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### Life-course Genome-Wide Association Study Meta-analysis of Total Body BMD and

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#### Assessment of Age-specific Effects

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### 92 Abstract

93 Bone mineral density (BMD) assessed by DXA is used to evaluate bone health. In children, total body (TB) measurements are commonly used; in older individuals, BMD at the lumbar spine (LS) 94 95 and femoral neck (FN) is used to diagnose osteoporosis. To date, genetic variants in more than 60 loci have been identified as associated with BMD. To investigate the genetic determinants of 96 TB-BMD variation along the life course and test for age-specific effects, we performed a meta-97 98 analysis of 30 genome-wide association studies (GWAS) of TB-BMD including 66,628 individuals overall and divided across five age-strata each spanning 15 years. We identified variants 99 associated with TB-BMD at 80 loci, of which 36 have not been previously identified; overall they 100 101 explain approximately 10% of the TB-BMD variance when combining all age groups and influence the risk of fracture. Pathway and enrichment analysis of the association signals 102 showed clustering within gene-sets implicated in the regulation of cell growth and SMAD 103 104 proteins; overexpressed in the musculoskeletal system; and enrichment in enhancer and promoter regions. These findings reveal TB-BMD as a relevant trait for genetic studies of 105 106 osteoporosis, enabling the identification of variants and pathways influencing different bone 107 compartments. Only variants in ESR1 and close proximity to RANKL showed a clear effect dependency on age. This most likely indicate that the majority of genetic variants identified 108 influence BMD early in life and their effect can be captured throughout the life course. 109

# 110 Introduction

Osteoporosis is a disease characterized by low bone mass and microarchitectural deterioration
 of bone tissue leading to increased risk of fracture<sup>1</sup>. It is diagnosed through the measurement

of bone mineral density (BMD) utilizing dual-energy X-ray absorptiometry (DXA), which is the single best predictor of fracture<sup>1</sup>.

Bone is a dynamic tissue constantly undergoing resorption and formation. Bone mass increases steadily during childhood and markedly during adolescent growth<sup>2</sup>. Peak bone mass is attained at approximately the third decade of life. Thereafter, until about 50 years of age, BMD remains fairly stable, by virtue of the coupling between bone formation and resorption (e.g., bone remodeling). Subsequently, bone resorption exceeds the rate of bone formation, resulting in a decrease in BMD, particularly in women after the onset of menopause<sup>3</sup>.

121 The International Society for Clinical Densitometry recommends performing DXA measurements at the lumbar spine, femoral neck and total hip to diagnose osteoporosis in 122 postmenopausal women and men who are 50 years or older<sup>4</sup>. Consequently, studies of BMD 123 determinants are frequently based on measurements at these skeletal sites. By contrast, for the 124 assessment of bone health in children and adolescents, total body (excluding head) and lumbar 125 spine are the preferred sites to minimize measurement artifacts resulting from changing areas 126 in growing bones<sup>4</sup>. Nevertheless, in elderly individuals degenerative changes in the spine can 127 give elevated BMD readings<sup>5</sup>. Moreover, total body DXA scans have been obtained in a number 128 of adult research cohorts, primarily to assess body composition. Therefore, the total body BMD 129 (TB-BMD) measurement is the most appropriate method for an unbiased assessment of BMD 130 variation in the same skeletal site from childhood to old age. 131

To date, nearly 80 independent genetic variants have been shown to be robustly associated with variability in bone parameters<sup>6-18</sup>. Most of these markers have been identified in studies

comprising tens of thousands of adult and elderly individuals with DXA-derived BMD 134 135 measurements, although a few of them have been associated with BMD specifically in studies of pediatric cohorts<sup>8</sup>. Furthermore, several of the associated variants display significant site-136 specific effects, possibly reflecting differences in bone composition across skeletal sites (e.g., 137 cortical bone vs. trabecular bone) or differential response to mechanical loading<sup>8</sup>. Moreover, 138 genetic studies on measures from peripheral quantitative computed tomography (pQCT) and 139 140 bone quantitative ultrasound, which provide additional information regarding bone size, 141 geometry and (micro) architecture identified genetic variants that may have specific effects on bone properties that are poorly captured by conventional DXA measurements <sup>9-10</sup>. 142

Given the complex physiological processes underlying age-related changes in BMD across the life course, it is possible that genetic studies in more refined age groups will reveal variants in unreported loci as well as age-specific genetic effects. Thus, the purpose of this study was to identify gene variants associated with TB-BMD across the life span and investigate possible differences of genetic effects across age periods.

### 149 Methods

#### 150 **TB-BMD GWAS meta-analyses**

#### 151 Study Populations

### 152 <u>Subjects</u>

This study comprised 30 epidemiological studies comprising ~66,628 individuals from 153 154 populations across America, Europe, and Australia, with a variety of designs (Supplemental Data; Table S1) and participant characteristics (Table S2). In summary, most participants came 155 from population-based cohorts of European ancestry (86%), two cohorts comprising African-156 American individuals (2%) and other four studies holding a fraction of individuals from admixed 157 background (14%). All research aims and the specific measurements have been approved by the 158 correspondent Medical Ethical Committee of each participating study. Written informed 159 160 consent was provided by all subjects or their parents in the case of children.

### 161 <u>BMD measurement</u>

Total body BMD (g/cm<sup>2</sup>) was measured by DXA following standard manufacturer protocols. As recommended by the International Society for Clinical Densitometry total body less head (TBLH) was the measurement used in pediatric cohorts<sup>4</sup> (e.g., 0-15 years). Detailed information on the assessments performed by each study can be found in **Table S1**.

### 166 *GWAS data and imputation*

167 All individuals included in this study had genome-wide array data. Quality control of genotypes 168 is summarized in **Table S1**. To enable meta-analysis, each study performed genotype imputation using the cosmopolitan (all ethnicities combined) 1000 genomes phase 1 version 3
(March 2012) reference panel, yielding ~ 30,000,000 SNPs for analysis. Three studies used the
combined 1000 genomes and the UK10K reference panels as presented in Table S1.

#### 172 Association Analysis

TB(LH)-BMD was corrected for age, weight, height and genomic principal components (derived 173 from GWAS data), as well as any additional study-specific covariates (e.g. recruiting center), in a 174 linear regression model. For studies with non-related individuals, residuals were computed 175 separately by sex, whereas for family-based studies sex was included as a covariate in the 176 177 model. Finally, residuals were inverse normal transformed. The analyses were performed in 178 each study for the overall population as well as in subgroups of individuals by age-strata, defined by bins of 15 years (i.e., 0-15 years, 15-30 years, 30-45 years, 45-60 years, and 60 or 179 more years). SNP association was tested for autosomal variants, in which the additive effect of 180 each SNP on the normalized BMD-residuals was estimated via linear regression. 181

### 182 <u>Quality control of TB-BMD association summary statistics</u>

A centralized quality-control procedure implemented in EasyQC<sup>19</sup> was applied to all studyspecific files of association results to identify cohort-specific issues. We excluded variants if they had missing information (e.g., missing association P-value, beta estimate, alleles, allele frequency), or nonsensical values (e.g., absolute beta estimates or standard errors >10, association P-values >1 or <0; or imputation quality < 0; infinite beta estimates or standard errors); minor allele frequency (MAF) less than 0.5%; imputation quality scores <0.4 (Impute2) or <0.3 (Minimac). Moreover, variants were flagged if they had large allele frequency deviations from reference populations (>0.6 for admixed studies and >0.3 for ancestry-homogeneous studies).

### 192 <u>GWAS meta-analyses</u>

193 In the first instance, no exclusion criteria based on ancestry were applied for the meta-analysis (N=66,628).In addition, meta-analyses were carried out across age strata (minimum sample size 194 per bin N=200 for each study) comprising: 1) 0-15 years (N=11,807), 15-30 years (N=4,180), 30-195 45 years (N=10,062), 45-60 years (N=18,805), and 60 or more years (N=22,504). Further, 196 summary data from cohorts of European ancestry only were meta-analyzed and used in 197 198 subsequent analyses. We discarded variants present in less than three studies. Approximately 23,700,000 markers (including SNPs and INDELS) were assessed for association. We applied the 199 conventional genome-wide significance level (GWS,  $P < 5 \times 10^{-8}$ ) for SNP discovery. 200

### 201 Assessment of Age-dependent effects

We selected SNPs which were suggestively (12,567 SNPs, P<5x10-6) associated with BMD in the 202 overall meta-analysis, present in at least 2 studies per age-bin and with MAF differences across 203 these meta-analyses lower than 0.5. We clumped this dataset with an  $r^2 \ge 0.8$ , using as 204 205 reference the most strongly associated SNPs with BMD and, pruning remaining SNPs within 0.7 Mb of each other. Age-dependent effects were assessed using a meta-regression approach for 206 1,464 SNPs obtained after this selection procedure. We ran a linear regression of the SNP effect 207 estimates onto an intercept and the median age of each subgroup (e.g., each study stratified in 208 age-bins). As proposed previously<sup>20</sup>, standard errors of the effect estimates of each subgroup 209 210 were multiplied by the square root of the genomic inflation factor when it was greater than 1.

We performed the meta-regression using the Metafor package<sup>21</sup>, and any statistical evidence of linear association was corrected for multiple testing (Bonferroni correction; 0.05/1,464= 3.4x10<sup>-5</sup>). The difference between beta-estimates in children vs. elderly meta-analyses (Pdiff) was tested using Easy-strata<sup>22</sup>.

### 215 <u>Approximate conditional meta-analyses</u>

Conditional analyses were undertaken based on the meta-analysis of the studies of European 216 ancestry only (N=56,284). Only variants in the loci that reached GWS in this meta-analysis were 217 218 assessed. The Rotterdam Study I (n=6,291) was used as reference for precise calculation of the 219 linkage disequilibrium (LD) between the analyzed markers. We used an iterative strategy as implemented in GCTA<sup>23</sup> to determine: 1) independence of association signals within loci 220 discovered in our study, by means of stepwise model selection procedure per chromosome (--221 massoc-slct routine); and 2) the novelty of the association signals discovered by our meta-222 analysis with regard to variants reported in previous well-powered GWAS of different bone 223 traits (Table S3). To this end, we performed the association analysis conditional on 78 variants 224 present in our data and associated with different bone-traits (--massoc-cond routine). These 78 225 SNPs were selected from different GWAS publications<sup>6-10;12-14</sup>, assuring their independence to 226 avoid collinearity issues. 227

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#### 231 Shared Genetic architecture of TB-BMD fracture and other traits

### 232 LD score regression analyses

233 We used the LD score regression package to estimate the heritability of TB-BMD and rule out that our results were a product of bias (e.g., residual population stratification or cryptic 234 relatedness). LD score regression uses GWAS summary statistics and assesses the SNP-235 heritability based on the expected relationship between linkage disequilibrium (LD) of 236 neighboring SNPs and strength of association under a polygenic model<sup>24</sup>. As this methodology 237 relies on the LD structure throughout the genome, we restricted this analysis to summary 238 239 statistics from the meta-analysis of cohorts comprising only individuals from European ancestry. We used the publicly available, pre-computed LD structure data files specific to 240 European populations of the HAPMAP 3 reference panel. An extension of this method allows 241 estimating the genetic correlation between two traits<sup>25</sup>. This can be performed in the LDhub 242 pipeline, a web utility which gathers data from many different GWAS meta-analysis<sup>26</sup>. From the 243 199 traits, currently available in the website, we have restricted our analysis to those traits 244 whose heritability z-scores were larger than 4 and were analyzed only in European ancestry 245 individuals (following the recommendations in the LD score software website (Web 246 **Resources**)). Additionally, we incorporated data from a recent GWAS meta-analysis of any-type 247 of fracture in individuals from European ancestry (N= 264,267; 37,778 cases) (K.T, unpublished 248 249 data). In total, we assessed the genetic correlation between TB-BMD and 74 traits.

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#### 252 Mendelian randomization analysis

We undertook a two-sample Mendelian randomization approach<sup>27</sup> to estimate the causal effect 253 254 of TB-BMD on any-type of fracture in the Europeans samples. In short, we constructed a score based on the independent genetic variants from the TB-BMD meta-analysis (European set and 255 excluding secondary signals), whenever the selected variant was not present in the fracture 256 meta-analysis, the second variant with the lowest p-value in the locus (P<5x10<sup>-8</sup>) and  $r^2 > 0.8$ 257 was used as proxy. Thereafter, estimates derived from the TB-BMD summary statistics were 258 259 pooled using methods similar to inverse-variance weighted fixed meta-analysis using the meta 260 R-package (Web Resources).

#### 261 Search for biological and functional knowledge of the identified association regions

For all those SNPs outside a 500Kb window from previously known bone associated SNPs we did a literature search in PubMed and Web of Science to evaluate if nearby genes (within 500Kb) were known to play a role in bone metabolism. Also, we determined if the annotated genes underlie any human Mendelian disorder with a skeletal manifestation, had knockout mouse models with a skeletal phenotype or were annotated to pathways critical to bone metabolism. Genomic annotation for all SNPs was made based on UCSC hg19.

### 268 **DEPICT analyses**

We used DEPICT<sup>28</sup>, a recently developed tool to prioritize genes at the associated regions, define possible pathways by enrichment testing, and identify tissue and cell types in which genes from loci associated with TB-BMD. The methodology first selects all lead SNPs below a certain threshold with respect to a target P-value. We tested both the complete set of GWS

SNPs and the subset of those mapping only to loci not previously reported. Enriched gene-set were group based on the degree of gene overlap into 'meta gene-sets' as proposed earlier<sup>29</sup>, and their correlation visualized using Cytoscape 3.4 (**Web Resources**).

#### 276 **Functional annotation to microRNA binding sites**

We used the PolymiRTS<sup>29</sup>, miRdSNP<sup>30</sup>, and microSNiPer<sup>31</sup> databases to obtain a list of variants located in predicted microRNA binding sites on the 3'UTRs of genes, as described in detail elsewhere<sup>32</sup>. In summary, index SNPs (most associated variant) of the GWS loci were submitted to SNAP (**Web Resources**) to retrieve their high LD proxy SNPs (with  $r^2 > 0.8$ , limit distance 500 kb, and CEU panel) in the 1000 genomes project. The resulting list of SNPs was annotated to the list of microRNA binding site variants obtained from the above mentioned publicly available databases.

#### 284 **Functional enrichment analysis of trait-associated variants**

GWAS Analysis of Regulatory or Functional Information Enrichment with LD correction 285 (GARFIELD)<sup>33</sup> was used to characterize the putative functional contribution of TB-BMD 286 associated variants mapping to non-coding regions. GARFIELD employs a non-parametric 287 288 analysis to calculate fold enrichment values for regulatory marks, at given significance thresholds and then tests them for significance via permutation testing while accounting for LD, 289 MAF and local gene density<sup>33</sup>. We used data regarding DNase I hypersensitive sites, 290 transcription factor binding sites, histone modifications and chromatin states (ENCODE and 291 Roadmap Epigenomics) from 424 cell types and tissues to capture and characterize possible 292 293 cell-type-specific patterns of enrichment, as provided in the GARFIELD software (Web **Resources**). Fold enrichment statistics were tested at the four different significance thresholds (i.e.,  $1 \times 10^{-8}$ ,  $1 \times 10^{-7}$ ,  $1 \times 10^{-6}$  and  $1 \times 10^{-5}$ ). Multiple-testing correction was performed on the effective number of annotations used, using the default P-value threshold of  $1 \times 10^{-4}$ .

#### 297 Knockout animal models and gene expression in bone cells

#### 298 <u>Animal models survey</u>

We surveyed databases from *The International Mouse Phenotyping Consortium*<sup>34</sup> together with *The International Knockout Mouse Consortium*<sup>35</sup> to identify knockout models of candidate genes resulting in skeletal phenotypes. Furthermore we mined data from *The Origins of Bone and Cartilage Disease* (OBCD) project<sup>36</sup>, specialized in murine skeletal phenotypes including Digital X-ray microradiography on femurs and tail vertebrae, Micro-CT analysis, femur three-point bend test load–displacement curves and tail vertebrae compression testing from knockout mice and wild-type controls at 16 weeks of age.

### 306 <u>Gene expression in murine bone cells</u>

Gene expression profiles of candidate genes were examined in primary mouse osteoblasts 307 undergoing differentiation and bone marrow derived osteoclasts. To study murine 308 osteoblasts, pre-osteoblast-like cells were obtained from neonatal calvaria collected from 309 C57BL/6J. Next Generation RNA sequencing using an Illumina HiSeq 2000 was used to 310 evaluate the transcriptome every two days from day 2 to 18 days post osteoblast 311 differentiation<sup>7</sup>. Expression of genes in murine osteoclasts was determined using publicly 312 available data obtained using Next-Gen RNA-sequencing applied to bone marrow derived 313 osteoclasts obtained from 6-8 week old C57BL/6 mice<sup>37</sup>. 314

#### 315 Gene expression in human bone cells

Gene expression profiles of candidate genes were examined in human bone marrow derived 316 317 mesenchymal stem cells differentiated into osteoblast. Total RNA (n=3) was isolated at day 0 (MSCs) and day 4 of osteoblast differentiation<sup>38</sup>. Also, RNA was isolated during osteoclast 318 differentiation. Peripheral blood mononuclear cells derived from buffy coats (Sanguin, 319 Amsterdam, the Netherlands) were seeded in 96-well plates ( $5x10^5$  cells per well) as 320 previously described<sup>39</sup> Total RNA (n=3) was isolated using Trizol at day 0 (PBMCs) and at day 321 322 7 of osteoclast differentiation. Illumina HumanHT-12 v3 BeadChip human whole-genome 323 expression arrays were used for expression profiling. The quality of isolated RNA was 324 assessed on a 2100 Bioanalyzer (Agilent Technologies). Data were analyzed as described in detail previously<sup>38</sup>. Genes were designated as being expressed when at least one probe 325 coding for the gene was significantly present in at least 2 of the 3 biological replicates. 326

327 **Results** 

### 328 TB-BMD GWAS meta-analyses

#### 329 Analyses including all age-strata

Our meta-analysis of TB-BMD GWAS summary statistics (N=66,628) identified variants in 76 independent loci associated with TB-BMD at a genome-wide significant (GWS, P<=5x10<sup>-8</sup>) level (Figure 1, Table S4). Overall, there was no evidence of a strong inflation (genomic inflation factor ( $\lambda$ ) of 1.08, Figure S1). Yet, inflation was observed in the range of common variants (0.2>MAF<0.5,  $\lambda$ =1.19) due to polygenicity (LD score regression intercept = 1.007). In our results, one of the signals mapping to *LDLRAD3* was driven entirely by individuals of African

- 336 background (MAF=0.043 in YRI panel) since the two associated variants are monomorphic in all
- 337 other populations. The low allele frequency of this variant in our study (MAF= 0.025) and our
- 338 limited statistical power (N=6,748) in non-European samples warrants independent replication
- 339 efforts to exclude the possibility of a false-positive association.
- In addition, a meta-analysis comprising 56,284 individuals of European ancestry (~84% of the study population) identified variants in two additional GWS loci (**Figures S1-S2, Table S5**). Association signals mapping to these loci were close to the GWS threshold in the overall metaanalysis ( $P=1x10^{-7}$ ) and showed no evidence of heterogeneity ( $P_{het}>0.1$ ). One of them, in 12q24.21 (*MED13L*), has not been previously associated with bone parameters (**Table 1, Figure S3**), while the other in 21q22.13 (*CLDN14*), is not fully independent from the previously reported hip-BMD association signal<sup>13</sup> (**Table S5**).

Of the 78 identified loci, variants in 35 (45%) were not located within 500 kb of known 347 association signals nor in regions of extended LD with them (Table 1, Figure S4). Index SNPs at 348 these 35 loci were, in general, common non-coding variants. Twenty-two of these, are located 349 in close proximity to genes likely to influence bone metabolism as shown by previous functional 350 studies (Table 1, Figure S3), including CSF1 ([MIM 120420] important for osteoclast 351 differentiation<sup>40</sup>) and *SMAD3* ([MIM 603109] a critical component of the TGF-beta signaling 352 pathway<sup>41</sup>). Across these 35 signals, 31 of the index SNPs were nominally associated (P<0.05) 353 with either lumbar spine or femoral neck BMD in the same direction as in the previously 354 published GEFOS GWAS meta-analysis<sup>7</sup> (Table 1). This comparison was not possble for the 355 356 rs113964474 variant, because it was not available in the GEFOS study. Moreover, we found directionally-concordant effect estimates (P < 0.05) for 73 of the 78 index SNPs of known bone 357

association signals (**Table S3**). The markers which failed to replicate in our study were either previously associated with lumbar spine BMD but not femoral neck BMD (rs3905706 [*MPP7*, 10p12.1] and rs1878526 [*INSIG2*, 2q14.2]), associated specifically with the hip trochanter and intertrochanteric subregions (rs1949542 [*RP11-384F7.1*, 3q13.32]), or associated with BMD only in women (rs7017914 [*XKR9*, 8q13.3]) or only in children (rs754388 [*RIN3*, 14q32.12]).

### 363 Age-dependent effects

Meta-analyses across age strata resulted in the identification of variants mapping to 2 364 additional loci that were not detected in the overall meta-analysis (Figure S5; Table S6). In 365 children (age group 0-15 years), the previously known 14q32.12 locus<sup>8</sup>, harboring *RIN3* 366 (rs72699866,  $P=1x10^{-8}$ ); and in the middle-aged (age group 45-60 years), a signal in the 19g12 367 locus mapping in the vicinity of TSHZ3 (rs6510186,  $P=3.1x10^{-8}$ ) were identified. The rs72699866 368 variant leading the RIN3 signal in the youngest age stratum showed no evidence of association 369 (P=0.16) and high heterogeneity ( $P_{het}$ =6.6x10<sup>-5</sup>) in the overall meta-analysis. In fact, the effect of 370 rs72699866 decreased significantly with age ( $P_{trend}=1.69 \times 10^{-9}$ ) (Figure S6) and showed a 371 significant difference between the two extreme groups, i.e. children vs elderly ( $\beta_{0-15}$ =0.099 372  $[0.066, 0.134]; \beta_{>60}=-0.035 [-0.060, -0.010]; P_{diff}=4.32x10^{-10})$ . In contrast, the rs6510186 variant 373 [19q12] showed nominal evidence of association and heterogeneity in the overall meta-analysis 374 (P=0.02; P<sub>het</sub>=0.03). Nevertheless, no clear pattern of age-dependency was identified (P=0.2) for 375 376 this SNP (Figure S6).

We also applied meta-regression analysis and found that variants mapping to 42 different loci showed nominally significant age dependent effect (P<0.05) (**Table S7, Figure S7**). In summary,

27 (64%) of the loci showed stronger effects in the older age groups. Of these, variants in the 6q25.1 (*ESR1*) and 13q14.11 (*RANKL*) loci remained significant after multiple-testing correction ( $P<3.4x10^{-5}$ ) (**Figure 2**); while variants in 6p21.1 (*RUNX2*, rs148460475), 15q21.2 (*CYP19A1*, rs2414098), 17q21.31 (*MEOX1*, rs74835612) and 11p15.1 (*SOX6*, rs11822790) were only suggestive at  $P<1x10^{-3}$ .

### 384 **Conditional association analyses**

The step-wise conditional approach included studies comprising only individuals of European 385 386 ancestry, as the method used relies on appropriate representability of the LD reference. Of the 387 76 GWS loci identified in the overall analysis, variants in 57 (19 previously unreported) loci were also GWS in the European-only analysis (Figure S2), likely a consequence of the lower power in 388 this subgroup. We identified 81 SNPs independently associated with TB-BMD mapping to 58 389 different loci (one European-specific), 18 of which depicted multiple distinct signals attaining 390 GWS (Table S8). These independent variants together explained 10.2% of TB-BMD variance. 391 This proportion is slightly higher than the 7.4% TB-BMD variance explained by the 78 known 392 variants associated with bone traits. Moreover, we identified independent signals in 13 of the 393 78 known bone loci after conditional analyses. (Figure S2; Table S8). 394

### 395 Shared Genetic architecture of TB-BMD, fracture and other traits

SNP-heritability of TB-BMD in the European samples was estimated to be 0.259 (SE 0.017). TB-BMD was highly genetically correlated with BMD measured at other skeletal sites ( $\rho$ >0.9). Among the non-BMD traits, all-type of fracture showed the highest correlation [ $\rho$ =-0.61 (P=1.6x10<sup>-27</sup>)]. The MR approach indicated a strong causal relation where per 1 standard

deviation decrease in genetically determined TB-BMD there is 56% increase in the risk of fracture (Odds ratio 1.56 [1.50-1.62]). Other anthropometric, metabolic and disease traits showed significant (yet weak) correlation with TB-BMD (**Table S9, Figure 3**). In contrast, other established risk factors for osteoporosis such as menopause or age of menarche showed no significant genetic correlation with TB-BMD.

#### 405 Biological and functional knowledge of the genes in BMD-associated loci

Loci not previously reported and their potential role in bone metabolism are summarized in 406 407 Table 1. Several loci harbor genes implicated directly in bone metabolism (SLC8A1 [MIM 182305], PLCL1 [MIM 600597], ADAMTS5 [MIM 605007]), affecting osteoblast or osteoclast 408 differentiation and activity (CSF1 [MIM 120420],, DUSP5 [MIM 603069], SMAD3 [MIM 603109], 409 SMAD9 [MIM 603295], CD44 [MIM 107269]), participating in Wnt signaling (FZD7 [MIM 410 603410], TCF7L1 [MIM 604652]), or regulating processes such as manganese or calcium 411 absorption (GCKR [MIM 600842], DGKD [MIM 601826], SLC30A10 [MIM 611146]) among others 412 <sup>40-61</sup>; while genes in at least 14 loci exert a potential novel role in bone biology. Rodent 413 knockout models of several genes in the implicated loci, show an altered skeletal phenotype 414 (e.g., ostoepetrosis [Csf1<sup>40</sup>], increased bone resorption [Aqp1<sup>50</sup>, Cyp19a1<sup>57</sup>, Cd44<sup>53</sup>], impaired 415 skeletogenesis [Apc<sup>49</sup>, Runx1<sup>60</sup>, Smad3<sup>41</sup>], deformities in the axial skeleton [Btg1<sup>62</sup>, Atpaf2<sup>63</sup>]). 416 Whereas an effect on bone can be inferred for genes in other associated loci, for example, 417 CYP19A1 [MIM 107910] in 15q21.2 is an estrogen synthesis gene, being estrogen a key 418 419 compound for bone maturation and maintenance, and ZKSCAN5 [MIM 611272] in 7q22.1 is associated with circulating dehydroepiandrosterone sulphate (DHEAS) levels<sup>51</sup>. DHEAS levels 420 are positively correlated with BMD in adults and post-menopausal women<sup>64</sup>. Across these loci, 421

not previously reported as associated with BMD variation, we identified six exonic variants
associated with TB-BMD, three of which were nonsynonymous variants all cataloged as benign
both by SIFT and polyphen2. We also identified 53 GWS coding variants in known loci, of which
33 are non-synonymous (**Table S10**). Only a low-frequency variant in *LRP5* [MIM 603506],
rs4988321/A (11:68174189, MAF=0.04), has a clinical annotation, constituting a homozygous Gto-A transition variant identified in a person with osteoporosis-pseudoglioma syndrome (OPPG
[MIM 259770])<sup>65</sup>.

### 429 **DEPICT analyses**

Based on the overall meta-analysis, 53 genes were prioritized (FDR<0.05), 15 of them mapping to loci not previously described (**Table S11**). Cells and tissues from the musculoskeletal system presented the largest enrichment of gene expression within the associated loci (**Figure 4**). These genes were overrepresented in 182 pathways clustered in 25 'meta gene-sets' (**Table S12**). The large majority of the clusters are involved in musculoskeletal development and bone homeostasis (**Figure 4**). The most significant of these implicated the regulation of cell growth, and the TGFB signaling pathway and its mediating SMAD proteins.

Restricting the DEPICT analysis to the subset of not previously reported associated regions
resulted in significant enrichment of genes expressed in the musculoskeletal and immunological
systems (Figure S8). Genes mapping to these loci were overrepresented in the SMAD binding
pathway and TGFBR2 PPI (protein-protein interaction) subnetwork (FDR<0.05).</li>

### 441 **Functional annotation to microRNA binding sites**

We then assessed if the index SNPs of the 80 GWS loci detected in the main and subsequent 442 GWAS (or their proxies in strong LD;  $r^2$ >0.8) were located in predicted microRNA binding sites 443 within the genes' 3'UTRs and thus, were expected to disrupt the regulation of gene expression 444 (Table S13). The index SNP within the 3'UTR of ZKSCAN5 (mapping to a locus not previously 445 446 identified), rs34670419 (MAF=0.04), is predicted to create a binding site for miR-382-3p, a microRNA which is expressed in osteocytes and has been recently shown to be involved in 447 osteogenic differentiation<sup>66</sup>. In addition, eight proxy SNPs (mapping to PSMD13, ABCF2, 448 GALNT3, PKDCC, REEP5, PPP6R3, AAGAB and TOM1L2) are predicted to influence the binding of 449 450 microRNAs to transcripts of their host gene.

#### 451 **Functional enrichment analysis of trait-associated variants**

As typically found in GWAS, the great majority of identified associations emerged from non-452 coding common variants and hold no direct annotation to molecular mechanisms. 453 To assess if there is relative enrichment of regulatory genomic marks underlying the associated 454 variants in a cell-specific context, we used GARFIELD<sup>33</sup>. We found relative ubiquitous 455 enrichment for TB-BMD variants (Empirical  $P<2.4x10^{-4}$ ) in DNase I hypersensitive sites across 456 the different cell types (Figure S9). Further, we found higher levels of fold-enrichment for 457 458 enhancers (median 3.6, range [2.7, 4.4]) and promotors (median 3.2, range [2.9, 3.5]) than for transcribed regions (median 1.8, range [1.5, 2.2]). 459

### 460 Gene expression in bone cells and knockout animal models

From the 53 genes prioritized by DEPICT only 49 had a mouse orthologue (**Table S14**). From these genes, only *Mepe* (osteocyte-specific) and *Foxl1* were not expressed in murine osteoblast or osteoclast. Moreover, 61% of the prioritized genes were expressed in human cells *in vitro*during osteoblast or osteoclast differentiation (**Table S14**). *AQP1* was the only prioritized gene
mapping to a locus not previously reported showing no expression in the human bone cells
differentiation experiments.

Knockout models were widely available in at least one of the different databases assessed. 467 Nevertheless in-depth bone phenotyping performed under the OBCD project was only available 468 for four knockout models (Table S15). Two of these, DUSP5 and CD300LG showed no significant 469 470 bone phenotype. The *TCF7L1* knockout model only showed lower cortical diameter in the femur 471 without other clear bone phenotype. Nevertheless, TCF7L1 was shown to be expressed during 472 osteoblastogenesis. Conversely, homozygous knockout for CREB3L1 showed a clear bone phenotype consisting of low BMC both at the vertebrae and femur together with a strong 473 trabecular and cortical phenotype affecting bone strength (Figure S10). CREB3L1 maps to 474 11p11.2, a previously identified BMD locus<sup>6</sup> harboring ARHGAP1 and LRP4 as candidates to 475 underlie the GWAS signal in a region of extended LD. 476

# 477 **Discussion**

This meta-analysis of TB-BMD comprising up to 66,000 individuals identified variants in 36 loci not previously reported and replicated at GWS level several association signals identified by GWAS of diverse bone phenotypes. Bioinformatics analyses suggest enrichment of these 36 loci for genes expressed in the musculoskeletal system, and solidly represented in the SMAD binding pathway and the TGFBR2 PPI subnetwork. We also demonstrate that for variants in few loci the size of the effect is age dependent; variants in two loci (*RIN3* and *TSHZ3*) were

identified only by the age-stratified analyses despite less power (smaller sample size); while for
variants in two other loci (*ESR1* and *RANKL*) there was significant evidence of age heterogeneity
derived from a meta-regression of the genetic effects with age. Our results strengthen the
evidence that genetic variants influence BMD from a young age and support the value of peak
bone mass as an important determinant of bone health later in life.

Traditionally, DXA-BMD measurements performed at sites of high fracture risk (i.e., femoral 489 neck, lumbar spine and forearm) have been used in genetic epidemiological investigations of 490 491 bone health in adults. Instead, we have used BMD measurements derived from total body 492 scans. Not only do we show a high overlap of association signals with previous GWAS of 493 different bone traits, including DXA, pQCT and ultrasound measurements, but we have also 494 identified unreported loci. Five known associations failed to replicate in our studies, even though we cannot discard these associations constitute false-positives, these results might also 495 496 indicate that variants whose effect is highly specific to skeletal sites, skeletal properties, sex or 497 age groups cannot be detected in our TB-BMD meta-analysis. It is plausible that more variants of this type exist and will be discovered as site-specific BMD meta-analyses are performed in 498 increasingly powered settings. Furthermore, the genetic correlation of TB-BMD with BMD 499 measured at other sites was close to one. Whilst, we found that a decrease of one standard 500 501 deviation in the genetically determined TB-BMD resulted in at least 50% higher odds of 502 suffering a fracture. Significant genetic correlations with other traits (i.e., BMI, IGF1 and ulcerative colitis) reflect the systemic context of skeletal biology and merit further study by 503 future efforts to elucidate the underlying mechanisms. 504

Genes in the associated loci were highly expressed in the musculoskeletal system and 505 506 overrepresented in gene-sets related to bone development. The prioritized gene CREB3L1 [MIM 616215] in 11p11.2 observed a clear bone phenotype in our mouse knockout model, which 507 corroborates the findings of previous work showing substantial rescue of *CREB3L1* deficiency 508 with bisphosphonates and its critical role for bone formation<sup>67</sup>. This locus characterized by 509 extended LD, also harbors LRP4 [MIM 604270] whose knockout model presents with increased 510 trabecular and cortical bone mass<sup>68</sup>. This is in line with our conditional analysis identifying 511 512 multiple independent signals in the region making it likely that both genes are influencing bone biology. Altogether, we demonstrated that TB-BMD offers a powerful alternative to identify 513 514 genetic variants associated with bone metabolism.

Variants mapping to 14q32 harboring RIN3 [MIM 610223] were only associated at a GWS level 515 in children (i.e., <15 years), and were only nominally significant in the elderly group (i.e., >60 516 517 years). This age-related heterogeneity may explain why this locus has not been detected in BMD meta-analyses in adults, although being identified in relation to pediatric BMD<sup>8</sup> and 518 Paget's disease (PDB [602080]) GWAS<sup>69</sup>. In addition, another signal mapping to 19q12 519 520 harboring TSHZ3 [MIM 614119] was significant in adults aged 45-60 years but not in other age groups analyzed or in previous studies, alluding to a false-positive association, thus replication 521 522 of this finding is necessary.

523 Our analyses revealed variants in the 6q25.1 (*ESR1*) and 13q14.11 (*RANKL*) loci demonstrating 524 the most compelling evidence for age-modulation effects. The 6q25.1 locus harboring *ESR1* 525 [MIM 133430], an important genetic factor in normal BMD variability, was not associated with 526 BMD in children below 15 years of age, where the largest cohorts (i.e., Avon Longitudinal Study

of Parents and Children (ALSPAC) and the Generation R Study) comprise predominantly pre-527 pubertal children. As levels of estradiol before puberty are  $low^{70}$ , a negligible effect of ESR1 528 variants on BMD is expected. Likewise, in mouse models the expression of RANKL [MIM 529 602642] in bone is markedly increased with advancing age from young to adult and related to 530 bone loss<sup>71</sup>. Accordingly, variants influencing *RANKL* expression show a larger effect later in life. 531 In general, a substantial heterogeneity of the genetic effects in the overall meta-analysis was 532 explained by age, nevertheless, the inclusion of larger sample sizes (avoiding age exclusion 533 534 criteria and incrementing statistical power) leveled off the loss of power due to the 535 heterogeneity of the genetic effects.

536 In brief, variants with evidence of age-specific effects were exceptional in our study. These results might reflect a lack of statistical power as only SNPs showing suggestive evidence 537 (P<5x10<sup>-6</sup>) of association with TB-BMD in the overall meta-analysis were tested for age-specific 538 539 effects. This selection criteria aimed to include SNPs whose heterogeneity might have hampered their statistical significance in the overall meta-analysis, and at the same time 540 maximize the power to discover variants with real age-dependet effects. Alternatively, these 541 results indicate that most of the genetic variants identified so far, by us and others, influence 542 BMD from early ages onwards, and their effect persist throughout the life course. However, 543 variants in 27 of the 42 loci (64%) showing nominal evidence for age dependent effects had 544 545 larger effects in the older groups. Nonetheless, this requires careful interpretation given the uneven sample sizes between the age groups and the criteria to select markers for the meta-546 regression based on significance in the overall meta-analysis. Collectively, this argues in favor of 547

enlarging studies focused on younger populations –where the statistical power is still restricted
to discover additional genetic variants influencing BMD.

550 Our study has some limitations. A key disadvantage of our design is that we group the data 551 based on age spans rather than life stages. Crucial information for this assesment, such as puberty onset in children and adolecents or menopausal status in the adults, was not available 552 across the majority of the cohorts. Other strategies like using shorter age spans will resulted in 553 even less statistical power of the discovery setting. Similarly, despite the large sample size of 554 555 our study, we identified very few variants in the low-frequency spectrum (MAF <5%) indicating 556 that comprehensive surveys of rare variation influencing BMD still require even larger sample 557 sizes, on top of better resources for imputation of the rarer variants, possibly needing population-specific references. Such strategies will be key to explain a larger fraction of the 558 genetic variability of BMD phenotypes, as illustrated for other traits such as height or BMI<sup>72</sup>. 559 560 Moreover, the identified SNPs are in their vast majority, non-coding variants, raising the possibility that the causal genes are different from the candidate genes we have prioritized 561 based on the current biological knowledge and bioinformatic prediction tools. Additional 562 functional studies are required to determine the potential role of the genes in the identified 563 loci. 564

In conclusion, we performed a genome-wide survey for association with DXA derived TB-BMD, combining data from five age groups including children and older individuals. In contrast to previous large-scale meta-analyses<sup>6;7</sup>, we used DXA derived TB-BMD rather than measurements on specific skeletal sites prone to fracture to identify genetic factors influencing BMD variation. We demonstrate that TB-BMD is a valid phenotype for this purpose, as we replicated more than

90% of the previously reported signals. Most importantly, we identify variants in 36 loci 570 571 associated with TB-BMD not previously reported by previous GWAS of bone phenotypes. Our results show steadiness in the magnitude of the genetic effects on BMD for most of the BMD-572 573 associated variants. While the contrasting skeletal physiology across different age periods is 574 well established (i.e. endochondral ossification, linear growth, modelling, remodeling, etc.), peak bone mass acquisition remains the major determinant of variability at 575 any age. These findings strongly support the importance of the bone accrual process in the 576 577 definition of BMD status and fracture susceptibility throughout the life course.

#### 578 Accession Numbers

579 GWAS Summary data for the main and age-strata meta-analyses together with the 580 corresponding regional plots of GWS signals have been deposited in the GEFOS website (**Web** 581 **Resources**). Gene expression data presented in this paper can be retrieved from the Gene 582 Expression Omnibus (GEO) as follows: Murine osteoclasts (GSM1873361) and osteoblasts 583 (GSE54461); human osteoblast differentiation (GSE54461).

### 584 Supplemental Data

585 Supplemental data include a full list of acknowledgements, cohort short descriptions, 15 586 tables and 10 figures.

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590	GWAS data.	Part of this work was	conducted using the	UK Biobank resource.
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### 591 **Conflict of interests**

- 592 Psaty serves on the DSMB of a clinical trial for the manufacturer (Zoll LifeCor) and on the
- 593 Steering Committee of the Yale Open Data Access Project funded by Johnson & Johnson.

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## 595 Web Resources

- 596 GARFIELD, http://www.ebi.ac.uk/birney-srv/GARFIELD/GEFOS, http://www.gefos.org/
- 597 LDhub, <u>http://ldsc.broadinstitute.org/</u>
- 598 Meta R-package, <u>https://github.com/guido-s/meta)</u>
- 599 OBCD, <u>http://www.boneandcartilage.com/</u>
- 600 OMIM, http://www.omim.org/
- 601 SNAP, http://archive.broadinstitute.org/mpg/snap/

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### **Figure Titles and Legends**

**Figure 1. Manhattan plot of association statistics (-log10(P-values)) for TB-BMD overall meta-analysis.** Each dot represents a SNP and the x-axis indicates its chromosomal position (built 37 NCBI). Red dots represent SNPs at GWS loci that are not within  $\pm$ 500Kb of leading SNPs in previous GWAS with different bone traits. Dashed horizontal red and yellow lines mark the GWS threshold (P<5x10<sup>-8</sup>) and suggestive threshold (P<1x10<sup>-6</sup>), respectively. Novel loci in the only-CEU analysis are not shown.

**Figure 2. Age dependence of the genetic variant effect in the meta-regression**. The panels display leading SNPs from two loci exhibiting significant evidence for age influences. Heterogeneity P-values ( $P_{het}$ ) are reported for the overall meta-analysis. In the left panels, each circle represents a study subgroup (i.e., study divided in age strata), with the circle size proportional to the inverse variance of the SNP main effect. In the right panels, forest plots display estimates obtained from each age-bin meta-analysis, with the symbol size proportional to the inverse variance of the SNP main effect.

**Figure 3. Genetic correlations between TB-BMD and other traits and diseases.** Calculation was based on the summary statistics of the only-European meta-analysis (N=56,284) and estimated by LD score regression implemented in LDHub. The diagram only show traits whose correlation with TB-BMD was significant (P<0.05).

**Figure 4. Depict results for gene-set and cell/tissue enrichment analyses. Top panel**: 25 Meta gene-sets were defined from similarity clustering of significantly enriched gene sets (FDR<5%). Each Meta gene-set was named after one of its member gene sets. The color of the Meta gene-sets represents the P-value of the member set. Interconnection line width represents the Pearson correlation  $\rho$  between the gene membership scores for each Meta gene-set ( $\rho < 0.3$ , no line;  $0.3 \le \rho < 0.5$ ,narrow width;  $0.5 \le \rho < 0.7$ , medium width;  $\rho \ge 0.7$ , thick width). **Bottom panel**: Bars represent the level of evidence for genes in the associated loci to be expressed in any of the 209 Medical Subject Heading (MeSH) tissue and cell type annotations. Highlighted in orange are these cell/tissue types significantly (FDR<5%) enriched for the expression of the genes in the associated loci.

Tables

**Table 1. Index SNPs of loci not previously associated with BMD.** Variants associated with TB-BMD in the all-ages combined meta-analysis that map outside +/- 500 Kb of known index SNPs of genetic associations with different bone traits. Genomic coordinates are on build 37 of the human genome. Notes refer to annotation based on the closest gene. Associations with Lumbar Spine (LS) and Femoral Neck (FN)-BMD<sup>10</sup>. Beta coefficients and allele frequencies (EAF) are reported for the A1 allele

CHR	BP	rsnumber	Locus	A1	A2	EAF	Effect	P	N	annotation	closest gene	Notes	LS-beta	LS-P	FN-beta	FN-P
1	8422676	rs2252865	1p36.23	т	С	0.32	-0.033	4.72E-08	66075	intronic	RERE	Novel biology	-0.019	0.043	-0.025	0.002
1	110475971	rs7548588	1p13.3	т	С	0.61	-0.037	9.29E-09	66240	intergenic	CSF1	Osteoclast differentiation <sup>40</sup>	-0.030	0.001	-0.022	0.005
1	220038825	rs185048405	1q41	т	С	0.54	0.042	3.07E-09	66540	intronic	SLC30A10	Manganese transport <sup>42</sup>	-0.035	0.076	-0.003	0.878
2	27741072	rs780096	2p23.3	С	G	0.44	-0.031	4.58E-08	66578	intronic	GCKR	Calcium regulation <sup>43</sup> , hepatic traits <sup>44</sup>	-0.014	0.129	-0.017	0.029
2	40630678	rs10490046	2p22.1	А	С	0.76	0.043	1.43E-10	65961	intronic	SLC8A1	Bone mineralization <sup>45</sup>	0.015	0.162	0.021	0.025
2	68962137	rs10048745	2p13.3	А	G	0.25	-0.039	6.44E-09	66565	5'-UTR	ARHGAP25	Novel biology	-0.050	1.03E-06	-0.036	5.21E-05
2	85484818	rs11904127	2p11.2	А	G	0.55	-0.032	2.65E-08	66561	intronic	TCF7L1	Factors in Wnt signaling <sup>46</sup>	-0.021	0.023	-0.015	0.054
2	198874006	rs1595824	2q33.1	т	С	0.47	0.034	2.65E-08	60171	intronic	PLCL1	Negative regulation of bone formation <sup>47</sup>	0.022	0.201	0.052	2.20E-04
2	202799604	rs2350085	2q33.2	т	С	0.87	-0.064	3.80E-14	66412	intergenic	FZD7	Factors in Wnt signaling <sup>48</sup>	-0.042	0.002	-0.044	1.96E-04
2	234303405	rs838721	2q37.1	А	G	0.44	-0.031	4.48E-09	65516	intronic	DGKD	Calcium regulation <sup>43</sup>	-0.016	0.070	-0.014	0.068
5	112221869	rs818427	5q22.2	т	С	0.31	0.034	2.37E-08	66592	intronic	APC	Bone metabolism <sup>49</sup>	0.004	0.645	0.008	0.327
5	122847622	rs11745493	5q23.2	А	G	0.75	0.044	7.75E-12	66597	promoter	CSNK1G3	Novel Biology	0.010	0.326	0.025	0.005
7	27989403	rs757138	7p15.1	т	G	0.69	-0.035	3.33E-08	66043	intronic	JAZF1	Novel Biology	-0.016	0.126	-0.025	0.004
7	30957702	rs28362721	7p14.3	Т	С	0.18	-0.059	6.71E-14	66274	intronic	AQP1	Bone metabolism <sup>50</sup>	-0.037	0.002	-0.049	1.39E-06
7	50901491	rs1548607	7p12.1	А	G	0.69	0.036	4.18E-08	66564	intergenic	GRB10	Novel biology	0.034	5.59E-04	0.005	0.517
7	99130834	rs34670419	7q22.1	т	G	0.04	-0.088	1.09E-08	66336	3'-UTR	ZKSCAN5	DHEAS and aging mechanisms <sup>51</sup>	-0.127	9.28E-08	-0.080	8.19E-05
10	112245400	rs73349318	10q25.2	А	Т	0.87	-0.047	2.68E-08	66341	intronic	DUSP5	Osteoclast differentiation <sup>52</sup>	-0.042	0.001	-0.051	8.76E-06
10	124015986	rs10788264	10q26.13	А	G	0.48	-0.034	2.61E-09	66565	intergenic	TACC2	Novel Biology	-0.030	9.64E-04	-0.029	1.29E-04
11	242859	rs55781332	11p15.5	А	G	0.78	-0.055	8.07E-16	66198	intronic	PSMD13	Novel Biology	-0.046	1.76E-05	-0.026	0.005
11	35083633	rs2553773	11p13	С	G	0.41	-0.037	1.49E-10	66619	intergenic	CD44	Osteoclast activity <sup>53</sup>	-0.015	0.101	-0.015	0.054
11	35981346	rs113964474*	11p.13*	А	G	0.03	0.485	1.41E-08	6748	intronic	LDLRAD3	Novel Biology				
11	69299537	rs4980659	11q13.3	С	G	0.52	0.033	1.16E-08	66537	intergenic	CCND1	Target of Wnt signalling <sup>54</sup>	0.039	1.58E-05	0.023	0.003
11	121913230	rs725670	11q24.1	А	G	0.38	-0.032	3.61E-08	66565	intergenic	BLID	Novel Biology	-0.020	0.028	-0.011	0.172
12	90334829	rs10777212	12q21.33	Т	G	0.35	0.045	5.05E-14	66619	intergenic	ATP2B1	Calcium absorption <sup>55</sup>	0.028	0.003	0.021	0.010
12	116555786	rs73200209**	12q24.21	А	Т	0.80	0.045	2.51E-08	51240	intronic	MED13L	Novel biology	0.030	0.167	0.036	0.044
13	37487021	rs556429	13q13.3	А	С	0.23	0.039	1.46E-08	66504	intronic	SMAD9	Osteoblast differentiation <sup>56</sup>	0.023	0.027	0.013	0.135
15	38340874	rs12442242	15q14	А	G	0.85	-0.051	4.94E-10	66403	intergenic	TMCO5A	Novel Biology	-0.046	3.03E-04	-0.047	2.26E-05
15	51537806	rs2414098	15q21.2	Т	С	0.39	-0.033	1.99E-08	66562	intronic	CYP19A1	Estrogen byosynthesis <sup>57</sup>	-0.034	0.007	-0.038	0.001
15	67420680	rs1545161	15q22.33	А	G	0.56	0.041	1.06E-12	66004	intronic	SMAD3	Osteoblast differentiation <sup>41</sup>	0.034	1.27E-04	0.035	5.78E-06
17	17804725	rs8070128	17p11.2	т	С	0.58	-0.039	1.98E-11	66625	intronic	TOM1L2	Novel biology	-0.033	4.80E-04	-0.015	0.052
17	63771079	rs9972944	17q24.1	А	G	0.41	0.036	6.87E-10	66595	intronic	CEP112	Novel Biology	0.028	0.003	0.004	0.576
19	31654615	rs6510186***	19q12	Т	С	0.26	0.068	3.11E-08	18782	intergenic	TSHZ3	Novel Biology	0.004	0.713	0.006	0.492

20	39103882	rs6029130	20q12	т	С	0.30	0.035	3.50E-08	66497	intergenic	MAFB	Osteoclast differentiation <sup>58</sup>	0.027	0.007	0.015	0.083
21	28773868	rs1452102	21q21.3	т	G	0.59	-0.035	1.74E-09	66489	intergenic	ADAMTS5	Endochondral Ossification <sup>59</sup>	-0.029	0.001	-0.015	0.056
21	36970350	rs9976876	21q22.12	т	G	0.45	-0.038	8.01E-11	66514	intronic	RUNX1	Osteoclast differentiation <sup>60</sup>	-0.019	0.031	-0.016	0.041
21	40350744	rs11910328	21q22.2	А	G	0.84	-0.043	2.99E-08	66298	intergenic	ETS2	Osteoblast maturation <sup>61</sup>	-0.028	0.020	-0.028	0.007

\* Monomorphic in European cohorts. \*\* Reported statistics from the in the meta-analysis of European populations. \*\*\* Reported statistics from the meta-analysis in the 30-45 age-strata.

# Supplemental data

# **COHORTS SHORT DESCRIPTION**

### 1982 Pelotas Birth Cohort Study:

The 1982 Pelotas (Brazil) Birth Cohort Study is a longitudinal population-based birth cohort. The maternity hospitals in Pelotas, a southern Brazilian city (current population ~330,000), were visited daily in the year of 1982. The 5,914 live-borns whose families lived in the urban area were examined and their mothers interviewed. Information was obtained for more than 99% of the livebirths. These subjects have been followed-up at the following mean ages: 11.3 months (all children born from January to Abril 1982; n=1457), 19.4 months (entire cohort; n=4934), 43.1 months (entire cohort; n=4742), 13.1 years (random subsample; n=715), 14.7 years (systematic subsample; n=1076); 18.2 (male cohorts attending to compulsory Army recruitment examination; n=2250), 18.9 (systematic subsample; n=1031), 22.8 years (entire cohort; n=4297) and 30.2 years (entire cohort; n=3701). Details about follow-up visits and available data can be found in the two Cohort Profile papers (1, 2). DNA samples (collected at the mean age of 22.8 years) were genotyped for ~2.5 million of SNPs using the Illumina HumanOmni2.5-8v1 array (which includes autosomal, X and Y chromosomes, and mitochondrial variants). After quality control, the data were pre-phased using SHAPEIT and imputed using IMPUTE2 based on 1000 Genomes haplotypes.

### Avon Longitudinal Study of Parents and their Children (ALSPAC):

The Avon Longitudinal Study of Parents and their Children (ALSPAC) is a longitudinal population-based birth cohort that recruited pregnant women residing in Avon, UK, with an expected delivery date between 1st April 1991 and 31st December 1992. Ethical approval for the study was obtained from the ALSPAC Ethics and Law Committee and the Local Research Ethics Committees. This cohort is described in detail on the website (http://www.alspac.bris.ac.uk) and elsewhere (3) and the total body DXA measures and cohort analyzed in the present paper are described in Kemp et al. (2014) (4). Please note that the study website contains details of all the data that is available through a fully searchable data dictionary (http://www.bris.ac.uk/alspac/researchers/data-access/data-dictionary/).

## Bone Mineral Density in Childhood Study (BMDCS):

The Bone Mineral Density in Childhood Study is an ongoing longitudinal study in which boys and girls aged 6-16 year old were recruited between 2002-2003, and whose DXA measurements are obtained annually at five clinical centers in the United States (5, 6).

### **BPROOF**:

B-PROOF is a trial investigating the effect of 2-year supplementation with 400 mcg folic acid and 500 mcg vitamin B12 on fracture incidence in hyperhomoycsteinemic persons aged 65y and older.

### CHS:

The Cardiovascular Health Study (CHS) is a prospective investigation of risk factors for CVD in community-dwelling adults aged 65 and older. Participants were identified from Medicare-eligibility lists at four field centers in the U.S. (California, Maryland, North Carolina, and Pennsylvania). Recruitment of an original cohort of 5,201 participants occurred in 1989-90, followed by a supplemental cohort of 697 predominantly African-American individuals in 1992-93. At the exam in 1994-5 1,563 participants underwent DXA using the array beam mode QDR 2000 or 2000+ bone densitometers (Hologic, Inc., Bedford, MA) according to a standardized protocol. See, (7), for a description of the cohort.

## Copenhagen Prospective Studies on Asthma (COPSAC) cohort:

The Copenhagen Prospective Studies on Asthma in Childhood is a clinical study. All mothers had a history of a doctor's diagnosis of asthma after 7 years of age. Newborns were enrolled in the first month of life, as previously described in detail (8). The Ethics Committee for Copenhagen and the Danish Data Protection Agency approved this study.

### deCODE genetics BMD study:

The deCODE genetics BMD study is an ongoing population based study of all subjects who have undergone a DEXA-Hologic bone mineral density scan at the Landspitali University Hospital, Reykjavik, Iceland. The study samples have been previously described in detail (9). All participants gave informed consent and the study was approved by the Data Protection Commission of Iceland and the National Bioethics Committee of Iceland.

### EPIC NorFolk:

The European Prospective Investigation of Cancer (EPIC) began as a large multi-centre cohort study primarily looking at the connection between diet, lifestyle factors and cancer, although the study was broadened from the outset to include other conditions. EPIC-Norfolk is part of a Europe-wide programme (http://www.srl.cam.ac.uk/epic/international/index.shtml). With the help of over 30,000 people living in Norfolk, the aim of the study is to provide data-based evidence for health policies to prevent or delay disease onset and maintain health and independence in older people. EPIC-Norfolk participants are men and women who were aged between 40 and 79 when they joined the study and who lived in Norwich and the surrounding towns and rural areas. They have been contributing information about their diet, lifestyle and health through questionnaires and health checks over two decades.

#### ERF:

Erasmus Rucphen Family study (ERF) is a family-based cohort study that includes inhabitants of a genetically isolated community in the South-West of the Netherlands, studied as part of the Genetic Research in Isolated Population (GRIP) program. ERF includes over 3,000 individuals who are living descendants of 22 couples, who had at least six children baptized in the community church, and their spouses. All data were collected between June 2002 and February 2005. The population shows minimal

immigration and high inbreeding, therefore frequency of rare alleles is increased in this population. All participants gave informed consent, and the Medical Ethics Committee of the Erasmus University Medical Centre, approved the study.

### FENLAND:

The Fenland study is a population-based cohort study that uses objective measures of disease exposure to investigate the influence of diet, lifestyle and genetic factors on the development of diabetes and obesity. The volunteers are recruited from general practice lists in and around Cambridgeshire (Cambridge, Ely, and Wisbech) in the United Kingdom from birth cohorts from 1950–1975 (10).

#### FHS:

The Framingham Osteoporosis Study (FOS) / Framingham Heart Study (FHS) is a family-based, multigenerational cohort study initiated originally to study the risk factors for cardiovascular disease. (11). The FHS was initiated in 1948 to study determinants of cardiovascular disease and other major illnesses. The Original Cohort included 5,209 men and women, aged 28-62 years at enrolment who have undergone routine biennial examinations (12, 13). In 1971, Offspring of the Original Cohort participants and Offspring spouses including 5,124 men and women, aged 5 to 70 years, were enrolled into the Framingham Offspring Study. Offspring participants have been examined approximately every 4 years (14, 15). In the 1990s, DNA was obtained for genetic studies from surviving Original Cohort and Offspring participants. The body composition measurements used in this analysis have been previously

### The Generation R Study:

The Generation R Study is a multiethnic prospective cohort study in which 9,778 pregnant women living in Rotterdam and with delivery date from April 2002 until January 2006 were enrolled. Details of study design and data collection can be found elsewhere (16). Genotype and imputation of this cohort are described elsewhere (17).

### GOOD Study:

The Gothenburg Osteoporosis and Obesity Determinants (GOOD) study was initiated to determine both environmental and genetic factors involved in the regulation of bone and fat mass. The GOOD study is a population-based cohort in which male subjects from between 18 and 20 years of age in the Gothenburg area in Sweden were randomly selected using national population registers and invited to participate in this initiative by phone. From the selected candidates 1,068 agreed to participate providing oral and written informed consent. The GOOD study was approved by the local ethics committee at Gothenburg University (18).

#### HABC:

A population based, prospective cohort study of well-functioning, unrelated men and women aged 70 and older. It was initiated to assess changes in body composition. A detailed description of this cohor can be found elsewhere (19-21).

#### MROS USA:

The Osteoporotic Fractures in Men (MrOS) Study is a multi-center prospective, longitudinal, observational study of risk factors for vertebral and all non-vertebral fractures in older men, and of the sequelae of fractures in men (22, 23). The original specific aims of the study include: (1) to define the skeletal determinants of fracture risk in older men, (2) to define lifestyle and medical factors related to fracture risk, (3) to establish the contribution of fall frequency to fracture risk in older men, (4) to determine to what extent androgen and estrogen concentrations influence fracture risk, (5) to examine the effects of fractures on quality of life, (6) to identify sex differences in the predictors and outcomes of fracture, (7) to collect and store serum, urine and DNA for future analyses as directed by emerging evidence in the fields of aging and skeletal health, and (8) define the extent to which bone mass/fracture risk and prostate diseases are linked. The MrOS Study enrolled 5,994 community dwelling, ambulatory men aged 65 years or older from six communities in the United States (Birmingham, AL; Minneapolis, MN; Palo Alto, CA; Monongahela Valley near Pittsburgh, PA; Portland, OR; and San Diego, CA) between 2000 and 2002. Inclusion criteria were designed to provide a study cohort that is representative of the broad population of older men. The inclusion criteria were: (1) ability to walk without the assistance of another, (2) absence of bilateral hip replacements, (3) ability to provide self-reported data, (4) residence near a clinical site for the duration of the study, (5) absence of a medical condition that (in the judgment of the investigator) would result in imminent death, and (6) ability to understand and sign an informed consent. To qualify as an enrollee, the participant had to provide written informed consent, complete the self-administered questionnaire (SAQ), attend the clinic visit, and complete at least the anthropometric, DXA, and vertebral X-ray procedures. There were no other exclusion criteria. Written informed consent was obtained from all participants, and the Institutional Review Board at each study site approved the study.

Whole body total BMD (g/cm<sup>2</sup>) and head BMD (g/cm<sup>2</sup>) was measured using dual energy x-ray absorptiometry (DXA) (Hologic, Inc., MA) using Hologic QDR 4500 workstations at the baseline clinic visit. A central quality control lab, certification of DXA operators, and standardized procedures for scanning were used to insure reproducibility of DXA measurements. At baseline, a Hologic whole body phantom was circulated and measured at the 6 clinical sites. The variability across clinics was within acceptable limits, and cross-calibration correction factors were not required.

### NEO:

The NEO was designed for extensive phenotyping to investigate pathways that lead to obesity-related diseases. The NEO study is a population-based, prospective cohort study that includes 6,671 individuals aged 45–65 years, with an oversampling of individuals with overweight or obesity. At baseline, information on demography, lifestyle, and medical history have been collected by questionnaires. In addition, samples of 24-h urine, fasting and postprandial blood plasma and serum, and DNA were collected.

### **OPRA**:

The Osteoporosis Risk Assessment Cohort (OPRA) cohort recruited Swedish women aged 75, at which time age-related bone loss is already obvious and fractures prevalent. The study was designed to investigate genetic and lifestyle factors contributing to osteoporosis and fracture risk. Of 1604 women invited between December 1995 and May 1999, 1044 (65%) attended at baseline. No exclusion criteria were applied. All participants answered a detailed questionnaire regarding their general health; BMD and body composition was assessed by DXA. All participants gave written informed consent and the Lund University Ethics Committee approved the study.

### **ORCADES**:

The Orkney Complex Disease Study is an ongoing family-based genetic epidemiology collection in the isolated Scottish archipelago of Orkney. Genetic diversity in this population is decreased compared to Mainland Scotland, consistent with the high levels of endogamy historically. Fasting blood samples were collected and over 300 health-related phenotypes and environmental exposures were measured in each individual. All participants gave informed consent and the study was approved by Research Ethics Committees in Orkney and Aberdeen.

#### PANIC:

The Physical Activity and Nutrition in Children (PANIC) study is a controlled physical activity and dietary intervention study in a population sample of 506 Finnish children aged 6-8 years at baseline in 2007-2009. Ethical approval was obtained from the Research Ethics Committee of the Hospital District of Northern Savo. All children and their parents gave their written informed consent (24). (http://www.uef.fi/en/web/physical-activity-and-nutrition-in-children/home)

### RAINE:

The Raine (West Australian Pregnancy Cohort) Study is a longitudinal population-based pregnancy cohort study, which recruited 2,900 pregnant women from the public antenatal clinic at King Edward

Memorial Hospital and surrounding private clinics in Perth, Western Australia between May 1989 and November 1991 (25). Of the 2868 live births, 1183 had a whole body DXA at 20 years (26).

# Rotterdam Study:

The Rotterdam Study is a prospective cohort study of chronic disabling conditions in Dutch elderly individuals that started in 1990 in Ommoord, a suburb of Rotterdam, among 10,994, men and women aged 55 and over (27).

### SOF:

The Study of Osteoporotic Fractures (SOF) is a prospective multicenter study of risk factors for vertebral and non-vertebral fractures (28). The cohort is comprised of 9,704 community-dwelling women 65 years old or older recruited from populations-based listings in four U.S. areas: Baltimore, Maryland; Minneapolis, Minnesota; Portland, Oregon; and the Monongahela Valley, Pennsylvania. The SOF participants were followed up every four months by postcard or telephone to ascertain the occurrence of falls, fractures and changes in address. To date, follow-up rates have exceeded 95% for vital status and fractures. All fractures are validated by x-ray reports or, in the case of most hip fractures, a review of pre-operative radiographs. The inclusion criteria were: 1) 65 years or older, (2) ability to walk without the assistance of another, (3) absence of bilateral hip replacements, (4) ability to provide self-reported data, (5) residence near a clinical site for the duration of the study, (6) absence of a medical condition that (in the judgment of the investigator) would result in imminent death, and (7) ability to understand and sign an informed consent.

This study used whole body total BMD (g/cm<sup>2</sup>) and head BMD (g/cm<sup>2</sup>) measured using dual energy x-ray absorptiometry (DXA) (Hologic, Inc., MA) using Hologic QDR 2000 workstations at the sixth clinic visit. Scans were performed and analyzed at each clinic. Review of scans was done at the UCSF Coordinating Center on random subsets of scans and on problematic scans identified by technicians at the clinic. Some scans were deemed unacceptable and are not included in the data or are set to a special missing value code.

## TwinsUK:

The UK Adult Twin Registry (TwinsUK) (www.twinsuk.ac.uk/) was started in 1993 and is comprised of ~12,000 monozygotic and dizygotic twins (83% female) aged 16-85 years recruited by successive media campaigns from all over the UK without selection for any particular disease or trait. The cohort is from Northern European/UK ancestry and has been shown to be representative of singleton populations and the UK population in general (26). All twins received a series of detailed disease and environmental questionnaires and the majority have been assessed in detail clinically at several time points for several hundred phenotypes related to common diseases or intermediate traits. The primary focus of the study has been the genetic basis of healthy aging process and complex diseases, including cardiovascular, metabolic, musculoskeletal, and ophthalmologic disorders.

### UKBB:

In 2006-2010, the UK Biobank recruited 502,647 individuals aged between 37-76 years (99.5% were 40-69 years) from across the country. Each participant provided information regarding their health and lifestyle using touch screen questionnaires, physical measurements and agreement to have their health followed and they also provided blood, urine and saliva samples for future analysis. UK Biobank has ethical approval from the Northwest Multi-centre Research Ethics Committee (MREC) and informed consent was obtained from all participants.

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### ALSPAC Study:

We are extremely grateful to all the families who took part in this study, the midwives for their help in recruiting them, and the whole ALSPAC team, which includes interviewers, computer and laboratory technicians, clerical workers, research scientists, volunteers, managers, receptionists, and nurses. GWAS data was generated by Sample Logistics and Genotyping Facilities at the Wellcome Trust Sanger Institute and LabCorp (Laboratory Corporation of America) using support from 23andMe. The UK Medical Research Council and the Wellcome Trust (Grant ref: 102215/2/13/2) and the University of Bristol provide core support for ALSPAC. This publication is the work of the authors, and JPK and DME will serve as guarantors for the contents of this paper.. This work is supported by a Medical Research Council program grant (MC\_UU\_12013/4 to D.M.E). D.M.E is supported by an Australian Research Council Future Fellowship (FT130101709).

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### **BPROOF**:

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### Rotterdam Study:

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### SOF:

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## Twins UK:

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## Functional Group:

C Ackert-Bicknell: National Institute of Health /National Institute of Arthritis Musculoskeletal and Skin Diseases grant number AR060981.

JH Duncan Bassett: Molecular Endocrinology Laboratory, Department of Medicine, Imperial College London, London, UK/ Wellcome Trust Strategic Award 101123/Z/13/A

Graham R Williams: Molecular Endocrinology Laboratory, Department of Medicine, Imperial College London, London, UK/ Wellcome Trust Strategic Award 101123/Z/13/A

### **SUPPLEMENTAL FIGURES**

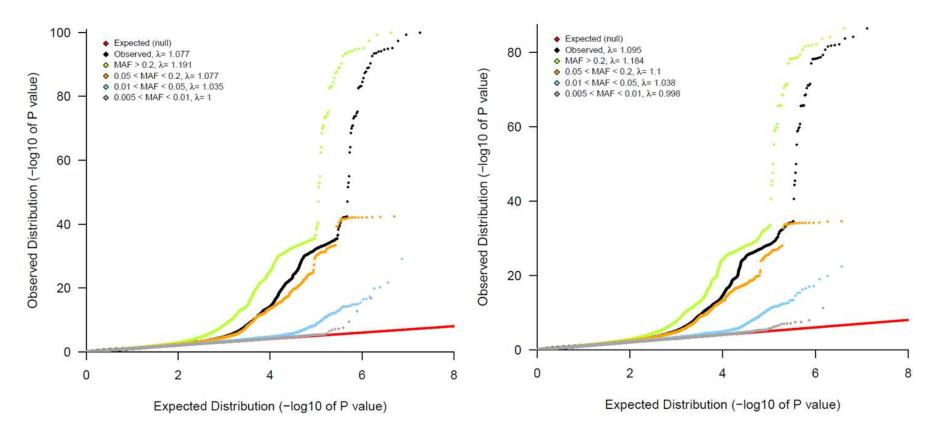
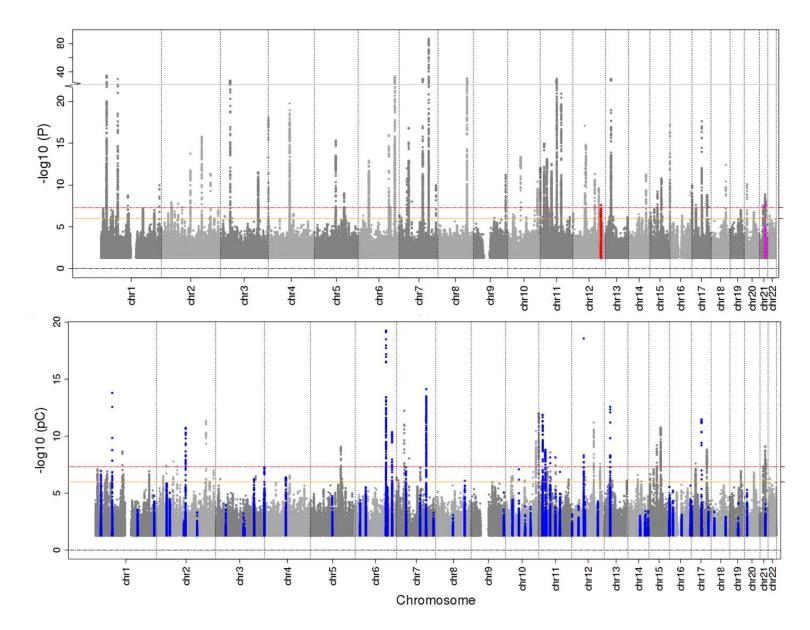


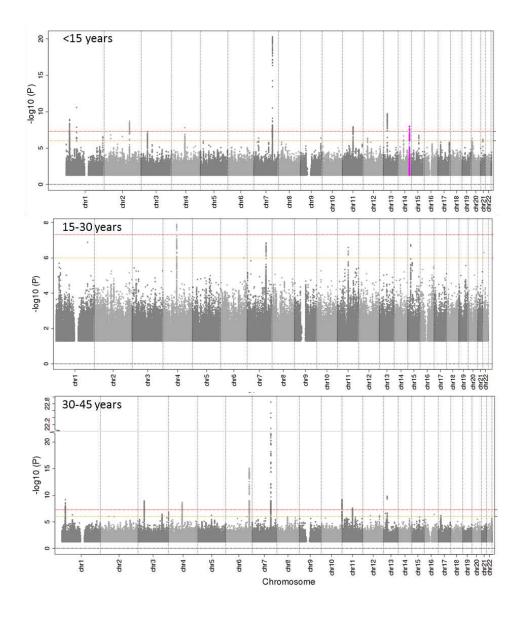
Figure S1. QQ-Plots for the genome-wide association study of TB-BMD. Left panel: Including studies regardless the ethnic background of the participants (N=66, 628). Right panel: Including only studies of European ancestry (N=56, 284).



**Figure S2. Manhattan plots of association statistics (-log10(P values)) for TB-BMD only-European meta-analysis**. Each dot represents a SNP and the x-axis indicates its chromosomal position (Build 37 NCBI). Dashed horizontal red and yellow lines mark the GWS threshold ( $P<5x10^{-8}$ ) and suggestive threshold ( $P<1x10^{-6}$ ), respectively. **Top**: The association P-value (on  $-\log_{10}$  scale) in the meta-analysis including only studies comprising individuals of European ancestry. Loci only reaching significance in this analysis are highlighted: the novel 19q12 in red and the known 21q22.13 in magenta. **Bottom:** The association P-value (on  $-\log_{10}$  scale) after conditional analysis on all variants. Highlighted in blue previously reported loci (SNPs within ±500Kb of leading SNPs in previous GWAS with different bone traits).

**Figure S3. Regional Plots for all novel loci associated with TB-BMD (P<5x10<sup>-8</sup>).** Circles show GWAS meta-analysis P-values and position of SNPs for the overall meta-analysis (N=66,628) unless stated otherwise. Different colors indicate varying degrees of pair-wise linkage disequilibrium with the top marker (1000 Genomes – CEU population, except for 11p13 in which AFR was the reference population). Locus 11p.13 (chr11:35481152–36481152) association is driven by association in non-European populations [S]. Locus 12q24.21 reached significance in the only-European meta-analysis (N=56,284) [Y]. Locus 19q12 reached significance only in the 45-60 age-bin meta-analysis (N=18,805)[Ff]. **Attached file.** 

**Figure S4. Forest Plots for all novel loci associated with TB-BMD (P<5x10<sup>-8</sup>).** Effect estimates for the leading SNPs of the 36 novel BMD loci in the overall meta-analysis. Novel loci detected in the overall and subgroup meta-analyses are displayed. Symbol size proportional to the inverse variance of the SNP main effect. **Attached file** 



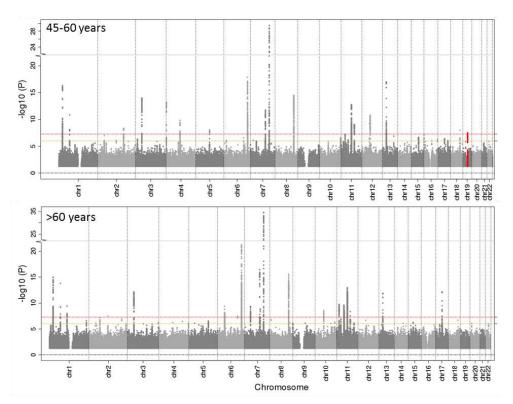
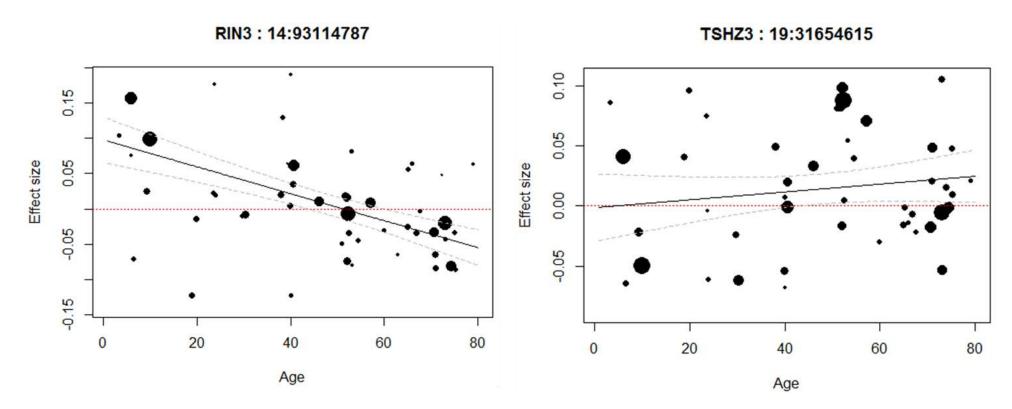
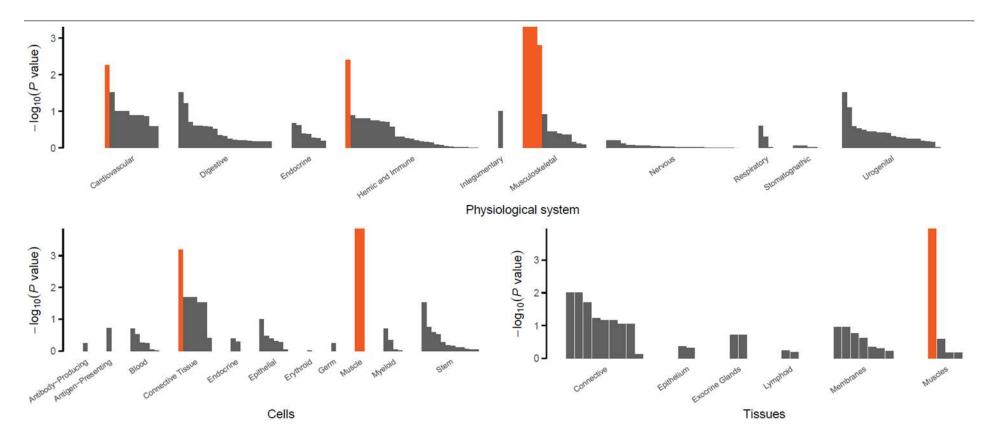


Figure S5. Manhattan plots of association statistics (-log10(P values)) for TB-BMD metaanalyses per age bin. Each dot represents an SNP and the x-axis indicates its chromosomal position (Build 37 NCBI). Dashed horizontal red and yellow lines mark the GWS threshold (P<5x10<sup>-8</sup>) and suggestive threshold (P<1x10<sup>-6</sup>), respectively. Sample sizes vary across the different age bins. <15 years; N= 1,870. 15-30 years; N=4,180. 30-45 years; N=10,062. 45-60 years; N= 18,805. >60 years N=22,504. Highlighted in red the age-specific signals: In red the novel locus 19q2 (45-60 years) and in magenta the known 14q32.12 locus (<15 years).



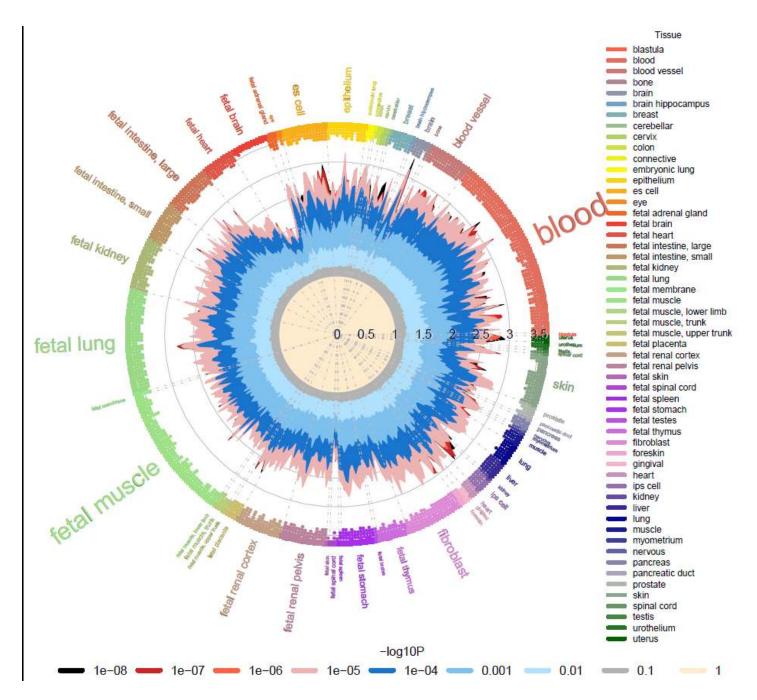
**Figure S6. Meta-regression for GWS signals rising exclusively from an age-bin analysis. Left panel**: Leading SNP of the signal mapping to 14q32.12 TB-BMD GWS associated only in the <15 years bin (N=11,870). **Right panel**: Leading SNP of the signal mapping to 19q12 TB-BMD GWS associated only in the 45-60 years bin (N=18,805). Each circle represents a study subgroup (i.e., study divided in age strata), with the circle size proportional to the inverse variance of the SNP main effect. At the left, estimates from each age-bin meta-analysis, with the symbol size proportional to the inverse variance of the SNP main effect.

**Figure S7. Meta-regression for nominally significant signals in the meta- regression. Left panel**: In total for 42 suggestive signals in the overall meta-analysis (P<5x10<sup>-6</sup>) we found nominal evidence of an age-dependent effect of the associated variants. Meta-regression plots for each of the leading SNPs are shown. Each circle represents a study subgroup (i.e., study divided in age strata), with the circle size proportional to the inverse variance of the SNP main effect. At the left, estimates from each age-bin meta-analysis, with the symbol size proportional to the inverse variance of the SNP main effect.

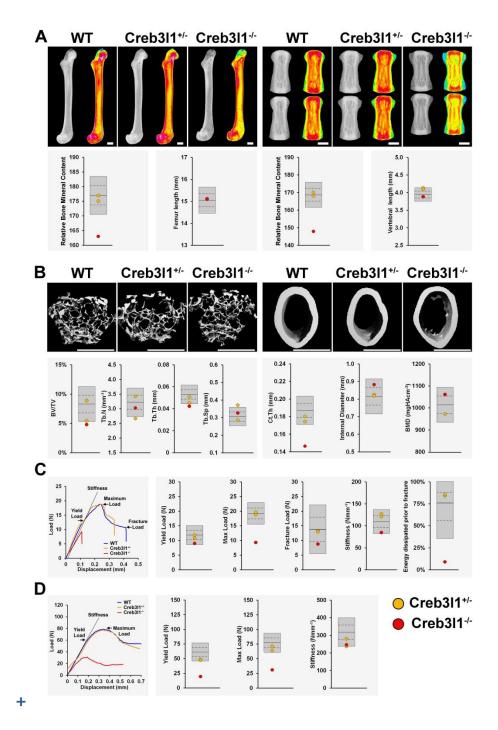


**Figure S8. Depict results for cell/tissue enrichment analysis of novel TB-BMD associated regions**. Bars represent the level of evidence for genes in the associated loci to be expressed in any of the 209 Medical Subject Heading (MeSH) tissue and cell type annotations. Highlighted in orange are these cell/tissue types significantly (FDR<5%) enriched for the expression of the genes in the associated loci

.



**Figure S9. GARFIELD functional enrichment analyses.** The wheel plot displays functional enrichment for associations with TB-BMD within DHS hotspot regions in ENCODE and Roadmap Epigenomics studies. The radial axis shows fold enrichment calculated at each of eight GWAS P-value thresholds ( $P < 1 \times 10^{-1}$  to  $P < 1 \times 10^{-8}$ ) for each of 424 cell types. Cell types are sorted by tissue, represented along the outside edge of the plot with font size proportional to the number of cell types from that tissue. Fold enrichment values at the different thresholds are plotted with different colors inside the plot (indicated at the bottom of the figure). Dots along the inside edge of the plot denote significant enrichment (if present;  $P < 1 \times 10^{-4}$ ) for a given cell type at  $P < 1 \times 10^{-5}$  (outermost dot) to  $P < 1 \times 10^{-8}$  (innermost dot). Results show overall well-spread enrichment.



**Figure S10. Skeletal phenotype screening of Cyclic AMP-responsive element-binding protein 3-like 1 (Creb11) knockout mice.** Decreased bone mass and strength in adult Creb3l1 knockout mice. **A.** X-ray microradiography (Faxitron MX20) of femur and caudal vertebrae from female wild-type (WT), heterozygous (*Creb3l1<sup>+/-</sup>*) and homozygous (*Creb3l1<sup>-/-</sup>*) knockout mice at postnatal day 112 (P112). Pseudocolored grey-scale images in which low bone mineral content (BMC) is blue/green and high BMC is pink. Reference ranges are derived from >300 WT mice of identical age, sex and genetic background (C57BL/6), mean (solid line), 1.0SD (dotted lines) and 2.0SD (grey box). Values for parameters from individual animals are shown as orange dots (*Creb3l1<sup>+/-</sup>* n=2) and red dots (*Creb3l1<sup>-/-</sup>* n=1). Scale bar: 1mm. **B.** Micro-CT images (Scanco MicroCT-50) of proximal femur trabecular bone (left) and mid-diaphysis cortical bone (right) from WT, *Creb3l1<sup>+/-</sup>* and *Creb3l1<sup>-/-</sup>* mice. Graphs showing trabecular bone volume/tissue volume (BV/TV), trabecular number (Tb.N), trabecular thickness (Tb.Th), trabecular spacing (Tb.Sp), cortical thickness (Ct.Th), internal cortical diameter and cortical bone mineral density (BMD). Scale bar: 1mm. **C**. Representative load displacement curves from destructive 3-point bend testing (Instron 5543 load frame) of WT, *Creb3l1<sup>+/-</sup>* and *Creb3l1<sup>-/-</sup>* femurs. Yield load, maximum load, fracture load, stiffness and energy dissipated prior to fracture (Toughness). **D.** Representative load displacement curves from destructive compression testing (Instron 5543 load frame) of WT, *Creb3l1<sup>+/-</sup>* and *Creb3l1<sup>-/-</sup>* caudal vertebra showing yield load, maximum load, and stiffness.

# **SUPPLEMENTAL TABLES**

Table S1. Descriptives per cohort of genotype data for analysis. Attached Excel file

Table S2. Participant description per cohort and age strata. Attached Excel file

CHR	BP Rsid	locus	Phenotype	Reference	A1	EAF	beta_TB	P_TB	beta_LS	P_LS	beta_FN	P_FN
1	22490724 rs 7521902	1p36.12	FN-BMD, LS-BMD	Estrada et al.	A	0.24	-0.066	3.32E-23	-0.034	0.002	-0.037	6.60E-05
1	22711473 rs 6426749	1p36.12	FN-BMD, LS-BMD	Estrada et al.	С	0.18	0.101	2.73E-42	0.088	1.2E-13	0.082	5.9E-16
1	68639385 rs17482952	1p31.3	FN-BMD, LS-BMD	Estrada et al.	G	0.08	-0.065	8.21E-10	-0.045	0.008	-0.043	0.003
1	68647716 rs12407028	1p31.3	FN-BMD, LS-BMD	Estrada et al.	С	0.38	-0.051	1.10E-18	-0.063	4.3E-12	-0.046	5.07E-09
1	172199573 rs479336	1q24.3	FN-BMD	Estrada et al.	G	0.28	0.032	1.18E-06	0.034	9.74E-04	0.043	9.08E-07
1	240597214 rs9287237	1q43	Trabecular vBMD	Paternoster et al.	т	0.17	0.056	3.29E-12	0.037	0.002	0.039	1.47E-04
2	42250549 rs7584262	2p21	FN-BMD	Estrada et al.	Т	0.24	0.033	5.41E-07	0.009	0.392	0.044	1.34E-06
2	54659707 rs 4233949	2p16.2	LS-BMD	Estrada et al.	С	0.37	0.031	2.47E-07	0.055	1.49E-03	0.044	0.002
2	112500035 rs17040773	2q13	FN-BMD	Estrada et al.	С	0.22	-0.021	0.008	-0.004	0.714	-0.023	0.012
2	119038598 rs 1878526	2q14.2	LS-BMD	Estrada et al.	A	0.22	0.012	0.092	0.038	4.29E-04	0.006	0.529
2	119154872 rs 6542457	2q14.2	LS-BMD	Zheng et al.	C T	0.09	0.048	2.19E-05	0.083	6.53E-06	-0.005	0.757
2	119545994 rs11692564 166601046 rs1346004	2q14.2	LS-BMD	Zheng et al.	Т	0.01	0.229	7.09E-15	0.238	4.1E-09	0.116	7.23E-04 7.15E-14
2 3	41128564 rs 430727	2q24.3 3p22.1	FN-BMD, LS-BMD FN-BMD, LS-BMD	Estrada et al. Estrada et al.	A T	0.47 0.45	-0.051 -0.070	3.62E-19 1.53E-34	-0.052 -0.056	8.7E-09 5.3E-10	-0.058 -0.061	7.15E-14 2.02E-15
3	113370010 rs 1026364	3q13.2	FN-BMD	Estrada et al.	Ť	0.45	0.023	1.50E-04	0.013	0.171	0.024	0.003
3	118183783 rs 1949542	3q13.2	INT-BMD, TRO-BMD	Pei et al.	A	0.40	0.025	0.282	-0.013	0.171	-0.019	0.005
3	156555984 rs 344081	3q25.31	LS-BMD	Estrada et al.	C	0.16	-0.056	7.40E-12	-0.047	4.28E-04	-0.035	0.002
4	994414 rs 3755955	4p16.3	FN-BMD, LS-BMD	Estrada et al.	A	0.16	-0.074	2.10E-19	-0.049	5.05E-05	-0.044	2.87E-05
4	88773849 rs 6532023	4q22.1	FN-BMD, LS-BMD	Estrada et al.	т	0.34	0.060	1.31E-23	0.048	2.34E-07	0.034	2.78E-05
5	88376061 rs1366594	5q14.3	FN-BMD	Estrada et al.	С	0.49	-0.048	2.35E-17	-0.007	0.435	-0.079	5.44E-25
6	21384613 rs9466056	6p22.3	FN-BMD, LS-BMD	Estrada et al.	А	0.39	-0.028	1.90E-06	-0.039	1.81E-05	-0.038	8.86E-07
6	44639184 rs11755164	6p21.1	LS-BMD	Estrada et al.	Т	0.41	-0.041	7.13E-12	-0.024	0.010	-0.013	0.108
6	127167072 rs13204965	6q22.33	FN-BMD, LS-BMD	Estrada et al.	С	0.23	-0.062	1.02E-18	-0.039	2.81E-04	-0.052	1.39E-08
6	133350936 rs 3012465	6q23.2	Skull BMD	Kemp et al.	А	0.33	-0.022	2.61E-04	0.016	0.079	0.025	0.002
6	151895456 rs 6909279	6q25.1	Cortical vBMD	Paternoster et al.	G	0.44	-0.072	2.52E-35	-0.055	1.3E-09	-0.051	8.07E-11
6	151907748 rs4869742	6q25.1	FN-BMD, LS-BMD	Estrada et al.	Т	0.33	-0.070	5.20E-30	-0.061	2.8E-08	-0.052	1.75E-08
6	151946658 rs7751941	6q25.1	FN-BMD, LS-BMD	Estrada et al.	A	0.21	-0.044	1.45E-10	-0.059	9.8E-08	-0.031	0.001
7	37938422 rs 10226308	7p14.1	LS-BMD	Estrada et al.	G	0.18	0.033	1.06E-05	0.059	2.48E-07	0.025	0.012
7 7	38128326 rs 6959212	7p14.1	FN-BMD, LS-BMD	Estrada et al.	T G	0.34 0.32	-0.043 -0.073	7.34E-13 6.07E-33	-0.066 -0.059	2.6E-12	-0.033 -0.063	5.12E-05
7	96120675 rs 4727338 120742980 rs 148771813	7q21.3 7q31.31	FN-BMD, LS-BMD FA-BMD	Estrada et al. Zheng et al.	T	0.52	-0.073	7.88E-04	-0.039	5.8E-10 0.006	-0.063	5E-15 0.798
7	120742980 1314877181 120785064 rs13245690	7q31.31	LS-BMD	Estrada et al.	G	0.01	-0.057	4.06E-22	-0.028	0.000	-0.023	0.003
7	120903815 rs 4609139	7q31.31	TB-BMD	Medina-Gomez et al.	т	0.35	-0.046	1.17E-14	-0.015	0.002	-0.013	0.114
7	120974765 rs 3801387	7q31.31	FN-BMD	Estrada et al.	G	0.27	0.135	1.15E-100	0.073	1.7E-13	0.054	3.26E-10
7	150919829 rs7812088	7q36.1	FN-BMD	Estrada et al.	A	0.12	0.058	3.54E-11	0.035	0.010	0.044	1.61E-04
8	71591203 rs 7017914	8q13.3	Fem FN-BMD	Estrada et al.	G	0.48	-0.008	0.151	0.011	0.219	-0.016	0.045
8	120007420 rs 2062377	8q24.12	FN-BMD, LS-BMD	Estrada et al.	т	0.41	0.064	1.47E-28	0.081	6.6E-19	0.060	1.64E-14
9	133478827 rs7851693	9q34.11	FN-BMD	Estrada et al.	G	0.35	-0.046	5.73E-14	-0.017	0.074	-0.040	9.62E-07
10	28479942 rs 3905706	10p12.1	LS-BMD	Estrada et al.	Т	0.23	0.009	0.176	0.055	7.69E-07	-0.014	0.157
10	54427825 rs1373004	10q21.1	FN-BMD, LS-BMD	Estrada et al.	т	0.15	-0.067	1.22E-14	-0.056	1.10E-04	-0.045	2.81E-04
10	79401316 rs7071206	10q22.3	LS-BMD	Estrada et al.	С	0.21	0.016	0.027	0.053	8.60E-07	-0.014	0.122
10	101813802 rs 7084921	10q24.2	FN-BMD	Estrada et al.	Т	0.41	0.024	3.94E-05	0.018	0.043	0.026	9.35E-04
11	15710084 rs 7108738	11p15.1	FN-BMD	Estrada et al.	G	0.18	0.056	9.06E-14	0.043	2.05E-04	0.083	8.07E-17
11	16296412 rs1347677	11p15.1	Hip BMD	Yang TL et al.	С	0.21	0.045	5.41E-11	0.030	0.006	0.039	3.37E-05
11	27505677 rs 10835187	11p14-p13		Estrada et al.	C	0.48	0.044	4.38E-14		0.004	0.009	0.275
11	30951674 rs163879 46722221 rs7932354	11p14.1	FN-BMD, LS-BMD	Estrada et al. Estrada et al.	C T	0.34	0.031	3.02E-07	0.039	6.17E-05	0.018	0.026
11 11	68201295 rs 3736228	11p11.2 11q13.2	FN-BMD, LS-BMD FN-BMD, LS-BMD	Estrada et al.	T T	0.34 0.15	0.043 -0.102	9.33E-12 5.03E-34	0.036 -0.078	4.23E-04 2.9E-10	0.041 -0.049	1.64E-06 4.79E-06
11	68263370 rs 12272917	11q13.2 11q13.2	SK-BMD	Kemp et al.	c	0.15	-0.102	2.74E-31	-0.078	4.6E-13	-0.045	4.79E-00 2.89E-07
11	86853997 rs 597319	11q13.2 11q14.2	BUA and VOS	Moayyeri et al.	G	0.32	-0.055	1.72E-19	-0.042	1.25E-05	-0.026	0.002
12	1638171 rs 2887571	12p13.33	FN-BMD, LS-BMD	Estrada et al.	G	0.24	0.038	6.83E-09	0.034	8.57E-04	0.022	0.012
12	28017159 rs 7953528	12p11.22	FN-BMD	Estrada et al.	А	0.17	0.018	0.019	-0.011	0.349	0.038	1.35E-04
12	49474605 rs 12821008	12q13.12	LS-BMD	Estrada et al.	т	0.38	0.034	1.94E-08			0.012	0.525
12	53727955 rs 2016266	12q13.13	FN-BMD, LS-BMD	Estrada et al.	G	0.34	0.048	1.55E-15	0.056	6.7E-09	0.039	1.89E-06
12	54417576 rs736825	12q13.13	FN-BMD, LS-BMD	Estrada et al.	G	0.37	-0.017	4.09E-03	-0.062	2.7E-11	-0.043	8.70E-08
12	107367225 rs1053051	12q23.3	FN-BMD	Estrada et al.	С	0.49	0.032	2.46E-08	0.024	0.006	0.023	0.003
13	42951449 rs9533090	13q14.11	FN-BMD, LS-BMD	Estrada et al.	Т	0.45	-0.060	1.09E-25	-0.082	5.2E-20	-0.035	6.19E-06
13	43116133 rs1021188	13q14.11	Cortical BMD	Paternoster et al.	С	0.19	-0.037	5.79E-07	-0.026	0.024	-0.020	0.051
14	70456699 rs 227425	14q24.2	LS-BMD	Zhang et al.	G	0.49	-0.013	0.026	-0.035	1.13E-04	-0.010	0.185
14	91442779 rs 1286083	14q32.11	FN-BMD, LS-BMD	Estrada et al.	C	0.20	0.053	1.95E-13	0.065	1E-08	0.038	7.66E-05
14	93114787 rs 754388	14q32.12	TB-BMD, LL-BMD	Kemp et al.	A	0.17	-0.010	0.167	-0.007	0.543	-0.004	0.670
14 16	103883633 rs 11623869	14q32.32	FN-BMD, LS-BMD	Estrada et al.	T T	0.34	-0.029	1.11E-06	-0.020	0.029	-0.029	2.96E-04
16 16	375782 rs 9921222	16p13.3	FN-BMD, LS-BMD	Estrada et al. Estrada et al	T	0.48 0.44	-0.048	1.76E-17	-0.053 -0.027	3.2E-09 0.003	-0.050 -0.039	6.36E-11 8 33E-07
16 16	1532463 rs13336428 15129459 rs4985155	16p13.3 16p13.11	FN-BMD, LS-BMD FN-BMD, LS-BMD	Estrada et al. Estrada et al.	A G	0.44 0.34	-0.025 0.021	1.56E-05 4.35E-04	-0.027 0.035	0.003 2.09E-04	-0.039 0.022	8.33E-07 0.007
16	50986308 rs 1564981	16q12.1	LS-BMD	Estrada et al.	A	0.34	-0.021	4.35E-04 6.86E-06	-0.044	2.09E-04 7.95E-07	-0.032	2.38E-05
16	51021803 rs 1566045	16q12.1	FN-BMD	Estrada et al.	c	0.49	0.025	8.05E-00	0.044	0.317	0.043	2.90E-05
16	86710660 rs 10048146	16q12.1	FN-BMD, LS-BMD	Estrada et al.	G	0.18	-0.048	2.09E-10	-0.064	4.5E-08	-0.056	2.31E-08
-			,									

CHR	BP Rsid	locus	Phenotype	Reference	A1	EAF	beta_TB	P_TB	beta_LS	P_LS	beta_FN	P_FN
17	2068932 rs 4790881	17p13.3	FN-BMD, LS-BMD	Estrada et al.	С	0.29	-0.038	1.04E-09	-0.035	3.41E-04	-0.050	2.92E-09
17	41798824 rs 4792909	17q21.31	FN-BMD, LS-BMD	Estrada et al.	Т	0.40	0.039	5.96E-11	0.047	3.07E-07	0.048	1.52E-09
17	42225547 rs 227584	17q21.31	FN-BMD, LS-BMD	Estrada et al.	С	0.34	0.032	2.16E-07	0.043	4.05E-05	0.048	2.69E-08
17	43977827 rs1864325	17q21.31	LS-BMD	Estrada et al.	Т	0.21	-0.023	0.008	-0.052	2.48E-04	-0.019	0.103
17	69949016 rs 7217932	17q24.3	FN-BMD	Estrada et al.	А	0.48	0.025	1.14E-05	0.006	0.501	0.033	1.89E-05
18	13708574 rs 4796995	18p11.21	FN-BMD	Estrada et al.	G	0.37	-0.022	2.23E-04	-0.025	0.006	-0.037	2.56E-06
18	60054857 rs884205	18q21.33	FN-BMD, LS-BMD	Estrada et al.	А	0.24	-0.053	4.39E-15	-0.062	2.8E-09	-0.042	2.71E-06
19	33599127 rs 10416218	19q13.11	LS-BMD	Estrada et al.	С	0.29	0.028	1.19E-05	0.070	8.3E-09	0.042	2.93E-05
20	10639988 rs 3790160	20p12.2	FN-BMD, LS-BMD	Estrada et al.	С	0.50	-0.035	7.99E-10	-0.051	1.50E-08	-0.029	1.94E-04
21	37848334 rs 170183	21q22.13	Hip BMD-Female	Zhang et al.	G	0.50	0.026	6.80E-06	0.016	0.082	0.020	0.009

**Table S3 Known independent markers associated with bone phenotypes**. Index SNPs of the GWS association reported for the specific bone phenotype [fifth column] in the reference stated [sixth column]. All effect sizes ( $\beta$ ) are reported for the minor allele (A1). EAF=Effect Allele Frequency, TB= total body BMD, assessed in this study, LS=lumbar spine BMD, assessed in Zheng et al. , FN=Femoral Neck BMD, assessed in Zheng at al. Phenotype for which association was previously reported and the correspondent reference are given.

Table S4. Genome-wide significant SNPs for the overall TB-BMD meta-analysis. Estimates were derived from the overall approach. Beta coefficients and allele frequency (EAF) are reported for the A1 allele. Attached Excel file.

Table S5. Genome-wide significant SNPs for the TB-BMD meta-analysis in European cohorts. Estimates were derived from the all-age combined approach. Beta coefficients and allele frequency (EAF) are reported for the A1 allele. Attached Excel file.

CHR	ВР	Rsid	A1	A2	EAF	beta	P.value	HetlSq	HetPVal	N	locus	unreported
1	22700351	rs34920465	а	g	0.7968	-0.1008	9.41E-16	0	0.6114	22467	1p36.12	no
1	68656697	rs2566752	t	С	0.6119	-0.0776	1.55E-14	0	0.841	22380	1p31.3	no
1	110475971	rs7548588	t	С	0.6075	-0.0617	3.80E-10	34.4	0.07127	22324	1p13.3	yes
2	119529829	rs55983207	t	С	0.9474	-0.1409	3.37E-08	36.1	0.06437	22187	2q14.2	no
3	41171177	rs2371447	t	g	0.4846	-0.0711	6.58E-13	0	0.5362	22460	3p22.1	no
6	45144224	rs184065563	а	g	0.3052	-0.0623	7.14E-09	7.9	0.3586	22491	6p21.1	no
6	127423055	rs1936792	а	g	0.2652	0.0607	3.72E-08	20	0.2109	22458	6q22.33	no
6	151910126	rs6557155	t	g	0.428	-0.0981	5.18E-22	0	0.9731	22490	6q25.1	no
7	38136277	rs1524058	t	С	0.4044	-0.0604	7.43E-10	10.7	0.3237	22479	7p14.1	no
7	96134115	rs6465511	С	g	0.3265	-0.0849	1.16E-16	0	0.5605	22493	7q21.3	no
7	99130834	rs34670419	t	g	0.0387	-0.1603	1.40E-09	0	0.7425	22223	7q22.1	yes
7	120974765	rs3801387	а	g	0.7266	-0.1337	2.82E-35	13.3	0.2911	22423	7q31.31	no
8	120012700	rs11995824	С	g	0.4289	0.0806	2.80E-16	0	0.6858	22476	8q24.12	no
10	54425325	rs10824760	t	С	0.8217	0.0886	3.05E-09	0	0.9745	22453	10q21.1	no
11	16348061	rs7131442	а	t	0.7918	-0.0762	1.81E-10	0	0.6208	22497	11p15.1	no
11	46783435	rs61884328	t	С	0.9013	-0.1063	2.46E-10	29.7	0.1088	22502	11p11.2	no
11	68218290	rs11228240	t	C	0.254	-0.0848	1.12E-13	16.7	0.2501	22483	11q13.2	no
11	86873599	11:86873599:I	d	i	0.7333	0.0768	4.34E-09	0	0.6918	18952	11q14.2	no
13	42951449	rs9533090	t	С	0.4555	-0.0663	8.41E-12	53.8	0.002882	22493	13q14.11	no
17	41826839	rs2741856	c	g	0.0764	0.1391	7.03E-13	2.6	0.4249	22392	17q21.31	no
1	22697860	rs6679981	a ₊	g	0.1811	0.1162	4.81E-17	34.1	0.1257	18784	1p36.12	no
1 2	68656697 166618262	rs2566752 rs1968294	t t	c c	0.6056 0.4895	-0.075 -0.0632	1.42E-11 4.41E-09	0 0	0.7436 0.9458	18734 18786	1p31.3 2q24.3	no
2	41127606	rs444561	c	g	0.4893	0.0831	4.41L-09 1.02E-14	0	0.9438	18780	2q24.3 3p22.1	no no
4	1008386	rs56396408	t	Б С	0.1529	-0.1198	1.37E-13	16.2	0.2938	16206	4p16.3	no
4	88831249	rs11934731	a	g	0.6784	-0.0718	3.71E-10	0	0.7177	18802	4q22.1	no
5	88354675	rs10037512	t	c	0.5173	0.0604	2.10E-08	0	0.6152	18780	5q14.3	no
6	151910126	rs6557155	t	g	0.4255	-0.0968	1.42E-18	11.1	0.3381	18802	6q25.1	no
7	96133871	rs6465510	а	c	0.6498	0.0787	1.79E-12	0	0.464	18802	•	no
7	120974765	rs3801387	а	g	0.7348	-0.1359	3.49E-30	0	0.4875	18735	7q31.31	no
8	119946656	rs7010267	а	C	0.4438	0.0838	3.34E-15	0	0.7913	18728	8q24.12	no
11	68220905	rs57502260	а	g	0.8295	0.1088	1.81E-13	36.4	0.1075	18792	11q13.2	no
11	86880458	rs540403	а	g	0.3312	-0.0699	1.36E-09	0	0.859	18791	11q14.2	no
12	49379537	rs118115924	t	g	0.0143	-0.3132	6.10E-10	23.7	0.2178	18764	12q13.12	no
12	53659448	rs7398996	t	С	0.6855	-0.0762	1.56E-11	0	0.4527	18787	12q13.13	no
13	42969049	rs9533095	t	g	0.4647	-0.091	1.32E-17	0	0.4543	18797	13q14.11	no
18	60054857	rs884205	а	С	0.2479	-0.072	9.97E-09	0	0.532	18757	18q21.33	no
19	31654615	rs6510186	t	С	0.2602	0.0677	3.11E-08	0	0.614	18782	19q12	yes*
1	22682366	rs12742784	t	С	0.2193	0.1126	6.64E-10	0	0.6669	10049	1p36.12	no
3	41112656	rs62259232	а	g	0.4885	0.0899	1.21E-09	0	0.8597	10050	3p22.1	no
4	88852643	rs10005067	t	С	0.5212	0.0883	2.16E-09	0	0.545	10062	4q22.1	no
6	151874122	rs9478217	а	g	0.4637	-0.1173	4.33E-15	13.1	0.3249	10055	6q25.1	no
7	120983343	rs10242100	а	g	0.7296	-0.1614	8.22E-23	4.1	0.4007	10025	7q31.31	no
11	242859	rs55781332	а	g	0.7823	-0.1088	6.98E-10	8.7	0.3624	9965	11p15.5	yes
11	68218290	rs11228240	t	С	0.2576	-0.0974	2.58E-08	0	0.9399	10049	11q13.2	no
13	42965694	rs8001611	t	С	0.5404	0.0947	1.54E-10	0	0.8615	10059	13q14.11	no

4	88815986	rs77034375	t	С	0.3089	-0.1397	1.26E-08	0	0.5184	4180	4q22.1	no
1	22444975	rs10737462	t	С	0.2267	-0.0925	1.67E-09	22	0.2685	11807	1p36.12	no
1	68658266	1:68658266:I	d	i	0.4541	0.0947	2.60E-11	39.9	0.1553	11360	1p31.3	no
2	166573776	rs35969972	t	С	0.5148	0.0771	2.01E-09	26.3	0.2369	11807	2q24.3	no
4	88831249	rs11934731	а	g	0.6716	-0.0777	1.52E-08	0	0.6512	11807	4q22.1	no
7	121018857	rs917726	а	t	0.7269	-0.137	5.07E-21	36.4	0.1644	11807	7q31.31	no
11	68252123	rs12364620	t	g	0.7508	0.0848	1.29E-08	0	0.8874	11807	11q13.2	no
13	43128577	rs9525638	t	С	0.5826	-0.0844	1.90E-10	0	0.9245	11360	13q14.11	no
14	93114787	rs72699866	g	а	0.8247	0.0994	1.01E-08	54.3	0.05281	11807	14q32.12	no*

 Table S6. Index Genome-wide significant SNPs in the age-bin meta-analyses.
 Genomic coordinates are on build 37 of the human genome.

 genome.
 Beta coefficients and allele frequencies (EAF) are reported for the A1 allele.
 \* Only GWS in the particular age-bin.

**Table S7. Nominally significant variants after meta-regression analysis.** Only suggestively associated variants (P<5x10<sup>-6</sup>) in the TB-BMD overall meta-analysis were subjected to meta-regression assessment. Genomic coordinates are on build 37 of the human genome. Allele frequencies (EAF) are reported for the A1 allele. C.L-C.U, 95% Confidence interval lower and upper limit. **Attached Excel file** 

CHR	BP	locus	rsnumber	A1	EAF	beta	Р	N	betaJ	PJ
1	22484575	1p36.12	rs3971300	т	0.71	0.069	7.41E-23	57561	0.071	2.56E-24
1	22700351	1p36.12	rs34920465	А	0.82	-0.101	2.67E-35	59625	-0.103	7.68E-37
1	68635879	1p31.3	rs145119306	А	0.07	-0.026	0.03436	58593	-0.088	2.77E-11
1	68656697	1p31.3	rs2566752	т	0.61	-0.074	6.79E-31	59727	-0.091	7.06E-40
1	110480220	1p13.3	rs7364724	А	0.40	-0.038	1.84E-09	60973	-0.038	2.20E-09
1	240581653	1q43	rs12044944	т	0.19	0.052	1.06E-10	58925	0.052	8.86E-11
2	40630678	2p22.1	rs10490046	А	0.77	0.042	1.13E-08	59278	0.043	9.30E-09
2	42280066	2p21	rs78572108	А	0.13	-0.054	2.66E-08	55121	-0.054	2.35E-08
2	68962137	2p13.3	rs10048745	А	0.25	-0.041	1.76E-08	58660	-0.041	1.68E-08
2	85483350	2p11.2	rs2043230	А	0.44	0.034	4.77E-08	61631	0.034	4.59E-08
2	119507607	2q14.2	rs115242848	т	0.01	0.312	1.75E-14	35647	0.305	6.28E-14
2	119632724	2q14.2	rs12621139	А	0.20	-0.060	3.88E-12	48934	-0.058	1.12E-11
2	166577489	2q24.3	rs7586085	А	0.52	0.051	1.72E-16	60651	0.051	1.76E-16
2	202803881	2q33.2	rs6716216	А	0.88	-0.066	4.71E-12	61489	-0.066	4.40E-12
3	41129297	3p22.1	rs415997	А	0.53	0.068	2.64E-28	60766	0.068	3.61E-28
3	156474152	3q25.31	rs344024	А	0.77	0.050	3.11E-12	62621	0.050	2.61E-12
4	996165	4p16.3	rs6831280	А	0.16	-0.080	8.26E-19	53031	-0.080	1.06E-18
4	88831249	4q22.1	rs11934731	А	0.68	-0.062	1.69E-20	61124	-0.062	1.09E-20
5	88376061	5q14.3	rs1366594	А	0.52	0.051	5.03E-16	60698	0.051	3.01E-16
5	122847622	5q23.2	rs11745493	А	0.75	0.044	9.90E-10	61202	0.044	8.30E-10
6	44636919	6p21.1	rs7741085	Т	0.59	0.047	1.19E-13	60657	0.047	1.61E-13
6	127167072	6q22.33	rs13204965	А	0.76	0.062	1.05E-16	57298	0.085	5.46E-27
6	127446790	6q22.33	rs9482772	Т	0.55	-0.039	5.70E-10	59203	-0.061	3.17E-20
6	151910126	6q25.1	rs6557155	т	0.42	-0.079	2.97E-34	58412	-0.074	3.00E-30
6	151994910	6q25.1	rs7765040	А	0.84	0.059	5.37E-12	58188	0.054	7.30E-10
6	152008982	6q25.1	rs2941741	А	0.41	0.058	1.29E-20	62437	0.040	4.26E-10
7	30957702	7p14.3	rs28362721	т	0.18	-0.061	1.02E-12	53488	-0.062	6.40E-13
7	37965963	7p14.1	rs28457747	т	0.18	0.039	9.85E-07	61792	0.045	1.89E-08
7	38136277	7p14.1	rs1524058	т	0.40	-0.054	1.73E-17	60883	-0.057	2.72E-19
7	50901491	7p12.1	rs1548607	А	0.69	0.041	9.71E-09	52156	0.041	9.02E-09
7	96133319	7q21.3	rs6965122	А	0.68	0.077	4.64E-31	61668	0.076	1.52E-30
7	96656572	7q21.3	rs3757493	Т	0.42	-0.036	1.28E-08	60079	-0.035	4.29E-08
7	120790559	7q31.31	rs56335989	Т	0.55	-0.023	0.0001878	59259	-0.045	5.38E-09
7	120902676	7q31.31	rs4731006	Т	0.35	-0.040	5.45E-10	60966	-0.060	2.85E-14
7	120959155	7q31.31	rs2536195	А	0.68	-0.089	1.11E-29	43891	-0.068	1.46E-14
7	120974765	7q31.31	rs3801387	А	0.73	-0.138	3.31E-87	60474	-0.163	7.27E-91
7	120985854	7q31.31	rs2041490	С	0.18	0.017	0.04031	59352	0.084	9.83E-21
7	121178195	7q31.31	rs73717393	т	0.93	-0.094	4.69E-13	55499	-0.088	8.04E-12
7	150933044	7q36.1	rs10233479	Т	0.12	0.062	1.20E-10	63298	0.062	9.70E-11
8	120012700	8q24.12	rs11995824	С	0.44	0.074	5.21E-32	59397	0.074	8.68E-32
9	133471891	9q34.11	rs10901216	А	0.35	-0.045	6.20E-12	58789	-0.045	6.84E-12
10	54423853	10q21.1	rs12258451	С	0.88	0.075	4.32E-14	56851	0.075	5.63E-14

10	124015986	10q26.13	rs10788264	А	0.49	-0.041	4.10E-11	60632	-0.041	3.43E-11
11	243268	11p15.5	rs505404	Т	0.76	-0.052	9.04E-13	60292	-0.052	9.75E-13
11	15708792	11p15.2	rs7926837	А	0.79	-0.052	7.46E-12	60590	-0.054	1.76E-12
11	15814794	11p15.2	rs11023718	Т	0.04	0.128	7.30E-13	52490	0.118	5.96E-11
11	16248894	11p15.1	rs12800049	Т	0.26	0.056	1.11E-15	61150	0.048	1.43E-11
11	16630779	11p15.1	rs35199438	Т	0.31	-0.047	2.24E-12	60906	-0.040	4.72E-09
11	27308483	11p14-p13	rs10450586	С	0.62	-0.048	8.17E-14	60024	-0.051	2.26E-15
11	27593899	11p14-p13	rs1352479	А	0.27	0.039	6.88E-08	57320	0.042	5.05E-09
11	35083633	11p13	rs2553773	С	0.43	-0.034	8.09E-08	60038	-0.036	1.79E-08
11	46856536	11p11.2	rs10838622	т	0.36	0.049	3.04E-13	56422	0.045	2.54E-11
11	47252107	11p11.2	rs4647728	А	0.03	-0.124	5.88E-11	49763	-0.111	5.94E-09
11	68174189	11q13.2	rs4988321	А	0.04	-0.160	4.08E-23	54286	-0.114	1.63E-11
11	68218290	11q13.2	rs11228240	т	0.26	-0.084	3.57E-31	56682	-0.069	3.51E-19
11	86887931	11q14.2	rs634277	А	0.67	0.062	2.19E-20	58914	0.062	2.01E-20
12	49379537	12q13.12	rs118115924	т	0.01	-0.277	8.01E-18	39253	-0.304	6.84E-21
12	49385679	12q13.12	rs10875906	т	0.27	0.053	1.07E-12	53734	0.061	1.57E-16
12	53737840	12q13.13	rs12424778	А	0.28	0.054	2.23E-15	61906	0.054	1.16E-15
12	90334829	12q21.33	rs10777212	т	0.35	0.045	5.00E-12	58906	0.045	6.15E-12
12	107297862	12q23.3	rs6539288	А	0.50	-0.040	2.44E-10	60592	-0.040	1.86E-10
12	116555786	12q24.21	rs73200209	А	0.80	0.045	2.52E-08	56109	0.045	2.54E-08
13	42952145	13q14.11	rs9594738	т	0.47	-0.072	5.00E-31	60695	-0.069	2.43E-28
13	43153869	13q14.11	rs117543324	А	0.96	-0.162	3.13E-17	46599	-0.147	2.42E-14
14	91445162	14q32.11	rs1286079	т	0.19	0.055	5.42E-12	59543	0.055	5.30E-12
15	51126002	15q21.2	rs34293575	А	0.82	-0.025	0.002497	60821	-0.049	1.80E-08
15	51524292	15q21.2	rs2414095	А	0.35	-0.040	6.22E-10	60408	-0.054	7.30E-15
15	67420680	15q22.33	rs1545161	А	0.54	0.038	1.16E-09	61086	0.036	7.67E-09
15	67562214	15q22.33	rs12901789	А	0.76	-0.049	1.68E-11	59612	-0.047	1.22E-10
16	392318	16p13.3	rs8047501	А	0.49	0.056	6.83E-18	55097	0.056	8.38E-18
16	86714715	16q24.1	rs71390846	С	0.19	-0.050	6.95E-10	58067	-0.050	7.94E-10
17	2048713	17p13.3	rs7209460	т	0.70	0.044	1.15E-10	59907	0.044	1.20E-10
17	17843396	17p11.2	rs8070624	А	0.44	0.036	2.45E-08	57633	0.036	2.45E-08
17	41798621	17q21.31	rs66838809	А	0.08	0.109	2.35E-18	50133	0.110	1.59E-18
17	42283037	17q21.31	rs9910055	Т	0.25	0.044	3.13E-09	57268	0.045	1.37E-09
17	63840961	17q24.1	rs9907056	А	0.32	0.041	1.61E-09	59188	0.041	1.38E-09
18	60054857	18q21.33	rs884205	А	0.25	-0.053	3.96E-13	58528	-0.053	3.96E-13
20	10640877	20p12.2	rs6040063	А	0.51	0.040	7.75E-11	60605	0.040	1.01E-10
21	36970350	21q22.12	rs9976876	т	0.46	-0.038	1.35E-09	59146	-0.038	1.48E-09
21*	37836973	21q22.13	rs7277076	т	0.43	0.036	1.82E-08	59889	0.036	1.21E-08
21	40350744	21q22.2	rs11910328	А	0.84	-0.049	8.51E-09	59137	-0.050	5.82E-09

**Table S8. Independent variants associated with TB-BMD in the only –European meta-analysis.** Genomic coordinates are on build 37 of the human genome. Beta coefficients and allele frequencies (EAF) are reported for the A1 allele. *J* suffix refers to the summary statistics in the join analysis fitting all variants together. \* Only significant in the meta-analysis of European individuals.

Trait	PMID	year	rg	se	z	Ρ
Age.at.menarche	25231870	2014	-0.05	0.028	-1.801	0.072
Age.at.Menopause	26414677	2015	0.002	0.043	0.054	0.957
Anorexia.nervosa	24514567	2014	-0.027	0.034	-0.791	0.429
Asthma	17611496	2007	0.02	0.063	0.312	0.755
Autism.spectrum.disorder	www.med.unc.edu	2015	-0.059	0.064	-0.925	0.355
Bipolar.disorder	21926972	2011	0.035	0.052	0.669	0.504
Birth.length	25281659	2015	-0.109	0.059	-1.84	0.066
Birth.weight	23202124	2013	-0.023	0.059	-0.39	0.697
Body.mass.index.2010	20935630	2010	0.108	0.029	3.748	0.0002
Childhood.intelligence.quotient	23358156	2014	-0.012	0.065	-0.183	0.855
Childhood.obesity	22484627	2012	0.091	0.049	1.858	0.063
Cholesterol.esters.in.large.HDL	27005778	2016	-0.077	0.107	-0.721	0.471
Cholesterol.esters.in.large.LDL	27005778	2016	0.036	0.068	0.535	0.593
Cholesterol.esters.in.large.VLDL	27005778	2016	-0.078	0.106	-0.735	0.463
Cholesterol.esters.in.medium.HDL	27005778	2016	0.076	0.094	0.807	0.42
Cholesterol.esters.in.medium.LDL	27005778	2016	-0.062	0.104	-0.598	0.55
Cognitive.performance	25201988	2014	0.057	0.039	1.472	0.141
College.completion	23722424	2013	0.059	0.042	1.43	0.153
Creatinine	27005778	2016	0.093	0.069	1.354	0.176
Crohn's.disease	26192919	2015	-0.044	0.042	-1.042	0.297
Depressive.symptoms	27089181	2016	-0.051	0.039	-1.307	0.191
Ever.vs.never.smoked	20418890	2010	-0.015	0.044	-0.335	0.737
Extreme.body.mass.index	23563607	2013	0.094	0.044	2.122	0.034
Extreme.height	23563607	2013	-0.087	0.044	-1.978	0.048
Extreme.waist.to.hip.ratio	23563607	2013	-0.035	0.072	-0.486	0.627
Fasting.glucose	22581228	2012	0.065	0.047	1.388	0.165
Fasting.insulin	22581228	2012	0.027	0.058	0.459	0.647
Femoral.neck.bone.mineral.density	22504420	2012	0.923	0.035	26.03	2.25E-149
Forced.expiratory.volume.in.1.second	21946350	2011	0.054	0.062	0.877	0.381
forced.vital.capacity	21946350	2011	0.056	0.044	1.272	0.203
Former.vs.current.smoker	20418890	2010	-0.019	0.067	-0.289	0.772
Free.cholesterol.in.IDL	27005778	2016	-0.101	0.106	-0.952	0.341
Free.cholesterol.in.large.HDL	27005778	2016	0.117	0.114	1.02	0.308
Free.cholesterol.in.large.LDL	27005778	2016	0.04	0.068	0.59	0.555
Free.cholesterol.in.large.VLDL	27005778	2016	-0.049	0.108	-0.453	0.651
Free.cholesterol.in.medium.HDL	27005778	2016	0.073	0.085	0.861	0.389
Free.cholesterol.in.medium.VLDL	27005778	2016	-0.068	0.072	-0.952	0.341
Free.cholesterol.in.serum	27005778	2016	-0.162	0.129	-1.258	0.208
Free.cholesterol.in.small.VLDL	27005778	2016	-0.102	0.093	-1.091	0.275
Glucose	27005778	2016	0.079	0.069	1.145	0.252
Glycated hemoglobin.HbA1C	20858683	2010	0.122	0.06	2.033	0.042
HDL.cholesterol	20686565	2010	-0.07	0.033	-2.116	0.034

Height.2010	20881960	2010	-0.057	0.031	-1.846	0.065
Hip.circumference	25673412	2015	-0.038	0.032	-1.174	0.24
Homeostasis.model.assessment-B	20081858	2011	0.026	0.059	0.44	0.66
Homeostasis.model.assessment-IR	20081858	2011	0.057	0.069	0.825	0.409
Infant.head.circumference	22504419	2012	0.258	0.074	3.493	0.0005
Inflammatory.bowel.disease	26192919	2015	-0.112	0.038	-2.908	0.004
Insulin.like.growth.factor.1	27329260	0	0.174	0.062	2.798	0.005
Leptin	26833098	2016	-0.028	0.065	-0.424	0.671
Leptin.adjusted.for.body.mass.index	26833098	2016	-0.081	0.07	-1.163	0.245
Lumbar.spine.bone.mineral.density	22504420	2012	0.99	0.035	28.097	1.06E-173
Lung.cancer.all	24880342	2016	0.009	0.067	0.136	0.891
Major.depressive.disorder	22472876	2013	0.004	0.048	0.073	0.942
Mean.platelet.volume	22139419	2011	0.109	0.048	2.278	0.023
Neuroticism	27089181	2016	-0.107	0.036	-3.012	0.003
Obesity.class.1	23563607	2013	0.077	0.032	2.422	0.015
Obesity.class.2	23563607	2013	0.029	0.04	0.714	0.475
Obesity.class.3	23563607	2013	-0.008	0.055	-0.14	0.889
Overweight	23563607	2013	0.097	0.033	2.902	0.004
PGC.cross.disorder.analysis	23453885	2013	0.012	0.048	0.259	0.796
Platelet.count	22139419	2011	-0.056	0.041	-1.379	0.168
Rheumatoid.Arthritis	24390342	2014	-0.028	0.051	-0.548	0.584
Subjective well being	27089181	2016	0.124	0.045	2.759	0.006
Total.cholesterol	20686565	2010	-0.085	0.038	-2.278	0.023
Triglycerides	20686565	2010	-0.027	0.04	-0.68	0.497
Type.2.diabetes	22885922	2012	0.108	0.05	2.153	0.031
Ulcerative.colitis	26192919	2015	-0.145	0.043	-3.358	0.001
Urinary.albumin/creatinine	26631737	2015	0.065	0.063	1.038	0.299
Urinary.albumin/creatinine.non.diabetes	26631737	2015	0.087	0.084	1.038	0.299
Waist.circumference	25673412	2015	-0.012	0.027	-0.435	0.664
Waist.to.hip.ratio	25673412	2015	0.038	0.032	1.171	0.241
Years.of.schooling	23722424	2013	0.053	0.038	1.366	0.172

**Table S9. Genetic correlation of TB-BMD with different traits.** The genetic correlation was calculated based on the summary statistics of the only-Europeans meta-analysis in LD-Hub using its current dataset. Significant results are shown in **Figure 3**.

CHR	ВР	rsID	A1	A2	Freq1	P-value	Gene Name	Codons	SNP Type	SIFT	Polyphen2	OMIM Disease
1	68603586	rs 983034	С	Т	0.62	1.21E-08	GPR177	GTC-aTC	Nonsynonymous	Tolerated	benign	
1	68624878	rs 3748705	С	Т	0.66	3.77E-09	GPR177	GCG-GCa	Synonymous			
2	166535918	rs 777346	С	Т	0.52	5.08E-16	CSRNP3	ACC-ACt	Synonymous			
3	156570703	rs 414683	А	G	0.79	1.88E-08	AC117392.3	CAA-CAg	Synonymous			
4	994414	rs 3755955	А	G	0.16	2.10E-19	IDUA	CGG-CaG	Nonsynonymous	Tolerated	benign	Scheie Syndrome
4	995305	rs 6815946	Т	С	0.84	7.16E-18	IDUA	AAT-AAc	Synonymous			Scheie Syndrome
4	995868	rs 114806891	С	Т	0.93	1.21E-10	IDUA	AAC-AAt	Synonymous			Scheie Syndrome ; Hurler Syndrome
4	995919	rs 6830825	С	G	0.16	3.63E-18	IDUA	GCG-GCc	Synonymous			Scheie Syndrome
4	995997	rs 6811373	А	G	0.84	4.21E-18	IDUA	AGA-gGA	Nonsynonymous	Not Predicted	benign	
4	996012	rs 6831021	С	G	0.16	5.57E-18	IDUA	GCG-cCG	Nonsynonymous	Not Predicted	benign	
4	996165	rs 6831280	А	G	0.16	9.66E-19	IDUA	GCG-aCG	Nonsynonymous	Tolerated	benign	Scheie Syndrome
4	996248	rs 6836258	С	G	0.16	2.56E-18	IDUA	ACG-ACc	Synonymous			Scheie Syndrome
4	996560	rs 115790973	С	G	0.84	4.35E-18	IDUA	ACC-ACg	Synonymous			Scheie Syndrome
4	996690	rs 73066479	А	G	0.16	2.97E-17	IDUA	GTC-aTC	Nonsynonymous	Tolerated	benign	Scheie Syndrome
4	996888	rs 115929690	Т	С	0.16	2.59E-18	IDUA	CGC-CGt	Synonymous			Scheie Syndrome
4	1019011	rs 4647932	С	Т	0.93	2.52E-11	FGFRL1	CCA-CtA	Nonsynonymous	Damaging*	benign	
4	88732692	rs 1054627	А	G	0.29	7.98E-14	IBSP	GGA-GaA	Nonsynonymous	Tolerated	benign	
4	88732918	rs 1054629	А	т	0.71	1.26E-13	IBSP	GAA-GAt	Nonsynonymous	Tolerated	benign	
6	151859314	rs 4870034	А	G	0.32	7.04E-15	C6orf97	GAA-GAg	Synonymous			
6	151894340	rs 12205837	т	С	0.11	6.63E-13	C6orf97	GCT-GtT	Nonsynonymous	Tolerated	benign	
6	151936677	rs 6929137	А	G	0.33	1.28E-15	C6orf97	GTC-aTC	Nonsynonymous	Tolerated	benign	
6	151939181	rs 3734804	А	G	0.52	2.88E-15	C6orf97	GTC-aTC	Nonsynonymous	Tolerated	benign	
7	120876835	rs 35793694	А	G	0.93	2.26E-13	C7orf58	GAA-GgA	Nonsynonymous	Tolerated	benign	
7	120969769	rs 2908004	А	G	0.46	1.43E-89	WNT16	GGG-aGG	Nonsynonymous	Tolerated	benign	
7	120979089	rs 2707466	Т	С	0.46	4.79E-88	WNT16	ACA-AtA	Nonsynonymous	Tolerated	benign	
7	150915948	rs 7782699	Т	С	0.12	5.93E-11	ABCF2	GCG-GCa	Synonymous			
8	119964052	rs 2073618	С	G	0.48	1.54E-19	TNFRSF11B	AAC-AAg	Nonsynonymous	Tolerated	benign	Paget Disease, Juvenile
10	124089036	rs2421013	G	Α	0.48	3.33E-09	BTBD16	CGG-CaG	Nonsynonymous	Tolerated	benign	
11	198062	rs11605246	С	G	0.78	5.37E-14	ODF3	CCT-CgT	Nonsynonymous	Tolerated	benign	
11	280464	rs77447196	С	G	0.79	5.39E-11	NLRP6	CCG-gCG	Nonsynonymous	Tolerated	benign	
11	46339011	rs 35652107	А	G	0.08	1.15E-08	CREB3L1	GCA-aCA	Nonsynonymous	Tolerated	benign	
11	46387868	rs 1317826	А	G	0.68	2.07E-09	DGKZ	CAG-CgG	Nonsynonymous	Tolerated	benign	
11	46406767	rs 2067482	А	G	0.16	2.10E-12	CHRM4	ACC-ACt	Synonymous			
11	46886077	rs 117936904	А	т	0.98	9.97E-10	LRP4	CTT-CaT	Nonsynonymous	Damaging*	prob. damaging	
11	46893108	rs 2306029	т	С	0.48	6.99E-13	LRP4	AGC-gGC	Nonsynonymous	Tolerated	benign	
11	46898771	rs 6485702	т	С	0.37	1.19E-13	LRP4	ATT-gTT	Nonsynonymous	Tolerated	benign	Cenani-Lenz Syndactyly Syndrome
11	46916179	rs 72897663	Т	G	0.96	3.44E-08	LRP4	AAC-cAC	Nonsynonymous	Tolerated	benign	
11	68174189	rs 4988321	А	G	0.04	7.64E-30	LRP5	GTG-aTG	Nonsynonymous	Damaging	prob. damaging	Van Buchem Disease, Type 2; Osteopetrosis, Autosomal Dominant 1; Exudative Vitreoretinopathy 4; Osteoporosis- Pseudoglioma Syndrome; Osteoporosis; Hyperostosis Corticalis Generalisata, Benign Form Of Worth, With Torus

CHR	ВР	rsID	A1	A2	Freq1	P-value	Gene Name	Codons	SNP Type	SIFT	Polyphen2	OMIM Disease
11	68177510	rs 2306862	т	С	0.16	1.34E-33	LRP5	AAC-AAt	Synonymous			Van Buchem Disease, Type 2; Osteopetrosis, Autosomal Dominant 1; Exudative Vitreoretinopathy 4; Osteoporosis- Pseudoglioma Syndrome; Osteoporosis; Hyperostosis Corticalis Generalisata, Benign Form Of Worth, With Torus
11	68192690	rs 556442	А	G	0.65	6.53E-25	LRP5	GTG-GTa	Synonymous			Van Buchem Disease, Type 2; Osteopetrosis, Autosomal Dominant 1; Exudative Vitreoretinopathy 4; Osteoporosis- Pseudoglioma Syndrome; Osteoporosis; Hyperostosis Corticalis Generalisata, Benign Form Of Worth, With Torus Van Buchem Disease, Type 2; Osteopetrosis,
11	68201295	rs 3736228	т	С	0.15	5.03E-34	LRP5	GCG-GtG	Nonsynonymous	Not scored	benign	Autosomal Dominant 1; Exudative Vitreoretinopathy 4; Osteoporosis- Pseudoglioma Syndrome; Osteoporosis; Hyperostosis Corticalis Generalisata, Benign Form Of Worth, With Torus
12	49168798	rs 3730071	А	С	0.03	6.95E-10	ADCY6	GCC-tCC	Nonsynonymous	Tolerated	benign	
12	53662624	rs 6580942	С	А	0.30	2.56E-16	ESPL1	GCC-GaC	Nonsynonymous	Tolerated	benign	
12	53670545	rs 1318648	А	С	0.63	3.32E-12	ESPL1	AGC-AGa	Nonsynonymous	Damaging	prob. damaging	
12	53682326	rs 1110720	А	G	0.63	6.26E-12	ESPL1	GGG-GGa	Synonymous			
12	53682457	rs 56358776	А	G	0.34	2.95E-13	ESPL1	CGG-CaG	Nonsynonymous	Tolerated	benign	
13	43148546	rs 138818878	С	G	0.97	5.47E-14	TNFSF11	CCT-CgT	Nonsynonymous	Damaging*	prob. damaging	Osteopetrosis, Autosomal Recessive 2
15	67528374	rs7173826	т	G	0.67	7.49E-09	AAGAB	ATC-cTC	Nonsynonymous	Tolerated	benign	
												Caudal Duplication Anomaly; Hepatocellular
16	396264	rs 1805105	А	G	0.34	5.40E-10		GAT-GAc	Synonymous			Carcinoma
17	17698254	rs8067439	G	Α	0.39	4.69E-08		CCG-CCa	Synonymous	· ·	•	
17	17997209	rs2230316	G	Α	0.44	3.23E-08		TCG-TCa	Synonymous	· ·	•	
17	42254417	rs 7212854	А	G	0.71		C17orf65	CGT-CGc	Synonymous			
17	42287519	rs 2071167	Т	С	0.27	5.00E-09	UBTF	AAG-AAa	Synonymous		.	

**Table S10. Genome-wide Significant coding variants.** P-values are derived from the overall meta-analysis including all ethnicities. Bold rows correspond to SNPs mapping to novel loci for the first time described in this GWAS analysis. \* Low confidence

Locus	Ensembl gene ID	Gene symbol	P value	FDR
1p13.3	ENSG00000184371	CSF1	1.91E-03	<0.05
1p31.3	ENSG00000116729	WLS	4.84E-03	<0.05
1p36.12	ENSG00000162552	WNT4	2.79E-03	<0.05
1p36.23	ENSG00000142599	RERE	1.44E-04	<=0.01
2p11.2	ENSG00000152284	TCF7L1	7.41E-04	<0.05
2p21	ENSG00000162878	PKDCC	3.74E-04	<0.05
2q14.2	ENSG00000163064	EN1	2.23E-04	<=0.01
2q33.2	ENSG00000155760	FZD7	1.19E-03	<0.05
3q25.31	ENSG00000163659	TIPARP	3.41E-06	<=0.01
4p16.3	ENSG00000127418	FGFRL1	1.09E-03	<0.05
4q22.1	ENSG00000152595	MEPE	5.51E-06	<=0.01
5q14.3	ENSG00000248309	MEF2C-AS1	4.44E-03	<0.05
6p21.1	ENSG00000124813	RUNX2	2.80E-09	<=0.01
6q22.33	ENSG00000146374	RSPO3	9.63E-06	<=0.01
7p12.1	ENSG00000106070	GRB10	6.19E-03	<0.05
7p14.1	ENSG00000106483	SFRP4	1.39E-05	<=0.01
7p14.3	ENSG00000240583	AQP1	1.18E-03	<0.05
7q21.3	ENSG00000105880	DLX5	7.75E-05	<=0.01
7q22.1	ENSG00000197037	ZSCAN25	5.15E-05	<=0.01
7q31.31	ENSG00000106034	CPED1	2.71E-04	<=0.01
8q24.12	ENSG00000164761	TNFRSF11B	1.19E-03	<0.05
10q25.2	ENSG00000138166	DUSP5	8.22E-03	<0.05
11p11.2	ENSG00000157613	CREB3L1	2.66E-04	<=0.01
11p11.2	ENSG00000165917	RAPSN	3.09E-03	<0.05
11p11.2	ENSG00000165915	SLC39A13	3.50E-03	<0.05
11p14-p13	ENSG00000176697	BDNF	1.55E-03	<0.05
11p14-p13	ENSG00000245573	BDNF-AS1	2.37E-03	<0.05
11p14-p13	ENSG00000205213	LGR4	5.31E-04	<0.05
11p15.1	ENSG00000110693	SOX6	2.02E-04	<=0.01
11p15.2	ENSG00000188487	INSC	2.24E-03	<0.05
11q13.2	ENSG00000162337	LRP5	5.67E-04	<0.05
11q13.3	ENSG00000110092	CCND1	4.08E-05	<=0.01
11q24.1	ENSG00000255248	-	1.81E-03	<0.05
12p13.33	ENSG00000111186	WNT5B	1.45E-03	<0.05
12q13.12	ENSG00000167548	MLL2	5.32E-06	<=0.01
12q13.12	ENSG00000125084	WNT1	1.65E-03	<0.05
12q13.13	ENSG00000257194	-	5.05E-04	<0.05
12q13.13	ENSG00000185591	SP1	4.12E-03	<0.05
12q13.13	ENSG00000170374	SP7	1.64E-07	<=0.01
13q13.3	ENSG00000120693	SMAD9	4.15E-03	<0.05
15q22.33	ENSG00000166949	SMAD3	4.05E-05	<=0.01
16q24.1	ENSG00000176678	FOXL1	7.57E-04	<0.05

17p11.2	ENSG00000108557	RAI1	3.50E-04	<0.05
17p13.3	ENSG0000070366	SMG6	8.74E-03	<0.05
17q21.31	ENSG00000161664	ASB16	4.18E-03	<0.05
17q21.31	ENSG00000161649	CD300LG	2.73E-03	<0.05
17q21.31	ENSG00000108840	HDAC5	7.24E-03	<0.05
17q21.31	ENSG0000005102	MEOX1	7.38E-03	<0.05
17q21.31	ENSG00000167941	SOST	6.18E-05	<=0.01
17q21.31	ENSG00000108312	UBTF	7.66E-03	<0.05
20p12.2	ENSG00000101384	JAG1	3.66E-04	<0.05
20q12	ENSG0000204103	MAFB	3.85E-04	<0.05
21q22.12	ENSG00000159216	RUNX1	2.24E-03	<0.05

**Table S11. DEPICT Gene prioritization (FDR<5%).** Based on genome-wide significant variants in the overall TB-BMD meta-analysis. Bold rows correspond to genes mapping to novel loci not previously described in this GWAS analysis of bone phenotypes.

Table S12. DEPICT Gene-set enrichment analysis (FDR<5%). Based on genome-wide significant variants in the</th>overall TB-BMD meta-analysis. These 182 gene-sets were further clustered in 25 'metagene-sets' shown in Figure4. Attached Excel file.

Position	Lead SNP	Proxy SNP	LD	Host gene	Related miRNA	Ancestral A	Derived A	Conservation	Change contex score	Functional class
7q22.1	rs34670419	rs34670419	1	ZKSCAN5	mir-382-3p	G	т	4	0.09	Create
11p15.5	rs11601356	rs6541	0.86	PSMD13	mir-942-5p	Α	G	0	0.02	Create
7q36.1	rs73169649	rs73169654	0.88	ABCF2	mir-140-3p	С	Т	1	0.09	Create
2q24.3	rs7586085	rs13429321	0.84	GALNT3	mir-499-3p	Т	А	6	0.2	Disrupte
2p21	rs78572108	rs1044305	0.93	PKDCC	mir-1470	Т	С	9	0.25	Create
5q22.2	rs818427	rs2545167	1	REEP5	mir-4444	С	Α	0	0.2	Create
11q13.2	rs11228240	rs4988291	0.95	PPP6R3	mir-138-3P	G	А	5	0.02	Disrupte
15q22.33	rs3743347	rs10518716	1	AAGAB	mir-380/mir-424-3p	С	G	2&6	0.22/0.19	Disrupte/Create
17p11.2	rs8070128	rs1052299	1	TOM1L2	miR-133a, 138-3p	т	С	1	0.3	Create

**Table S13. Putative effect of the TB-BMD top associated variants in miRNA-binding sites**. The effect of the derived allele in the creation/disruption of a binding site (functional class) of a specific miRNA (miRNA) is described (using PolymiRTS database v3.0). Shown are 9 SNPs, including the lead SNP rs34670419 *in ZKSCAN5* and proxy SNPs of other 8 lead SNPs, located in predicted miRNA binding sites. Loci not previously reported are in bold font. Proxy SNP, SNP with r2 > 0.8, limit distance 500 kb, population panel CEU and in 1000 Genome project; Conservation, Occurrence of the miRNA site in other vertebrate genomes in addition to the query genome; LD, linkage disequilibrium; Related miRNA, miRNA that the SNP is predicted to create/disrupt its binding site; Context score predicts the binding of a miRNA to the gene 3'UTR by summing over contributions made by individual sites within the 3'UTR that have perfect sequence complementarity to the miRNA seed region. Change contex score, A more negative value of the context score difference indicates an increased likelihood that the miRNA targeting is disrupted or newly created by the SNP in the target sites.

Table S14. Skeletal phenotype data from the International Mouse Phenotyping Consortium and Mouse Genome Informatics databases and expression data from murine osteoblasts, osteocytes and osteoclasts. Data was collected for the 55 genes prioritized by DEPICT. Detailed bone phenotyping from the Origins of Bone and Cartilage Disease (OCBD) is presented in Table S15. Attached Excel file

Table S15. Detailed bone phenotyping of knockout models from the Origins of Bone and Cartilage Disease (OCBD) initiative. Knockout lines with a skeletal parameter greater than 2 standard deviations from the reference mean are highlighted in orange. The standard deviation from the reference mean for each parameter is shown with those greater than 2 highlighted (Black above the mean: Red below the mean). Attached Excel file.

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