

Supplementary information

Blood-based obesity biomarkers and their relevance for disease risk

**In the format provided by
the authors and unedited**

Supplementary Information

Blood-based obesity biomarkers and their relevance for disease risk

Tobias Pischon^{1,2,3†} and Katharina Nimptsch¹

1) Max-Delbrück-Center for Molecular Medicine in the Helmholtz Association (MDC), Molecular Epidemiology Research Group, Berlin, Germany

2) Max-Delbrück-Center for Molecular Medicine in the Helmholtz Association (MDC), Biobank Technology Platform, Berlin, Germany

3) Charité – Universitätsmedizin Berlin, corporate member of Freie Universität Berlin and Humboldt-Universität zu Berlin, Berlin, Germany

[†]Email: tobias.pischon@mdc-berlin.de

Supplementary Table 1: Summary on the evidence of traditional obesity biomarkers regarding their association with obesity in observational and Mendelian Randomisation studies

Biomarker	Obesity			Weight loss	
	Obs. Cross-sect.	MR Obesity on biomarker	MR Biomarker on obesity	Lifestyle intervention	Bariatric surgery
Adiponectin	↓ ¹	↔ ²	↔ ²	↔ ³	↑ ⁴
Leptin	↑ ¹	↑ ⁵	↑ ⁶	↓ ³	↓ ⁴
FABP-4	↑ ^{7,8}	↑ ⁹	↑ ⁶	NA	↓ ¹⁰
Omentin	↓ ¹¹	NA	NA	↑ ^{12,13}	↑ ¹⁴
Chemerin	↑ ¹⁵	NA	NA	↓ ¹⁶⁻¹⁸	↓ ^{16,17,19}
Visfatin	↑ ²⁰	NA	NA	↔ ²¹	↔ ⁴
Resistin	↔ ²²	↔ ⁶	↔ ⁶	↔ ²¹	↔ ⁴
TNF	↑ ¹	NA	NA	↔ ²³	↓ ²⁴
IL-6	↑ ¹	↑ ²⁵	↔ ⁶	↓ ²³	↓ ²⁴
Oestradiol	↑(w) ²⁶ ↔(m) ²⁷	↑(m) ²⁸	↔(m) ²⁸	↓(w) ²⁹	↓ ³⁰
Testosterone	↑(w) ²⁶ ↓(m) ²⁷	↓(m) ²⁸	↔(m) ²⁸	↓(w) ²⁹	↑(m) ³⁰ ↓(w) ³⁰

↑↓ Evidence from meta-analysis or MR

↑↓ Evidence from individual studies

↔ No statistically significant association

*Adjustment for body adiposity not reported in^{26,31-33}.

m, men; MR, Mendelian Randomisation; w, women; prosp., prospective associations/studies

NA, no corresponding meta-analysis or MR was identified

26 **Supplementary Box 1: Abbreviations of proteins used in Table 2**

27 ADA, Adenosine deaminase; ADM, Adrenomedullin; AXIN-1, Axis inhibition protein 1; CCL20, C-
28 C motif chemokine 20; CCL23, C-C motif chemokine ligand 23; CCL28, C-C motif chemokine
29 ligand 28; CC-L3, C-C motif chemokine 3; CFAB, complement factor B; CFAH, complement
30 factor H; CFAI, complement factor I; CRP, C-reactive protein; CSF-1, Macrophage colony-
31 stimulating factor 1; CSF-1, Macrophage colony-stimulating factor 1; CST5, Cystatin-D; CST6,
32 Cystatin-M; CSTB, Cystatin-B; CTSD, Cathepsin D; CXCL-1, Fractalkine; CXL9, C-X-C motif
33 chemokine ligand 9; DKK3, Dickkopf-related protein 3; DNER, Delta and notch-like epidermal
34 growth factor-related Receptor; ESM1, Endothelial cell-specific molecule 1; FABP4, fatty acid
35 binding protein 4; FAS, Tumor necrosis factor receptor superfamily member 6; FGF19,
36 Fibroblast growth factor 19; GAL, Galanin peptides; GDF-15, Growth/differentiation factor 15;
37 GDF2, Growth/differentiation factor 2; GDNF, Glial cell line-derived neurotrophic factor; GHR,
38 Growth hormone receptor; HGF, Hepatocyte growth factor; hK11, Kallikrein-11; IGFBP2, insulin-
39 like growth factor-binding protein 2; IL-12B, Interleukin-12 subunit β ; IL-16, Pro-interleukin-16;
40 IL-1ra, Interleukin-1 receptor antagonist protein; IL-6, Interleukin-6; IL-8, Interleukin-8; JAG1,
41 Protein jagged-1; KIM-1, Kidney injury molecule 1; KLK-6, Kallikrein-6; LEP, leptin; IGFBP1,
42 insulin-like growth factor-binding protein 1; LGALS3BP, Galectin-3-binding protein; MB,
43 Myoglobin; MET, Hepatocyte growth factor receptor; MMP10, Matrix metalloproteinase-10
44 (stromelysin-2); MPO, Myeloperoxidase; NCAM1, Neural cell adhesion molecule 1, 120 kDa
45 isoform, 4498-62_2; NOTCH1, Neurogenic locus notch homolog protein 1; NT 3, Neurotrophin-
46 3; OPG, TNF ligand superfamily member 11; PDL1, Programmed cell death 1 ligand 1; PGF,
47 Placenta growth factor; PRAP, proline-rich acidic protein I; PSGL-1, P-selectin glycoprotein
48 ligand 1; RAGE, Receptor for advanced glycosylation end products; REN, Renin; S10A8, protein
49 S100-A8; S10A9, S100-A9; SCF, Stem cell factor; ; SELE, E-selectin; SERPINC1, Antithrombin-III;
50 SERPINE1, Plasminogen activator inhibitor 1; SHBG, sex-hormone binding globuline; TNF-R1,
51 Tumor necrosis factor receptor 1; TNF-R2, Tumor necrosis factor receptor 2; TNFSF14, Tumor
52 necrosis factor ligand superfamily member 14; t-PA, Tissue-type plasminogen activator; TRAIL,
53 TNF-related apoptosis-inducing ligand; TRANCE, TNF ligand superfamily member 11; TWEAK,
54 TNF ligand superfamily member 12; UNC5D, Netrin receptor UNC5D; U-PAR, Urokinase
55 plasminogen activator surface receptor; VEGF-A, Vascular endothelial growth factor A; VEGF-D,
56 Vascular endothelial growth factor Dh; WFIKKN2, WAP, Kazal, immunoglobulin, Kunitz, and NTR
57 domain-containing protein 2;

58

Supplementary Box 2: Footnotes describing the individual associations shown in Table 3

^a In observational studies, BCAA were not significantly related to colorectal cancer^{34,35} but with a reduced risk of gastric cancer³⁶. In MR studies, some BCAA were related to a higher risk of lung cancer³⁷ but no association of BCAA was found for liver cancer³⁸.

^b In some observational studies, tyrosine was related to a higher risk of liver cancer³⁹, valine to prostate cancer⁴⁰, glutamic acid to pancreatic cancer⁴¹, lysine to breast cancer⁴², alanine to prostate cancer⁴³, pyruvate to colorectal cancer⁴⁴, and higher glycine related to lower risk of endometrial cancer⁴⁵.

^c In observational studies, higher blood cysteine concentrations were related to a higher risk of breast cancer⁴⁶ but to a lower risk of colorectal cancer⁴⁷. Cysteine was not significantly related to CVD risk⁴⁸.

^d In observational studies, triglyceride concentrations were positively related to cancer risk at some sites, such as colorectal cancer⁴⁹⁻⁵¹, but results vary for other sites, with studies reporting inverse associations with liver cancer⁵² and breast cancer^{53,54} and no association with gastric cancer⁵⁵. A systematic review on Mendelian Randomisation studies found an inverse association for breast cancer⁵⁶.

^e In observational studies, HDL cholesterol levels were inversely related to cancer risk at some sites, such as colorectal cancer^{49-51,57}, liver cancer⁵², gastric cancer⁵⁵, and, albeit less consistently, with breast cancer^{53,54}. Mendelian Randomisation studies found no evidence for HDL cholesterol with regard to colorectal cancer⁵⁸ but an inverse association for total cancer risk⁵⁶, and a positive association for breast cancer⁵⁶.

^f The diagnosis of diabetes mellitus is based on elevated glucose concentrations.

82 **References cited in the supplement**

- 83 1 Gonzalez-Gil, E. M. *et al.* Association of body shape phenotypes and body fat
84 distribution indexes with inflammatory biomarkers in the European Prospective
85 Investigation into Cancer and Nutrition (EPIC) and UK Biobank. *BMC medicine* **22**, 334,
86 doi:10.1186/s12916-024-03544-3 (2024).
- 87 2 Nielsen, M. B., Colak, Y., Benn, M. & Nordestgaard, B. G. Causal Relationship between
88 Plasma Adiponectin and Body Mass Index: One- and Two-Sample Bidirectional
89 Mendelian Randomization Analyses in 460 397 Individuals. *Clin Chem* **66**, 1548-1557,
90 doi:10.1093/clinchem/hvaa227 (2020).
- 91 3 Clontz, A. D., Gan, E., Hursting, S. D. & Bae-Jump, V. L. Effects of Weight Loss on Key
92 Obesity-Related Biomarkers Linked to the Risk of Endometrial Cancer: A Systematic
93 Review and Meta-Analysis. *Cancers (Basel)* **16**, doi:10.3390/cancers16122197 (2024).
- 94 4 Askarpour, M. *et al.* Effect of Bariatric Surgery on the Circulating Level of Adiponectin,
95 Chemerin, Plasminogen Activator Inhibitor-1, Leptin, Resistin, and Visfatin: A
96 Systematic Review and Meta-Analysis. *Horm Metab Res* **52**, 207-215, doi:10.1055/a-
97 1129-6785 (2020).
- 98 5 Welsh, P. *et al.* Unraveling the directional link between adiposity and inflammation: a
99 bidirectional Mendelian randomization approach. *J Clin Endocrinol Metab* **95**, 93-99,
100 doi:10.1210/jc.2009-1064 (2010).
- 101 6 Folkersen, L. *et al.* Genomic and drug target evaluation of 90 cardiovascular proteins in
102 30,931 individuals. *Nat Metab* **2**, 1135-1148, doi:10.1038/s42255-020-00287-2 (2020).
- 103 7 Aleksandrova, K. *et al.* Fatty Acid-Binding Protein 4 and Risk of Type 2 Diabetes,
104 Myocardial Infarction, and Stroke: A Prospective Cohort Study. *J Clin Endocrinol Metab*
105 **104**, 5991-6002, doi:10.1210/jc.2019-00477 (2019).
- 106 8 Nimptsch, K. *et al.* Prospective and Mendelian randomization analyses on the
107 association of circulating fatty acid binding protein 4 (FABP-4) and risk of colorectal
108 cancer. *BMC medicine* **21**, 391, doi:10.1186/s12916-023-03104-1 (2023).
- 109 9 Goudswaard, L. J. *et al.* Effects of adiposity on the human plasma proteome:
110 observational and Mendelian randomisation estimates. *Int J Obes (Lond)* **45**, 2221-2229,
111 doi:10.1038/s41366-021-00896-1 (2021).
- 112 10 Witczak, J. K. *et al.* Bariatric Surgery Is Accompanied by Changes in Extracellular
113 Vesicle-Associated and Plasma Fatty Acid Binding Protein 4. *Obes Surg* **28**, 767-774,
114 doi:10.1007/s11695-017-2879-z (2018).
- 115 11 Arab, A., Moosavian, S. P., Hadi, A., Karimi, E. & Nasirian, M. The association between
116 serum omentin level and bodyweight: A systematic review and meta-analysis of
117 observational studies. *Clin Nutr ESPEN* **39**, 22-29, doi:10.1016/j.clnesp.2020.06.014
118 (2020).
- 119 12 de Luis, D., Izaola, O., Primo, D. & Aller, R. A Randomized Trial with Two Hypocaloric
120 Diets with Different Lipid Profiles and Effects on Serum Omentin-1 Levels in Obese
121 Subjects. *Dis Markers* **2022**, 6777283, doi:10.1155/2022/6777283 (2022).
- 122 13 de Luis, D. A., Izaola, O., Primo, D. & Aller, R. Impact of 2 Different Hypocaloric Diets on
123 Serum Omentin Levels in Obese Subjects. *Ann Nutr Metab* **73**, 138-144,
124 doi:10.1159/000489130 (2018).
- 125 14 Lapointe, M. *et al.* Omentin changes following bariatric surgery and predictive links with
126 biomarkers for risk of cardiovascular disease. *Cardiovasc Diabetol* **13**, 124,
127 doi:10.1186/s12933-014-0124-9 (2014).

128 15 Li, Y., Shi, B. & Li, S. Association between serum chemerin concentrations and clinical
129 indices in obesity or metabolic syndrome: a meta-analysis. *PLoS One* **9**, e113915,
130 doi:10.1371/journal.pone.0113915 (2014).

131 16 Chakaroun, R. *et al.* Effects of weight loss and exercise on chemerin serum
132 concentrations and adipose tissue expression in human obesity. *Metabolism* **61**, 706-
133 714, doi:10.1016/j.metabol.2011.10.008 (2012).

134 17 Schmid, A., Roderfeld, M., Karrasch, T., Roeb, E. & Schaffler, A. Serum Chemerin Is
135 Decreased by Roux-en-Y Gastric Bypass and Low Calorie-Formula Diet in Obese
136 Individuals. *Biomedicines* **12**, doi:10.3390/biomedicines12010033 (2023).

137 18 Siegrist, M. *et al.* Changes of omentin-1 and chemerin during 4 weeks of lifestyle
138 intervention and 1 year follow-up in children with obesity. *Clin Nutr* **40**, 5648-5654,
139 doi:10.1016/j.clnu.2021.09.042 (2021).

140 19 Terra, X. *et al.* Long-term changes in leptin, chemerin and ghrelin levels following
141 different bariatric surgery procedures: Roux-en-Y gastric bypass and sleeve
142 gastrectomy. *Obes Surg* **23**, 1790-1798, doi:10.1007/s11695-013-1033-9 (2013).

143 20 Semerena, E., Nencioni, A. & Masternak, K. Extracellular nicotinamide
144 phosphoribosyltransferase: role in disease pathophysiology and as a biomarker. *Front*
145 *Immunol* **14**, 1268756, doi:10.3389/fimmu.2023.1268756 (2023).

146 21 Hernando-Redondo, J. *et al.* Mid- and long-term changes in satiety-related hormones,
147 lipid and glucose metabolism, and inflammation after a Mediterranean diet intervention
148 with the goal of losing weight: A randomized, clinical trial. *Front Nutr* **9**, 950900,
149 doi:10.3389/fnut.2022.950900 (2022).

150 22 Pham, T. T. *et al.* Pre-Diagnostic Circulating Resistin Concentrations Are Not Associated
151 with Colorectal Cancer Risk in the European Prospective Investigation into Cancer and
152 Nutrition Study. *Cancers (Basel)* **14**, doi:10.3390/cancers14225499 (2022).

153 23 Bulmer, C. & Avenell, A. The effect of dietary weight-loss interventions on the
154 inflammatory markers interleukin-6 and TNF-alpha in adults with obesity: A systematic
155 review and meta-analysis of randomized controlled clinical trials. *Obes Rev* **26**, e13910,
156 doi:10.1111/obr.13910 (2025).

157 24 Askarpour, M., Khani, D., Sheikhi, A., Ghaedi, E. & Alizadeh, S. Effect of Bariatric Surgery
158 on Serum Inflammatory Factors of Obese Patients: a Systematic Review and Meta-
159 Analysis. *Obes Surg* **29**, 2631-2647, doi:10.1007/s11695-019-03926-0 (2019).

160 25 Fall, T. *et al.* Age- and sex-specific causal effects of adiposity on cardiovascular risk
161 factors. *Diabetes* **64**, 1841-1852, doi:10.2337/db14-0988 (2015).

162 26 Key, T. J. *et al.* Steroid hormone measurements from different types of assays in relation
163 to body mass index and breast cancer risk in postmenopausal women: Reanalysis of
164 eighteen prospective studies. *Steroids* **99**, 49-55, doi:10.1016/j.steroids.2014.09.001
165 (2015).

166 27 Marriott, R. J. *et al.* Factors Associated With Circulating Sex Hormones in Men :
167 Individual Participant Data Meta-analyses. *Ann Intern Med* **176**, 1221-1234,
168 doi:10.7326/M23-0342 (2023).

169 28 Wan, B., Ma, N., Zhou, Z. & Lv, C. Putative causal inference for the relationship between
170 obesity and sex hormones in males: a bidirectional Mendelian randomization study.
171 *PeerJ* **11**, e15760, doi:10.7717/peerj.15760 (2023).

172 29 Campbell, K. L. *et al.* Reduced-calorie dietary weight loss, exercise, and sex hormones
173 in postmenopausal women: randomized controlled trial. *J Clin Oncol* **30**, 2314-2326,
174 doi:10.1200/JCO.2011.37.9792 (2012).

175 30 Emami, M. R. *et al.* Effect of bariatric surgery on endogenous sex hormones and sex
176 hormone-binding globulin levels: a systematic review and meta-analysis. *Surg Obes*
177 *Relat Dis* **17**, 1621-1636, doi:10.1016/j.soard.2021.05.003 (2021).

178 31 Sook Lee, E. *et al.* Association between adiponectin levels and coronary heart disease
179 and mortality: a systematic review and meta-analysis. *Int J Epidemiol* **42**, 1029-1039,
180 doi:10.1093/ije/dyt087 (2013).

181 32 van der Ark-Vonk, E. M., Puijk, M. V., Pasterkamp, G. & van der Laan, S. W. The Effects of
182 FABP4 on Cardiovascular Disease in the Aging Population. *Curr Atheroscler Rep* **26**, 163-
183 175, doi:10.1007/s11883-024-01196-5 (2024).

184 33 Fontana, A. *et al.* Association between resistin levels and all-cause and cardiovascular
185 mortality: a new study and a systematic review and meta-analysis. *PLoS One* **10**,
186 e0120419, doi:10.1371/journal.pone.0120419 (2015).

187 34 Rothwell, J. A. *et al.* Circulating amino acid levels and colorectal cancer risk in the
188 European Prospective Investigation into Cancer and Nutrition and UK Biobank cohorts.
189 *BMC medicine* **21**, 80, doi:10.1186/s12916-023-02739-4 (2023).

190 35 Hisada, I. *et al.* Association of plasma branched-chain amino acid levels with colorectal
191 cancer risk in a nested case-control study. *Jpn J Clin Oncol*, doi:10.1093/jjco/hyae172
192 (2024).

193 36 Yu, L. *et al.* Association between branched-chain amino acid levels and gastric cancer
194 risk: large-scale prospective cohort study. *Front Nutr* **11**, 1479800,
195 doi:10.3389/fnut.2024.1479800 (2024).

196 37 Li, Z., Hao, J., Wang, T., Guo, C. & Liu, L. Branched-chain amino acids and risk of lung
197 cancer: insights from mendelian randomization and NHANES III. *J Thorac Dis* **16**, 5248-
198 5261, doi:10.21037/jtd-24-420 (2024).

199 38 Ma, C., Tang, L., Yao, J. & Tan, G. Identifying Proteins and Amino Acids Associated with
200 Liver Cancer Risk: A Study Utilizing Mendelian Randomization and Bulk RNA Sequencing
201 Analysis. *J Pers Med* **14**, doi:10.3390/jpm14030262 (2024).

202 39 Li, Z. Y. *et al.* Prediagnostic plasma metabolite concentrations and liver cancer risk: a
203 population-based study of Chinese men. *EBioMedicine* **100**, 104990,
204 doi:10.1016/j.ebiom.2024.104990 (2024).

205 40 Lecuyer, L. *et al.* NMR metabolomic profiles associated with long-term risk of prostate
206 cancer. *Metabolomics : Official journal of the Metabolomic Society* **17**, 32,
207 doi:10.1007/s11306-021-01780-9 (2021).

208 41 Stolzenberg-Solomon, R. *et al.* Associations between metabolites and pancreatic
209 cancer risk in a large prospective epidemiological study. *Gut* **69**, 2008-2015,
210 doi:10.1136/gutjnl-2019-319811 (2020).

211 42 Lecuyer, L. *et al.* NMR metabolomic signatures reveal predictive plasma metabolites
212 associated with long-term risk of developing breast cancer. *Int J Epidemiol* **47**, 484-494,
213 doi:10.1093/ije/dyx271 (2018).

214 43 Yang, S. *et al.* Genetically Predicted Circulating Concentrations of Alanine and Alanine
215 Aminotransferase Were Associated with Prostate Cancer Risk. *Clin Epidemiol* **14**, 1255-
216 1264, doi:10.2147/CLEP.S382116 (2022).

217 44 Yun, Z. *et al.* Genetically predicted 486 blood metabolites in relation to risk of colorectal
218 cancer: A Mendelian randomization study. *Cancer medicine* **12**, 13784-13799,
219 doi:10.1002/cam4.6022 (2023).

220 45 Dossus, L. *et al.* Prospective analysis of circulating metabolites and endometrial cancer
221 risk. *Gynecol Oncol* **162**, 475-481, doi:10.1016/j.ygyno.2021.06.001 (2021).

222 46 Lin, J. *et al.* Plasma homocysteine and cysteine and risk of breast cancer in women.
223 *Cancer Res* **70**, 2397-2405, doi:10.1158/0008-5472.CAN-09-3648 (2010).

224 47 Miller, J. W. *et al.* Homocysteine, cysteine, and risk of incident colorectal cancer in the
225 Women's Health Initiative observational cohort. *Am J Clin Nutr* **97**, 827-834,
226 doi:10.3945/ajcn.112.049932 (2013).

227 48 Page, J. H. *et al.* Plasma total cysteine and total homocysteine and risk of myocardial
228 infarction in women: a prospective study. *Am Heart J* **159**, 599-604,
229 doi:10.1016/j.ahj.2009.12.037 (2010).

230 49 Yao, X. & Tian, Z. Dyslipidemia and colorectal cancer risk: a meta-analysis of
231 prospective studies. *Cancer Causes Control* **26**, 257-268, doi:10.1007/s10552-014-
232 0507-y (2015).

233 50 Chandler, P. D. *et al.* Lipid biomarkers and long-term risk of cancer in the Women's
234 Health Study. *Am J Clin Nutr* **103**, 1397-1407, doi:10.3945/ajcn.115.124321 (2016).

235 51 Yang, Z., Tang, H., Lu, S., Sun, X. & Rao, B. Relationship between serum lipid level and
236 colorectal cancer: a systemic review and meta-analysis. *BMJ open* **12**, e052373,
237 doi:10.1136/bmjopen-2021-052373 (2022).

238 52 Zhang, Z. *et al.* Association between blood lipid levels and the risk of liver cancer: a
239 systematic review and meta-analysis. *Cancer Causes Control* **35**, 943-953,
240 doi:10.1007/s10552-024-01853-9 (2024).

241 53 Amerizadeh, A., Vaseghi, G., Farajzadegan, Z. & Asgary, S. An Updated Systematic
242 Review and Meta-Analysis on Association of Serum Lipid Profile With Risk of Breast
243 Cancer Incidence. *Int J Prev Med* **13**, 142, doi:10.4103/ijpvm.IJPVM_285_20 (2022).

244 54 Nouri, M. *et al.* Effect of Serum Lipid Profile on the Risk of Breast Cancer: Systematic
245 Review and Meta-Analysis of 1,628,871 Women. *J Clin Med* **11**,
246 doi:10.3390/jcm11154503 (2022).

247 55 Xu, S., Fan, Y., Tan, Y., Zhang, L. & Li, X. Association between blood lipid levels and risk
248 of gastric cancer: A systematic review and meta-analysis. *PLoS One* **18**, e0288111,
249 doi:10.1371/journal.pone.0288111 (2023).

250 56 Markozannes, G. *et al.* Systematic review of Mendelian randomization studies on risk of
251 cancer. *BMC medicine* **20**, 41, doi:10.1186/s12916-022-02246-y (2022).

252 57 van Duijnhoven, F. J. *et al.* Blood lipid and lipoprotein concentrations and colorectal
253 cancer risk in the European Prospective Investigation into Cancer and Nutrition. *Gut* **60**,
254 1094-1102, doi:gut.2010.225011 [pii] 10.1136/gut.2010.225011 (2011).

255 58 Chan, W. C. *et al.* Associations of blood lipids and LDL cholesterol lowering drug-targets
256 with colorectal cancer risk: a Mendelian randomisation study. *Br J Cancer*,
257 doi:10.1038/s41416-024-02900-7 (2024).

258