.941	<0.001	30.342	<0.001	69.470	<0.001
1 elevated			5.354	0.021	14.894	<0.001	35.165	<0.001	85.642	<0.001
2 elevated					2.133	0.144	12.250	<0.001	47.455	<0.001
3 elevated							4.645	0.031	32.217	<0.001
4 elevated									12.417	<0.001
(B) 0 elevated	0.001	0.980	9.072	0.003	27.642	<0.001	33.965	<0.001	69.558	<0.001
1 elevated			10.907	0.001	34.367	<0.001	41.990	<0.001	86.263	<0.001
2 elevated					6.383	0.012	10.254	0.001	38.157	<0.001
3 elevated							0.617	0.432	14.863	<0.001
4 elevated									9.271	0.002

1 **Figure 2.** Forest plot showing the association with outcome for patients with the number of elevated gut dysfunction markers.



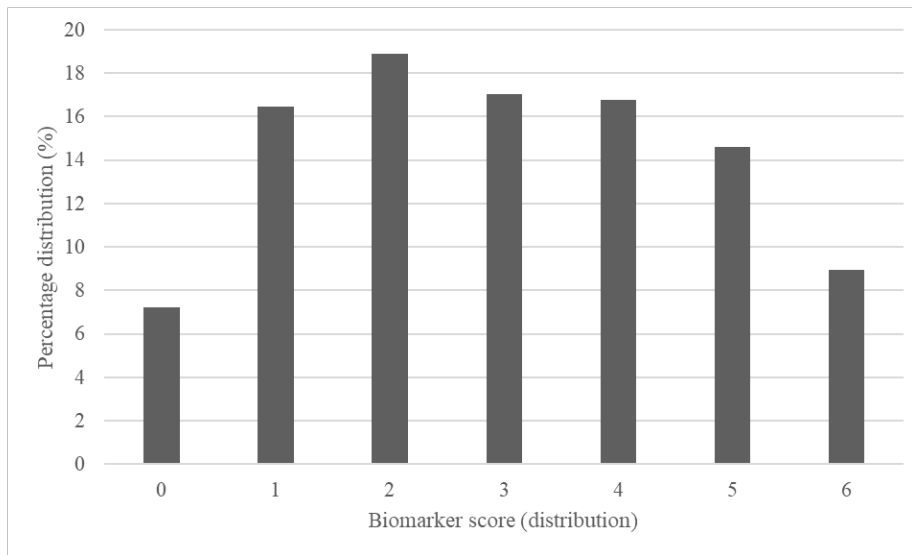
2 Cox proportional hazards regression modelling was used to compare the risk of death at 3 years (A) unadjusted (B) adjusted compact model (C)

3 adjusted extended model, and for death/HF (D), (E), (F). Data are presented as hazard ratio (HR) and 95% confidence interval (CI)

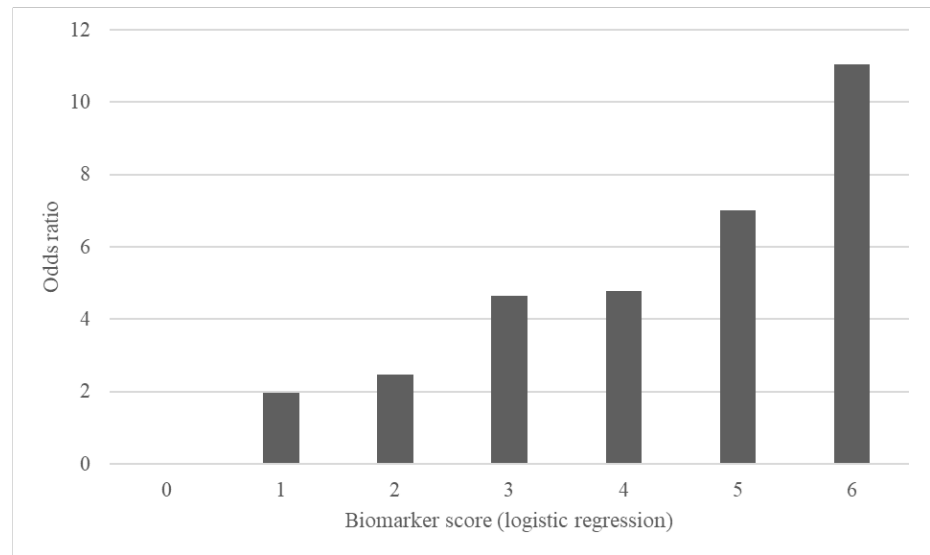
1 **Figure 3.** (A) Distribution of biomarker score in patients from the BIOSTAT-CHF cohort and (B) Logistic regression from the biomarker score
2 for outcomes of death/HF at 3 years

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A



B



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