

# BMJ Open Cohort profile: 'Biomarkers of Personalised Medicine' (BioPersMed): a single-centre prospective observational cohort study in Graz/Austria to evaluate novel biomarkers in cardiovascular and metabolic diseases

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## ABSTRACT

**Purpose** Accumulating evidence points towards a close relationship between cardiovascular, endocrine and metabolic diseases. The BioPersMed Study (Biomarkers of Personalised Medicine) is a single-centre prospective observational cohort study with repetitive examination of participants in 2-year intervals. The aim is to evaluate the predictive impact of various traditional and novel biomarkers of cardiovascular, endocrine and metabolic pathways in asymptomatic individuals at risk for cardiovascular and/or metabolic disease.

**Participants** Between 2010 and 2016, we recruited 1022 regional individuals into the study. Subjects aged 45 years or older presenting with at least one traditional cardiovascular risk factor or manifest type 2 diabetes mellitus (T2DM) were enrolled. The mean age of the participants was 57±8 years, 55% were female, 18% had T2DM, 33% suffered from arterial hypertension, 15% were smokers, 42% had hyperlipidaemia, and only 26% were at low cardiovascular risk according to the Framingham 'Systematic COronary Risk Evaluation'.

**Findings to date** Study procedures during screening and follow-up visits included a physical examination and comprehensive cardiovascular, endocrine, metabolic, ocular and laboratory workup with biobanking of blood and urine samples. The variety of assessed biomarkers allows a full phenotyping of individuals at cardiovascular and metabolic risk. Preliminary data from the cohort and relevant biomarker analyses were already used as control population for genomic studies in local and international research cooperation.

**Future plans** Participants will undergo comprehensive cardiovascular, endocrine and metabolic examinations for

## Strengths and limitations of this study

- The main strength of the BioPersMed cohort is the joint evaluation of cardiovascular, endocrine and metabolic phenotyping including a broad spectrum of highly innovative diagnostic, imaging and functional tools.
- Biobanking with a large number of samples aliquoted and stored at each visit enables a prospective view on candidate biomarkers in the context of a large longitudinal cohort, where specific approaches can be predefined.
- A specifically adapted large electronic data capture system (OpenClinica; [www.openclinica.com](http://www.openclinica.com)) and iterated monitoring assures the quality of data entry and delivery as well as the validity and reliability of biomarkers analyses.
- A potential weakness of this study is the wide time range of recruitment due to logistic reasons between 2010 and 2016, with a prolonged follow-up period of study participants to date between 4 and 10 years.
- Some biomarkers are not available for the complete duration of the entire cohort.

the next decades and clinical outcomes will be adjudicated prospectively.

## INTRODUCTION

Cardiovascular (CVD) and metabolic diseases (MD) are globally representing the most important cause of disability and premature

death.<sup>1</sup> Next to our genetic programming, modern lifestyle, including the use of tobacco, unhealthy nutritional habits, physical inactivity, and psychosocial stress are major risk factors of CVD and MD within different age groups not only promoting excess cardiovascular (CV) and metabolic morbidity but ultimately triggering excess mortality.<sup>2,3</sup> In turn, primary prevention of these diseases has the potential to avoid many of related deaths.<sup>4</sup> However, the initial euphoria about a decline of CVD prevalence at the beginning of this century<sup>5</sup> gradually gives way to a sense of frustration. This comes in the light of increasing numbers of type 2 diabetes mellitus (T2DM),<sup>6</sup> a very high lifetime-risk for the development of heart failure with stable incidence over the last decades,<sup>7</sup> and a persistent high stroke mortality.<sup>8</sup> In addition, the relevant underdiagnosing and/or undertreatment of patients at high risk for CVD related risk factors remains of utmost important.<sup>9</sup> Therefore, early detection of asymptomatic CV and/or metabolic risk remains a crucial challenge in the prevention of both, onset and progression of CVD as well as of related complications.<sup>10</sup>

Considering the multiplicity of risk pathophysiology, an integrative approach is needed to identify novel and to validate established CV and metabolic biomarkers for their scientific and clinical utility. Practical biomarkers are required to facilitate (1) the understanding of underlying mechanisms of disease development, (2) the detection of potential targets for specific preventive therapies, and finally (3) the precise estimation of individual risk. For this purpose, there is an unmet need for a cohort studies recruiting individuals at risk for CVD and/or MD well before clinical manifestation of the diseases.

In the BioPersMed cohort (Biomarkers of Personalised Medicine), we enrolled community dwelling and asymptomatic individuals from the regional communities who were at risk for CVD or MD in order to evaluate the predictive value of various traditional and novel biomarkers and to observe disease courses starting in the preclinical, asymptomatic phase. The latter shed light on different pathways of CVD and MD development by use of cutting edge laboratory measurements, advanced imaging techniques, comprehensive genetic investigations, and state of the art functional tests. The BioPersMed cohort is located at the Medical University of Graz (Austria) in a dedicated clinical outpatient research centre and biobank ([www.biobank.medunigraz.at](http://www.biobank.medunigraz.at)). The aim of the study is to evaluate large-scale screening tools for the improvement of (1) CV and metabolic risk stratification, (2) early diagnosis of CVD and/or MD (3), individual prediction of clinical outcomes, (4) and long-term monitoring of risk and/or early CV and/or metabolic changes in an apparently healthy but representative at-risk population at high CV and/or metabolic risk in a prospective manner. Ultimately, the data obtained from this cohort aims to facilitate the implementation of risk-adapted personalised interventions in both primary and secondary prevention of CVD and MD.

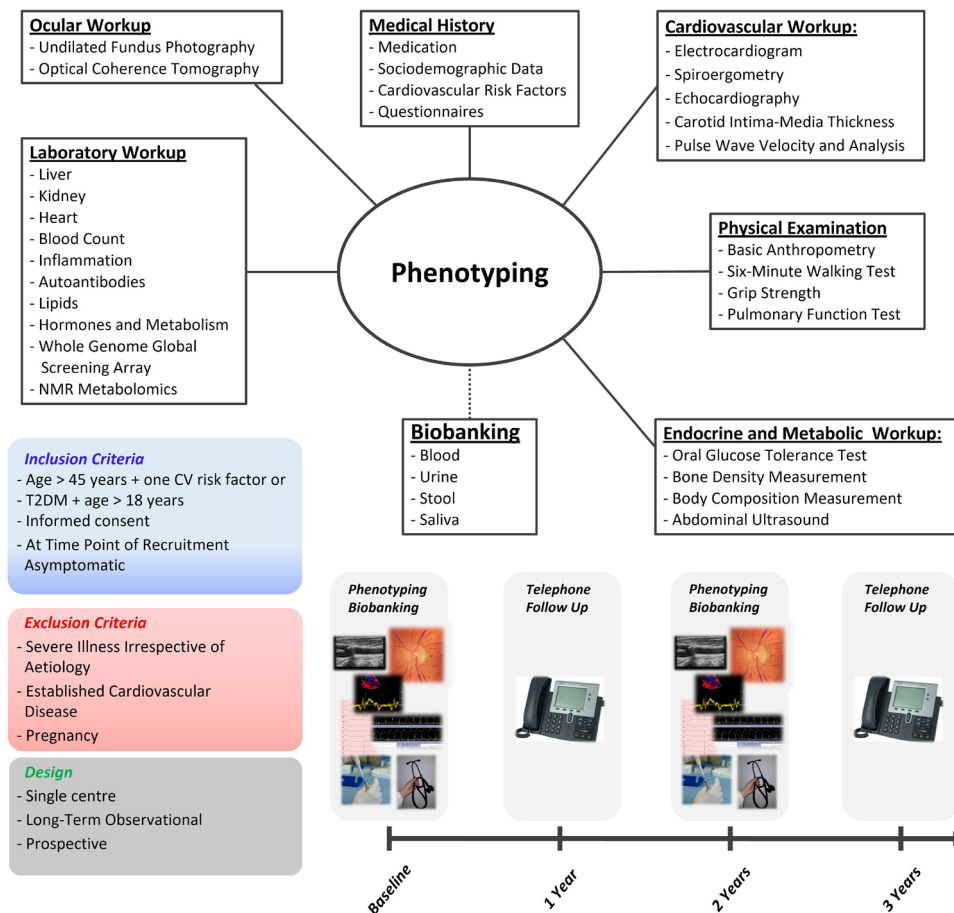
## COHORT DESCRIPTION

The BioPersMed project is designed as a single-centre, prospective, observational study. Only asymptomatic subjects without diagnosed CVD but with at least one traditional CV risk factor were eligible to participate. According to the published European Guidelines on CVD prevention in clinical practice, traditional CV risk factors besides of age and gender comprise (1) smoking, (2) elevated total cholesterol levels and (3) arterial hypertension.<sup>11</sup> Moreover, sedentary lifestyle, obesity, social environment, T1DM or T2DM, low High-density lipoprotein (HDL) cholesterol, increased triglyceride levels, elevated fibrinogen, apolipoprotein B, lipoprotein(a), familial hypercholesterinaemia, increased high sensitivity C reactive protein, preclinical evidence of atherosclerosis and chronic kidney disease (glomerular filtration rate  $\leq 60$  mL/min/1.73 m<sup>2</sup>) were regarded as additional potential CV and MD risk factors. From October 2010 (first patient in) to February 2016 (last patient in), we enrolled a total of 1022 community dwelling adult men and women who live in the greater Graz area via an established recruitment network, consisting of general practitioners, peripheral hospitals, and in most cases through the outpatient clinics of the Departments of Cardiology as well as Endocrinology and Diabetology, respectively.

Subjects presenting with significant non-CVD or who were expected not to be able to complete study specific examinations, were excluded from participation. The BioPersMed study was conducted in compliance with the laws and guidelines of the Medical University of Graz and complies with the Declaration of Helsinki and the Austrian laws.<sup>12,13</sup> All participants in the BioPersMed cohort were thoroughly checked for inclusion and exclusion criteria before the first phenotyping at baseline examination in order to avoid screening failures.

The baseline examinations have been repeated every 2 years in addition to interim telephone visits, which take place between the on-site visits. A summary of all examinations is shown in [figure 1](#), and a more detailed description can be found in online supplemental table S1–S10.

According to the presented scheme, participants will be followed for the next decades and clinical outcomes are adjudicated prospectively. A total of 169 (17%) participants dropped-out for various reasons. Causes for premature unintended termination of the study ranged from a change in the place of residence (n=5) to limited personal time or lacking will for continuous study visits (n=136) or new onset of non-CV-related diseases (cancer: 4, accident: 3, other: 9). Twelve people have died so far (cancer: 7, sepsis: 3, CVD: 2). In summary, 1022 persons were included in the baseline examination and 799 persons attended the first follow-up 2 years after baseline examination. With 1 September 2021, 628 persons have completed the second follow-up at 4 years after baseline visit, 531 persons have completed the third follow-up at 6 years after the baseline visit, and 225 persons have completed the follow-up of 8 years after the baseline visit. A small number of participants skipped one follow-up



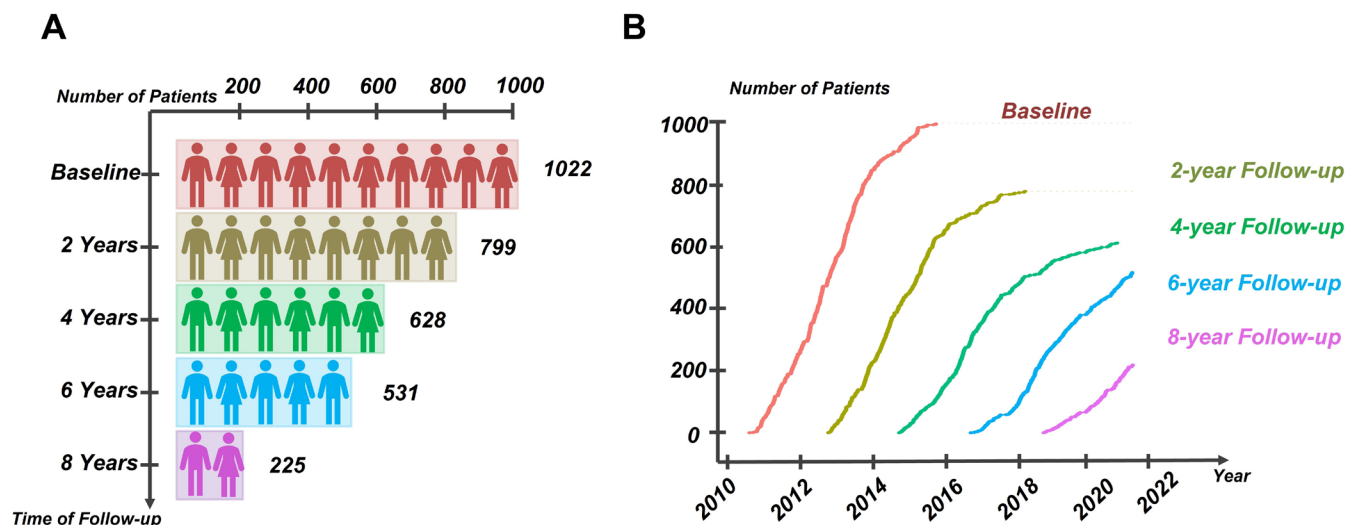
**Figure 1** Illustration of the comprehensive phenotyping and biosampling of the BioPersMed cohort. Follow-up visits are performed according to a tight preplanned schedule, including reminder-phone calls by study nurses with phenotyping and biosampling every second year and a follow-up telephone visit in the years between. At baseline, every participant received a patient's diary for documentation of medical events (source data). CV, cardiovascular; T2DM, type 2 diabetes mellitus.

but decided to continue to participate in the study. This issue explains the discrepancy between the number of drop-outs and the number of missing follow-up visits. A detailed overview of the recruitment process and study protocol is presented in [figure 2](#).

At baseline and at regular 2years-follow-ups, an in-depth diagnostic CV and MD work-up was carried out, laying emphasis on standardisation and reproducibility of history taking, questionnaires for health, psychological and sleep issues, physical examination, ECG, laboratory/blood sampling with biobanking, exercise testing (6min walking test, grip strength, spirometry), echocardiographic analysis of cardiac structure and function, pulmonary function testing, carotid intima/media-thickness measurement, pulse-wave analysis (PWA), and ophthalmologic examinations as well as body composition, bone density including bone and hormonal biomarkers, and oral glucose tolerance testing (OGTT). The number of examinations performed at each visit increased over time, due to additional new diagnostic tools (eg, non-mydratic funduscopy). A detailed description of all methods used, as well as a concise overview of the assessed data can be found in the online supplemental file 1. Statistics have been calculated using

RStudio V.1.2.5033 (RStudio, USA).<sup>14</sup> Besides the already included packages others, namely 'hmisc' (version : 4.6), 'ggplot2' (3.3), 'tidyr' (1.12), 'readxl' (1.3), 'MatchIt' (4.1), 'data.table' (1.13), 'dplyr' (1.0) and 'lubridate' (1.7), were needed for structuring of data, analysis and visual representation. Normal distribution of data was tested and, if positive, Pearson-correlation calculated. In case of a violation of normal distribution, a non-parametric equivalent was used. A description of the data is given in the corresponding tables. GCP trained and authorised independent persons from the Clinical Trials Unit at the Medical University Graz have carefully evaluated and monitored the data and relevant procedures around the cohort study. Based on the steering committees agreement, risk based monitoring of 100% of the baseline dataset and 80% of the follow-up dataset was performed. This was done to generate an adequate security of the structure and verification of the assessed data.

Biological and technical outlier were manually identified and corrected. This study conforms to the Strengthening the Reporting of Observational Studies in Epidemiology (STROBE)-ME recommendations for reporting cohort studies.<sup>15</sup>



**Figure 2** The recruitment status over time and the follow-up of the participants' phenotyping in the BioPersMed cohort. (A) Absolute number of participants who have completed various on-site follow-ups until first September 2021. (B) Timeline of recruitment and follow-up processes.

### Health status

At each visit, a careful assessment of the participants' health status was performed. Data collection documents anthropometric, biochemical, metabolic, hormonal, dietary, physical activity, socioeconomic, medical and other variables.

### Questionnaires

Questionnaires at all clinical visits include the Short-Form 36 Health Survey and the Hospital Anxiety and Depression Scale, as well as other questionnaires to assess depressive or disease-related symptoms and sleep qualities.<sup>16–21</sup> Raw data of these questionnaires have been collected and are available for further analysis.

### Echocardiography

Cardiac chamber geometry and function were assessed via state-of-the-art transthoracic echocardiography. Two-dimensional, Doppler-mode and M-mode echocardiography were performed following standardised protocols according to current guidelines and are digitally archived.

### Physical functioning and exercise capacity spiroergometry

For the assessment and interaction of vascular disease, CV risk and biomarkers, an assessment of physical functioning/exercise capacity was essential. Complementary to questionnaires on physical activity, physical fitness and symptom-limited cardiopulmonary exercise capacity was assessed by spiroergometry, 6 min walk test<sup>22</sup> and hand-grip measurements.<sup>23,24</sup>

### Pulse wave analysis and ECG

PWA and pulse wave velocity measurements were performed according to the expert consensus published by Laurent *et al.*<sup>25</sup> Additionally, a 12-lead ECG was performed in every patient.

### Ultrasound of the abdomen

Routine abdominal ultrasound examinations with special attention to liver and spleen characteristics (dimensions, texture, abnormalities) were carried out at each visit.

### Carotid ultrasound examinations

Carotid ultrasound examinations were performed in supine position on the right and left side. The intima/media thickness of the left and right common carotid artery is measured.<sup>26</sup>

### Bone density and body composition measurements

Regular dual energy X-ray absorptiometry measurements of bone density at the spine, hip and whole-body density include body composition and Trabecular Bone Score.<sup>27</sup>

### Laboratory and functional metabolic measurements

Sample acquisition includes serum, plasma, saliva and urinary as well as stool samples. Routine tests include liver and kidney function and electrolytes, blood counts, hormonal and metabolic data including lipid profiles and urinary analyses. A standardised OGTT (including insulin and c-peptide) was performed. These materials were collected at each visit for immediate analysis as well as biobanking (including samples of function tests).

### Biobanking

Serum, EDTA and citrate plasma, whole blood and cell pellets, spot urine, and saliva were collected at each study visit. They were immediately aliquoted and stored at the biobank of the Medical University of Graz (Austria) at  $-80^{\circ}\text{C}$ .<sup>28</sup> Biobanking guarantees an accurate description of the sample collection and sample handling according to the STROBE-ME recommendations.<sup>15</sup> Biospecimen-derived measurements adhere to the European guidelines.<sup>29</sup>

### Autoantibody phenotyping

Routine measurement of thyroid autoantibodies and auto-immune parameters for coeliac disease were performed in all participants. Further exploratory autoantibody detection (endocrine receptors, various epitopes) was done using newly developed luciferase-based fusion protein assays together with the Charité-Universitätsmedizin Berlin, Germany.<sup>30</sup>

### Metabolic phenotyping by nuclear MR

(Un)targeted metabolomic analysis of 1012 baseline serum and urine samples was performed by nuclear MR spectroscopy and state-of-the art chemoinformatics.<sup>31–33</sup> Metabolite and lipoprotein concentrations were determined using Topspin and the Pre-Clinical Screening and In Vitro Diagnostics Research package of Bruker.<sup>34–36</sup>

### Genome-wide characterisation of cohort

A whole genome global screening array (Illumina bead chip (Infinium Global Screening Array-24 V.2; Illumina, USA)) with nearly 700k specific single nucleotide polymorphisms (Illumina, in cooperation with the Human Genotyping Facility at the Erasmus University Rotterdam, NL) is available from all cohort participants.

### Optometric phenotyping

In addition, a large part of the cohort has been assessed by non-mydratic retinal photography since 2015. Ophthalmologic examinations comprised undiluted fundus photography and optical coherence tomography including the assessment of retinal vessel diameters.

### Data monitoring and quality assurance

All incoming data are checked by the study staff for completeness and plausibility and are entered into an electronic data capture system (OpenClinica; www.openclinica.com), specifically adapted for this project. Additional validation processes such as cross-validation with that is, external independent validation in samples were regularly performed. External monitoring by certified clinical monitors has been done in 100% of the baseline study records. Adequate external monitoring of the follow-up data is regularly ongoing.

### Patient and public involvement

No patient involved.

### FINDINGS TO DATE

A descriptive overview of the cohort including the CV, endocrine and metabolic risk profile is given in [table 1](#). More female (55%) than male (45%) persons were included in the study. The mean age of the participants is 57±8 years and the mean body mass index (BMI) is 26.5±4.5 kg/m<sup>2</sup>. A majority of 59% of the examined persons has a BMI greater than 25 kg/m<sup>2</sup>. Although asymptomatic, only 26% of the study population is considered to be at low CV risk according to the Framingham ‘Systematic COronary Risk Evaluation’,<sup>37</sup> while 38% show

**Table 1** Cardiovascular, endocrine, and metabolic risk profile of the BioPersMed cohort (N=1022)

	No (N=1022)	%
<b>Sex</b>		
Men	455	45
Women	567	55
<b>Smoking</b>		
Active smoker	154	15
Former smoker	326	32
Non-smoker	506	49
Unknown	36	4
<b>Framingham SCORE*</b>		
Low risk (<3 %)	263	26
Intermediate risk (3%–4%)	390	38
High risk (5%–9%)	267	26
Very high risk (≥10%)	9	1
Unknown	93	9
<b>Diabetes status†</b>		
NG	390	38
PreD	315	31
T2DM	181	18
Unknown	136	13
<b>Medical history‡</b>		
Arterial hypertension	341	33
Hyperlipidaemia	434	42
Stroke/TIA	7	1
<b>Antihypertensive drugs per patient</b>		
No antihypertensive drug	670	65
One antihypertensive drug	154	15
Two antihypertensive drugs	118	12
More than two antihypertensive drugs	80	8
<b>Lipid-lowering drugs per patient</b>		
No lipid-lowering drug	876	85
One lipid-lowering drug	139	14
More than one lipid-lowering drugs	7	1
<b>Antidiabetic drugs per patient</b>		
No antidiabetic drug	844	82
Dietetic treatment	119	12
One antidiabetic drug	54	5
More than one antidiabetic drugs	5	1
<b>Age</b>		
<55 years	437	43
55–65 years	382	38

Continued

**Table 1** Continued

	No (N=1022)	%
66–75 years	178	17
>75 years	25	2
<b>Body mass index</b>		
<18.5 kg/m <sup>2</sup>	6	1
18.5–25.0 kg/m <sup>2</sup>	408	40
>25.0 kg/m <sup>2</sup>	608	59

Health status—abbreviations.

\*Whenever present, a direct categorisation due to comorbidities was performed.

†Diabetes status based on oGTT results.

‡Hyperlipidaemia was assumed based on total cholesterol >200 mg/dL or the use of a lipid-lowering drug.

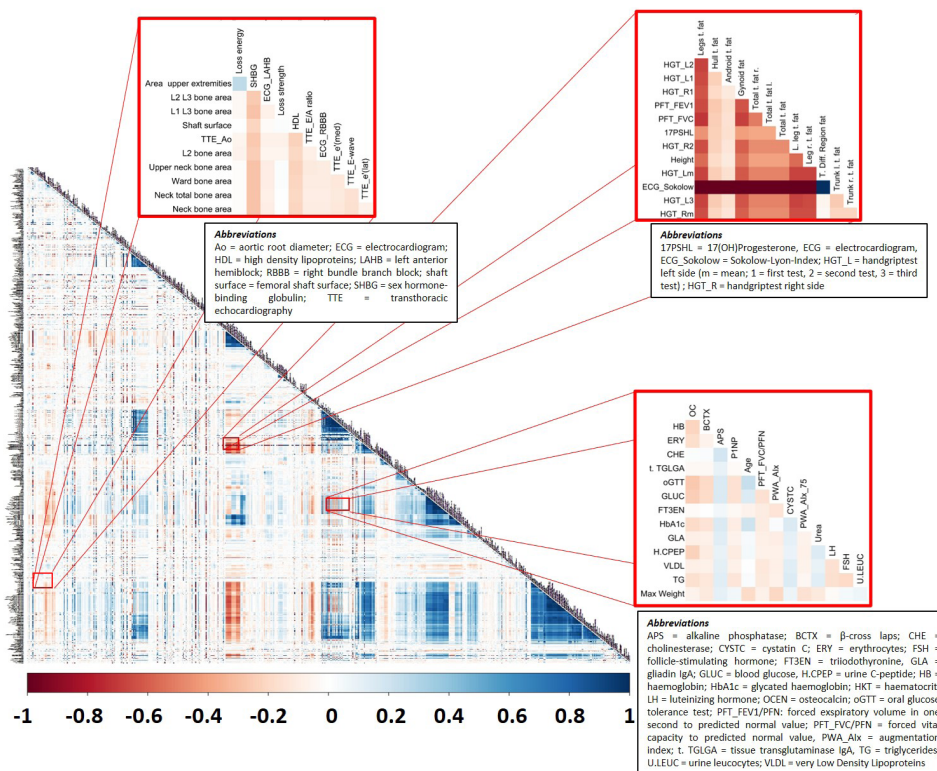
.NG, normoglycaemia; OGTT, oral glucose tolerance tests; PreD, pre-diabetes; SCORE, Systematic COronary Risk Evaluation; T2DM, type 2 diabetes mellitus; TIA, transient ischaemic attack.

intermediate risk, 26% show high risk and 1% show very high risk. Due to some missing biomarkers at the baseline visit, we were not able to calculate the CV risk in 9% of the study population using the Framingham Score. The most common risk factor is hyperlipidaemia (42% of the population), followed by arterial hypertension (33% of the population), T2DM (18% of the population) and active smoking (15% of the population). A rather high number,

nearly a third of the study population, has been identified as pre-diabetics based on oGTT data.

The purpose of this manuscript is to describe the study cohort and to give an overview of the baseline characteristics. These are reported in detail including additional information on used materials and methods in online supplemental tables S1–S10. The central [figure 3](#) shows an R-correlation plot of most measured biomarkers at baseline. In this plot, biomarkers are not grouped (eg, in organ systems); instead, clusters of high correlations were formed (blue indicates a positive correlation, red indicates a negative correlation and white indicates no correlation).<sup>38</sup> Thereby, associations between different biomarkers of different organ systems can be revealed which may further serve as a basis for a multidisciplinary in-depth analysis.

Such analyses already identified the so far unknown correlation between IGF1 receptor autoantibodies with body composition and height as presented at the European Congress of Endocrinology in Barcelona, Spain 2018.<sup>39</sup> Another preliminary finding revealed a correlation between diabetes status and echocardiographic parameters of the diastolic heart function as presented at the Congress of the European Association for the Study of Diabetes in Barcelona, Spain 2019.<sup>40</sup> These observations were in line with previous findings of another research group.<sup>41</sup> Furthermore, genetic data from the genome-wide association study and optometric phenotyping of the



**Figure 3** R-plot of the analysed data set. Potential biomarkers are not grouped; instead, random clusters of correlations are formed. blue zones indicate positive correlations, red zones indicate negative correlations. As an example, zones of strong correlations are zoomed and potential biomarkers are depicted.

BioPersMed cohort were already used as control data for a large keratoconus genomic study in cooperation with researchers from the UK and the Netherlands,<sup>42</sup> for the analysis of allelic determinants with a reported association to 25(OH)D levels and their influence on vitamin D,<sup>43</sup> and to identify novel biomarkers for non-alcoholic fatty liver disease<sup>44</sup> in cooperation with local researchers. Data on bone morphology from the BioPersMed cohort were used to link Sarcopenia with increased risk of falls, osteoporosis and mortality.<sup>45</sup> In addition, miRNA profiles were linked to Hashimoto's Disease and Thyroid Antibodies.<sup>46</sup>

### Strengths and limitations

The main strength of the BioPersMed cohort is the joint evaluation of both CV and metabolic phenotyping including a broad spectrum of diagnostic, imaging, and functional tools. This assures comprehensive biomedical and scientific dimensions of the project within high-end diagnostic and analytical parameters and biomarkers. Second, biobanking with a large number of samples including serum/plasma and blood cells, urine, saliva and stool at each visit that have been aliquoted and stored on high-quality certification rules enabling a prospective view on candidate biomarker in the context of a large longitudinal cohort, where specific approaches can be predefined.<sup>47 48</sup> In addition, a specifically adapted large electronic database (OpenClinica; [www.openclinica.com](http://www.openclinica.com)) assures the quality of data entry and delivery as well as the validity and reliability of biomarkers analyses in the BioPersMed cohort together with a continuous data monitoring.

A potential weakness of this study is the wide time range of a prolonged recruitment due to logistic reasons between 2010 and 2016. This results in a prolonged follow-up period of study participants between 4 and 10 years. Second, after a thorough standardised baseline phenotyping, of the BioPersMed cohort this phenotyping has been expanded by additional diagnostic parameters at either later points in time (eg, non-mydratic funduscopy) or in subpopulations. Although some of these biomarkers are not available for the complete duration of the entire cohort, cross-sectional analysis of a considerable number of participants can already be performed with these data sets and will be available for longitudinal comparison of follow-up visits thereafter.

### Collaboration

The design of the BioPersMed study, data management, biobanking and data analyses are compliant to the STROBE, STROBE-ME and STREGA recommendations. Collaboration in data analysis and publications will be welcome through specific research proposals sent to the BioPersMed investigators listed as corresponding authors of this manuscript. If desired, retrospective analyses can be performed because all data are recorded as raw data and more than 300 000 samples of blood, serum and urine are stored in the biobank.

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**Contributors** BP, TRP, AS and BO-P designed and supervised the study. AS and BO-P administrated the study. CWH, EK, NV, BO-P and AS wrote the manuscript. EK, CC, IM, MU-M, TG, BH, AL, CR, NV, KA, MW, EP-K, NJT, GS and AS investigated participants and collected data. CWH and EK calculated the statistics performed principal data analysis. BO-P and AS acted as guarantor. AT, NS, NV, TM, AS, AW, AZ, TK and RS contributed with data analysis and the allocation of resources. All authors reviewed the manuscript.

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**Competing interests** None declared.

**Patient and public involvement** Patients and/or the public were not involved in the design, or conduct, or reporting, or dissemination plans of this research.

**Patient consent for publication** Consent obtained directly from patient(s)

**Ethics approval** Ethical approval for the BioPersMed cohort study has been granted by the Ethics Committee of the Medical University of Graz, Austria and is renewed every year (EC Nr. 24-224 ex 11/12).

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