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## Fine Mapping of Bone Structure and Strength QTLs in Heterogeneous Stock Rat

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### Abstract

We previously demonstrated that skeletal structure and strength phenotypes vary considerably in heterogeneous stock (HS) rats. These phenotypes were found to be strongly heritable, suggesting that the HS rat model represents a unique genetic resource for dissecting the complex genetic etiology underlying bone fragility. The purpose of this study was to identify and localize genes associated with bone structure and strength phenotypes using 1524 adult male and female HS rats between 17 to 20 weeks of age. Structure measures included femur length, neck width, head width; femur and lumbar spine (L3-5) areas obtained by DXA; and cross-sectional areas (CSA) at the midshaft, distal femur and femoral neck, and the 5<sup>th</sup> lumbar vertebra measured by CT. In addition, measures of strength of the whole femur and femoral neck were obtained. Approximately 70,000 polymorphic SNPs distributed throughout the rat genome were selected for genotyping, with a mean linkage disequilibrium coefficient between neighboring SNPs of 0.95. Haplotypes were estimated across the entire genome for each rat using a multipoint haplotype reconstruction method, which calculates the probability of descent at each locus from each of the 8 HS founder

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Authors' roles

Study design: IA, DLK, MJE, and TF. Study conduct: IA, DLK, TC, GB, CM, RL, EM, SD, AT, AF, PS, MD, TO, MJ, and AB. Data analysis: IA, DLK, AB, and TF. Data interpretation: IA, DLK, MJE and TF. Drafting manuscript: IA and DLK. Revising manuscript content: IA, DLK, AF, MJE, and TF. Approval of final version of manuscript: IA, DLK, TC, GB, CM, RL, EM, SD, AT, AF, PS, MD, TO, MJ, AB, MJE and TF.

strains. The haplotypes were then tested for association with each structure and strength phenotype via a mixed model with covariate adjustment. We identified quantitative trait loci (QTLs) for structure phenotypes on chromosomes 3, 8, 10, 12, 17 and 20, and QTLs for strength phenotypes on chromosomes 5, 10 and 11 that met a conservative genome-wide empiric significance threshold (FDR=5%;  $P < 3 \times 10^{-6}$ ). Importantly, most QTLs were localized to very narrow genomic regions (as small as 0.3Mb and up to 3 Mb), each harboring a small set of candidate genes, both novel and previously shown to have roles in skeletal development and homeostasis.

## Keywords

Heterogeneous stock rat; Bone structure; Bone strength; Genes; Osteoporosis

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## Introduction

Osteoporosis is a common, genetically complex disorder characterized by reduced bone mineral density (BMD), abnormal bone microarchitecture and compromised bone strength leading to increased susceptibility to fracture risk [1]. Bone mineral density (BMD), structure and strength are the major determinants of skeletal fracture [2-4]. As much as 80% of the variability of BMD and about one-third of the variance in the risk of fracture is due to heritable factors [5-8]. Although BMD by DXA is most often used for predicting fracture risk in humans, it is not an adequate measure to capture several important aspects of bone strength. The genetic basis of fracture susceptibility depends on coordination of bone density, morphology, structure and tissue-quality, all of which contribute to bone strength. Identification and characterization of genes underlying bone structure and strength, particularly at the most common sites of fracture, will ultimately lead to better diagnosis, prevention and treatment of osteoporosis and other high bone-fragility conditions.

Previously, we identified several quantitative trait loci (QTLs) linked to bone structure and strength phenotypes in inbred F344, LEW, COP and DA rats [9-12]. However, most of these QTLs are large (20-30 cM) and harbor hundreds of potential candidate genes. It is a formidable challenge to narrow these critical QTL regions to a small chromosomal segment containing a few genes. To address this issue, in this study we exploited a unique rat model, the heterogeneous stock (HS) rat, developed by the National Institutes of Health (NIH) in 1984 [13]. These rats were derived from eight inbred founder strains: Agouti (ACI/N), Brown Norway (BN/SsN), Buffalo (BUF/N), Fischer 344 (F344/N), M520/N, Maudsley Reactive (MR/N), Wistar-Kyoto (WKY/N) and Wistar-Nettleship (WN/N) [13-14]. Importantly, the descendants of these rats represent a unique, genetically random mosaic of the founding animals' chromosomes due to recombination that has accumulated over 50 generations, enabling the fine mapping of QTLs to very small genomic regions. Recently, these rats have been successfully used for high-resolution mapping for diabetes and fear-related behavior phenotypes [15-16].

In a previous study, we demonstrated that bone structure and strength phenotypes vary considerably among the HS founder strains [17]. Recently, using the sequence data from these strains and genotypes for a dense SNP marker map in the HS offspring population, we

identified several QTLs and underlying genetic variants for multiple bone phenotypes [18]; however, no single genetic variants explaining associations with bone phenotypes were detected, consistent with the complex genetic architecture of skeletal phenotypes observed previously both in humans and animal models [18-19]. The purpose of this study is to identify and localize QTLs for bone structure and strength phenotypes using high-resolution mapping in the HS rat offspring at the most common skeletal fracture sites. We anticipate that using this approach the bone structure and strength QTLs will be localized to much smaller genomic regions than QTLs detected using inbred rat crosses. Ultimately, this will allow us to identify a smaller set of potential candidate genes underlying these QTLs, and contribute to a better understanding of the complex genetic architecture of the fracture risk phenotypes in the rat model and in human.

## Materials and Methods

### Animals

We used 1524 HS rats (male n=728; female n=796) in this study. The HS rats were bred and grown at the Autonomous University of Barcelona. The rats were housed in cages in pairs (males) and trios (females) and maintained with food and water available ad libitum. The HS rats were raised over 2.5 years in batches of approximately 250 animals in accordance with the Spanish legislation on “Protection of Animals used for Experimental and Other Scientific Purposes” and the European Communities Council Directive (86/609/EEC).

### Euthanasia and specimen collection

HS rats were euthanized between 17 and 20 weeks of age by ether inhalation. The lower limbs and lumbar vertebrae (L3-5) were dissected from these animals. The lower limbs on the right side were immediately frozen after harvest wrapped in saline soaked gauze in plastic Ziplock bags at  $-20^{\circ}\text{C}$  for subsequent biomechanical testing. To prevent dehydration and any adverse effect on the mechanical properties, we kept the muscle attached to the limbs during the storage period until testing. The lower limbs on the left side and lumbar vertebrae (L3-5) were stripped of muscle, transferred to 70% ethyl alcohol and stored at  $4^{\circ}\text{C}$  for bone structure analyses.

### Dual energy X-ray absorptiometry (DXA)

The left femur and lumbar vertebrae 3-5 (L3-5) of the HS rats were scanned using DXA (PIXImus II mouse densitometer; Lunar Corp., Madison, WI, USA) with ultra-high resolution ( $0.18 \times 0.18$  mm/pixel). The machine was calibrated prior to each DXA scanning session using a phantom supplied by the manufacturer. During scanning dissected femurs were positioned with anterior surface facing up and the distal end on left side whereas L3-5 were oriented anterior surface facing up on a standardized platform in air. After completion of the scan of each bone, mutually exclusive region of interest (ROI) boxes were drawn **manually** around the bones from which femur area ( $\text{mm}^2$ ) and lumbar area ( $\text{mm}^2$ ) measurements were obtained. The intra-specimen % coefficient variation for area was less than 1%.

### Femur length, femoral head and neck width measurements

The femur size parameters were measured using digital calipers accurate to 0.01 mm, with a precision of  $\pm 0.005$  mm (Mitutoyo, Aurora, IL). The femur length (mm) was measured from the end of the medial condyle to the end of the greater trochanter. The maximum transverse diameter (mm) of the femoral head and the shortest transverse distance (mm) of the femoral neck were considered as the width of the femoral head and neck, respectively.

### Peripheral quantitative computed tomography (pQCT)

The left femurs were placed in plastic tubes filled with 70% ethyl alcohol and centered in the gantry of a Norland Stratec XCT Research SA+pQCT (Stratec Electronics, Pforzheim, Germany) machine. Single slice measurements of 0.26 mm thickness and a voxel size of 0.07 mm were taken for the femur: one slice through femoral midshaft and one slice approximately 1 mm below the growth plate of distal femur. L5 vertebrae were scanned in cross-section at the caudo-cranial center of the vertebral body. For femoral neck, five consecutive scans perpendicular to the neck axis were obtained 0.25 mm apart from each other starting at the base of the femoral head and ending at the greater trochanter. For each slice, the X-ray source was rotated through 180° of projection. Total (trabecular and cortical) cross-sectional area (CSA; mm<sup>2</sup>) from each slice for femur and L5 spine were measured using the thresholds of 500 and 900 mg/cm<sup>3</sup>. For femoral neck, CSA were measured from the average values of all five slices.

### Biomechanical testing

The frozen right femurs were brought to room temperature slowly in a saline bath. The femurs were tested in three-point bending by positioning them with anterior surface facing up and the distal end as close to the left supporting point as possible on the lower supports (**15 mm span for female and 20 mm span for male**) of a three-point bending fixture and applying load at the midpoint using a material testing machine (Alliance RT/5, MTS Systems Corp., Eden Prairie, USA). For femoral neck, the proximal end of the femurs was mounted vertically in a special chuck that clamped the femoral shaft to the lower platen of the same material testing machine. The bones were held in place by a small (1N) preload, and then load was applied directly downward at a crosshead speed of 20 mm/min onto the mid-femur and femoral head at room temperature in monotonic axial compression until fracture. Force and displacement measurements were collected every 0.05 second. From the force vs. displacement curves, we measured the phenotypes that are critical for different aspects of bone fragility - ultimate force ( $F_u$ ; N), stiffness (S; N/mm), work to failure (W; mJ) and ultimate displacement or elongation (E; mm) in TestWorks software, version 4.06.  $F_u$  reflects the strength of the bone or maximum load that the bone can support before failing; S is the slope of the curve represents the bone brittleness; W reflects the amount of energy the specimen can absorb prior to fracture and E is the reciprocal of brittleness. The phenotypes, together, best reflect the clinical aspect of skeletal fragility.

### Genotyping

DNA was extracted from liver tissues from 8 original founders and 1524 HS rats using standard protocols. **To reconstruct the genome of each HS rat**, genotypes for over 900,000

SNPs for each rat were selected from an Affymetrix rat custom SNP array ([www.affymetrix.com](http://www.affymetrix.com)) as described previously [19]. We used only high quality informative (SNP call rate more than 0.99, polymorphic SNPs and no missing genotyping) markers. The average spacing between adjacent SNPs is 12.5 kb, with a maximum gap size of 1 Mb. The maximum density is 15 SNPs in a 10kb window. In addition, there are 19 larger gaps (1-3.8 Mb) on the autosomes (chromosome 1 to chromosome 20) and 12 larger gaps on chromosome X, with a maximum gap of 4.8 Mb. The set of SNPs were pruned to approximately 70,000 high quality SNPs which covered the HS rat genome with a mean linkage disequilibrium coefficient between neighboring SNPs of 0.95.

### Measurements of intra- and inter-observer errors

The structure and strength phenotypes were measured in batches consisting approximately 250 samples involving multiple individuals, therefore, we analyzed the intra- (measurement of a phenotype across multiple samples by an individual) and inter-observer (measurement of a phenotype across multiple samples by different individuals) variations for these measurements. We found that the intra-observer % of coefficient of variations (CV) for femur length (<4%), neck width (<13%), head width (<9%), lumbar area (<18%), femur work to failure (<34%), femur elongation (<32%) and femur neck ultimate force (<23%) were comparable to inter-observer variations of these measurements (<6%, <12%, 7%, <16%, <39%, <25% and <20%, respectively), suggesting that the quality of these phenotypic measurements was consistent across all samples in this study.

### Statistical genetic analysis

Haplotypes were constructed for each rat across the genome using the multipoint haplotype reconstruction method HAPPY (<http://www.well.ox.ac.uk/happy>) [20] as described previously [19]. A mixed model approach was employed to test for association between each haplotype and the bone phenotype of interest. Variance components to correct for pedigree relationships were estimated using the EMMA package for the R statistical software [21]. The test for association was conducted for each phenotype via a mixed model, adjusting for age, sex, body weight and batch as described previously [19]. An overall significance threshold of  $P < 3 \times 10^{-6}$  ( $-\log_{10}P = 5.5$ ) was used, corresponding to the most stringent of the 5% FDR levels established by permutation for each of the bone structure and strength phenotypes, and applying a Bonferroni correction for the number of traits considered. All models were fitted using the statistical language R (R-Development-Core-Team 2004) [22]. For each QTL meeting the significance threshold, the resampling-based model inclusion probability (RMIP) was obtained as a measure of robustness; QTLs with RMIP values above 0.3 were further explored for candidates of interest. A 95% confidence interval for the position of each QTL detected was obtained as described previously [9,23].

## Results

QTL mapping results were obtained throughout the genome for the structural measurements of femur length, neck width, head width and lumbar area (Figure 1A-1D). Results for femur work to failure, elongation and femur neck ultimate force are shown in Figure 1E-1G. Several QTLs reaching the genome-wide FDR and RMIP significance thresholds were

observed in the HS rat sample, and are included in Table 1. Candidate genes within the 95% confidence intervals (CI) for these QTLs are listed in Table 2.

### Genome-wide significant association results of femur and femoral neck structure

On chromosome 20 at position 34 Mb, significant linkage was detected for femur length with a  $-\log P$  value of 6.72 ( $p=1.9 \times 10^{-7}$ ; Figure 2A and Table 1). The CI for this QTL spanned 2.8 megabase (Mb). On chromosome 8, a QTL was identified which was linked to femur head width with a  $-\log P$  value of 6.56 ( $p=2.7 \times 10^{-7}$ ; Figure 2B) spanning less than one megabase. On chromosome 3, a QTL was identified which was linked to femur neck width with a  $-\log P$  value of 9.75 ( $p=1.7 \times 10^{-10}$ ; Figure 2C) spanning 2.8 megabase. In addition, a QTL encompassing 0.8 Mb for femur neck width with a  $-\log P$  value of 8.55 ( $p=2.7 \times 10^{-9}$ ; Figure 2D) was detected on chromosome 17.

### Genome-wide significant association results of lumbar spine structure

The only significant QTL for lumbar area was detected on chromosome 12 at position 22 Mb, with a  $-\log P$  value of 16.39 ( $p=4.0 \times 10^{-17}$ ; Figure 3A and 4B) spanning 0.5 Mb chromosomal region.

### Genome-wide significant association results of femur and femoral neck strength

We observed two genome-wide significant QTLs for femur strength phenotypes, one each for femur work to failure (Figure 3B and 4A) and femur elongation (Figure 3C) on chromosomes 5 and 11, respectively. The CI for the QTL region on chromosome 5 spans approximately 2.5 Mb whereas the QTL region on chromosome 11 spans 2.9 Mb. In addition, a QTL was identified for femoral neck ultimate force between 46-47 Mb position on chromosome 10 (Figure 3D) spanning 0.3 Mb region. In the same region on chromosome 10, a QTL for femur length was also observed with a significant  $-\log P$  value of 6.46 ( $p=3.8 \times 10^{-7}$ ).

## Discussion

In this study, we detected and localized QTLs for several key bone structure and strength phenotypes in HS rats at most common skeletal fracture sites. Importantly, most of these loci were localized to very small genomic regions, as small as 0.5 Mb up to 3 Mb, compared to the F2 design used previously for QTL mapping. This approach also allowed us to identify a narrowed list of positional candidate genes underlying each QTL, which can then be analyzed in future functional studies. Such a direct translation from gene identification to functional work is not possible in the traditional F2 design which typically identifies a QTL region harboring hundreds of potential candidate genes.

A critical factor for identification of genes underlying any complex trait such as skeletal fragility is replication of QTLs across studies. If chromosomal regions truly harbor gene/s for a trait, independent studies involving sufficiently large samples will most likely detect the same QTL for that particular trait. Importantly, the genomic resolution of replicated QTLs could be enhanced, thereby narrowing the number of positional candidate genes, by employing a genetically random mosaic model of the founder animals rather than using

traditional two-strain parental crosses. Indeed, several chromosomal regions previously identified in our inbred F2 studies were replicated in HS rats. For example, we detected association with femur work to failure in the HS rats on chromosome 5 (LOD 6.54) (Figure 3B and 4A), which overlapped with multiple QTLs in our F344 X LEW and COP X DA F2 crosses for femur structure and strength phenotypes [10,12]. This QTL in HS rat is syntenic to human chromosome 1p32.2-p33 and close to the location of the tissue-nonspecific ALP gene, which is important for skeletal mineralization. In addition, lumbar area QTL identified in HS rats on chromosome 12 (LOD 16.39) (Figure 3A and 4B) overlapped the QTLs in COP X DA F2 cross for spinal BMD and trabecular area [9,10,58]. This QTL in HS rats is homologous to human chromosome 7q11 (Figure 3A), which was linked to hip and spine BMD and femoral neck geometry [55-57]. Importantly, using HS rats, we were able to fine-map these regions to 1-3 Mb resolution, enabling us to identify a much smaller number of potential candidate genes on these overlapped chromosomes (Table 2). Notably, 2 genes (*Hip1* and *Por*) underlying the QTL on chromosome 12 have been previously reported to have important roles in skeletal development and homeostasis. *Hip1*, a member of Huntingtin interactin protein, plays an important role in the clathrin trafficking network. *Hip1* deficient mice have developmental abnormalities and growth defects including severe spinal abnormalities and dwarfism [40,41]. *Por* is the primary electron donor for cytochromes P450. Mutations in *Por* in humans lead to severe malformations including defects in craniofacial and long bones development [42]. In addition, deletion of *Por* recapitulates the human skeletal defects in mouse model, indicating this gene is important for proper bone development [43].

The genes underlying QTLs identified in this study might act alone or in combination to influence bone structure and strength phenotypes in different manner. For example, a single gene might affect multiple bone phenotypes or a cluster of genes may act together to modify a single bone phenotype. Also, the pleiotropic gene/s may contribute not only to different bone phenotypes but also influence phenotypes at different skeletal sites even within a given bone. Indeed, we detected several QTLs in HS rats that overlapped the QTLs in F344 X LEW and COP X DA F2 crosses for different bone phenotypes. The head width QTL in HS rats on chromosome 8 (LOD 6.56) (Figure 2B) overlapped with femur BMD and femoral neck strength QTLs in COP X DA cross [9,10]. The femur length and femur neck ultimate force QTLs identified in HS rats on chromosome 10 (LOD 6.41) (Figure 3D) overlapped the QTLs for spine BMD in both F344 X LEW and COP X DA F2 crosses [9,44]. This region was also coincided with the position of the femur BMC QTL that we reported previously in HS rat [19]. Similarly, the femur length QTL identified in HS rats on chromosome 20 (LOD 6.72) (Figure 2A) overlapped the QTL for femur BMD in COP X DA F2 cross [9]. The QTL region for femoral head width on chromosome 8 in HS rat is syntenic to human chromosome 6q13-14 (Figure 2B). This region was previously linked to osteoarthritis QTL and hand-foot malformation [49,52]. A locus for otosclerosis, a common form of hearing impairment caused by abnormal bone homeostasis of the otic capsule, was mapped to the 6q13-16 region [59]. In addition, 6q14.2-14.3 region harbors gene for cleft lip and palate, a defect of craniofacial development in human [60]. The distal peaks of QTLs for ALP and OC in baboon were mapped close to human orthologous 6q13 region [61]. The femur length QTL on chromosome 10 in HS rat is homologous to the human chromosomes 1q42-44 and

17p11.2 which were linked to rheumatoid arthritis QTL and hip BMD, respectively (Figure 3D) [45,46]. The susceptibility loci for split-hand/foot malformation with long-bone deficiency, a rare severe limb deformity condition were detected at 1q42.2-q43 and 6q14.1 [62]. Furthermore, a locus for Kenny-Caffey syndrome, an osteosclerotic bone dysplasia was identified at 1q42-q43 [63]. Amplification and overexpression of genes in 17p11.2-p12 leads to osteosarcoma [64]. QTLs for developmental components of the craniofacial complex were mapped to baboon ortholog of human chromosome 17p12 [65]. The neck width QTL on chromosome 17 in HS rat is homologous to the human chromosomes 10p12.1-p13, where Paget's disease locus was mapped [66-68]. The QTL for the femur length on chromosome 20 in HS rats is syntenic to 6q21-22 where spine and heel BMD QTLs were detected (Figure 2A) [47,48]. In addition, this human region was linked to osteoarthritis and rheumatoid arthritis QTLs [45,49]. Mutation in a locus of 6q21 harboring *OSTM1* gene was found to be linked to human malignant infantile osteopetrosis and craniometaphyseal dysplasia with severe craniofacial involvement shows homozygosity at 6q21-q22.1 locus in human [69,70]. Among all the genes detected underlying QTL on chromosome 10, several genes have previously shown to play important functions in bone growth and remodeling (Table 2). *Cops3* is an oncogene residing in the human chromosomal region 17p11.2-p12 - the copy number and expression level of *Cops3* was significantly associated with the development of osteosarcoma, the most common primary malignancy of bone [29,30]. *Drg2*, a GTP binding protein, overexpression of which in transgenic mice leads to increased number and activity of osteoclasts and bone loss [31]. *Map2k3* is increased by RANKL, which in turn aids in osteoclastogenesis from bone marrow precursor cells [39]. *Nlrp3*, a member of the NLR family of cytosolic receptors, mediates bone loss at sites of infection by apoptotic cell death of osteoblasts [36]. Mutations in *Nlrp3* are responsible for neonatal-onset multisystem inflammatory disease, exhibiting growth retardation, osteopenia and increased osteoclastogenesis [37], suggesting that this gene is important for postnatal skeletal growth and bone remodeling. *Rai1* encodes a nuclear protein containing a zinc finger homeodomain and regulates cell growth, cell cycle regulation, lipid metabolism, neurological development and behavioral functions [32-33]. Mutation of *Rai1* leads to craniofacial and skeletal anomalies (short extremities) in Smith-Magenis syndrome [32]. Both the copy number and expression level of *Rasd1* were significantly associated with the development of osteosarcoma [29]. In addition, using an integrative genetics approach, *Rasd1* was identified as a strong candidate gene for a BMD QTL in mice [34]. *Srebf1* activates genes that regulate lipid biosynthesis, and polymorphism in this gene was found to be associated with a higher risk of osteonecrosis of the femoral head in the Korean population [35]. *Shmt1* and *Top3a* are oncogenes and contribute to the development of osteosarcoma [29,38].

Two novel chromosomal regions linked to bone structure and strength phenotypes were identified in HS rats (Table 1) not found in our F2 studies. On chromosome 3, a QTL was identified for neck width (Figure 2C) and on chromosome 11 we detected a QTL for femur strength (Figure 3C). The QTL region for femoral neck width on chromosome 3 in HS rat is syntenic to human 9q33-34 (Figure 2C), where linkage to neck BMD and osteoarthritis and rheumatoid arthritis QTLs were detected previously [45,50,51]. KBG syndrome, a postnatal short stature, macrodontia, facial and hand anomalies and delayed bone age was associated



with 9q31.2-q33.1 [71]. The femur elongation QTL on chromosome 11 in HS rats is syntenic to human chromosome 3q11-13 and 3q12-26 (Figure 3C), where femur and hip structural QTLs and QTL for rheumatoid arthritis were observed [45,53,54]. QTLs for developmental components of the craniofacial complex were mapped to baboon ortholog of human chromosome 3q11-13 [65]. Three genes (*Gsn*, *Hspa5* and *Lmx1b*) underlying the QTL on chromosome 3 play important roles in bone and teeth development (Table 2). A haplotype in *Gsn* (gelsolin) was associated with the hip bone phenotypes, and mRNA and protein expressions of *Gsn* in peripheral blood monocytes were lower in female Caucasians with low hip BMD [28]. *Hspa5* (heat shock 70kDa protein 5) or *GRP-78*, an endoplasmic reticulum chaperone protein localized on the plasma membrane in preosteoblasts, is responsible for cellular uptake of Dmp1 for its internalization to the nucleus during bone and tooth development [27]. *Lmx1b* is required for patterning and morphogenesis of the mouse calvaria and is necessary for dorsal-ventral patterning during limb development in mice [24-26].

Several novel genes underlying QTLs discovered in this study were not previously directly linked to any bone phenotype but they code for proteins for various cellular structures and trafficking pathways – such as membrane proteins (*Impg1*, *Senp6*, *Lrrc48*, *Dcbl2*, *Jmjd4* and *Gabbr3*), membrane trafficking (*Gapvd1*, *Lgl1* and *Tom112*), cytoskeletal proteins (*Stom*, *Mprrip* and *Tom112*) and cell junction proteins (*Myo6*, *Myo15a* and *Dcbl2*) that might be important for overall bone homeostasis (Table 2). Also, genes that act as transcription factors or cofactors (*Rhbdd2*, *Zbtb34/43* and *Msl3l2*), G-protein coupled receptors (*Gpr15*, *Mprrip*, *Myo6* and *Myo15a*), small GTPase (*Arl6* and *Arl5b*) and calcium binding proteins (*Flii* and *Fkbp6*) were identified (Table 2). These genes might play role in connection between skeletal metabolism and other systems functions.

There are some limitations in this study. Although, rat skeleton is very similar to human bone with peak bone mass gain or bone loss due to aging, and rat models have served as a highly predictive model for fracture risk in humans, a potential drawback is rat skeleton lacks the Haversian remodeling system found in human. Also, we could not identify any specific sequence variants in the HS founder strains that fully accounted for structure and strength QTLs identified in this study. In the future, full sequence information of HS offspring will shed light on the complex genetic interactions among the different haplotype variants underlying these phenotypes in these animals. Furthermore, while QTLs for bone structure and strength phenotypes in the HS rat were localized to very small genomic regions, further functional studies are necessary to identify the causative genes from these narrowed lists of candidate genes.

In this study, we demonstrated that HS rats are a powerful resource for fine mapping of QTLs for bone structure and strength phenotypes. These phenotypes, along with BMD, are complex in nature in the rat, just as they are in humans and are likely due to multiple variants inherited from different founders as well as interactions among these variants. The number of founder rat lines used in the generation of the HS population and the number of recombination events accumulated over many generations, allowed us to more accurately detect the correct QTL position. Most importantly, this approach allows us to delineate a much smaller chromosomal QTL interval and thus generate a narrower list of potential

candidate genes than the traditional F2 approach – which is a cross of only two founder rat lines. In the future, sequencing studies in the HS offspring in these narrowed regions, along with analysis of the founder strain sequence data, will enable us to dissect the complex genetic architecture underlying the structure and strength phenotypes in the HS rats.

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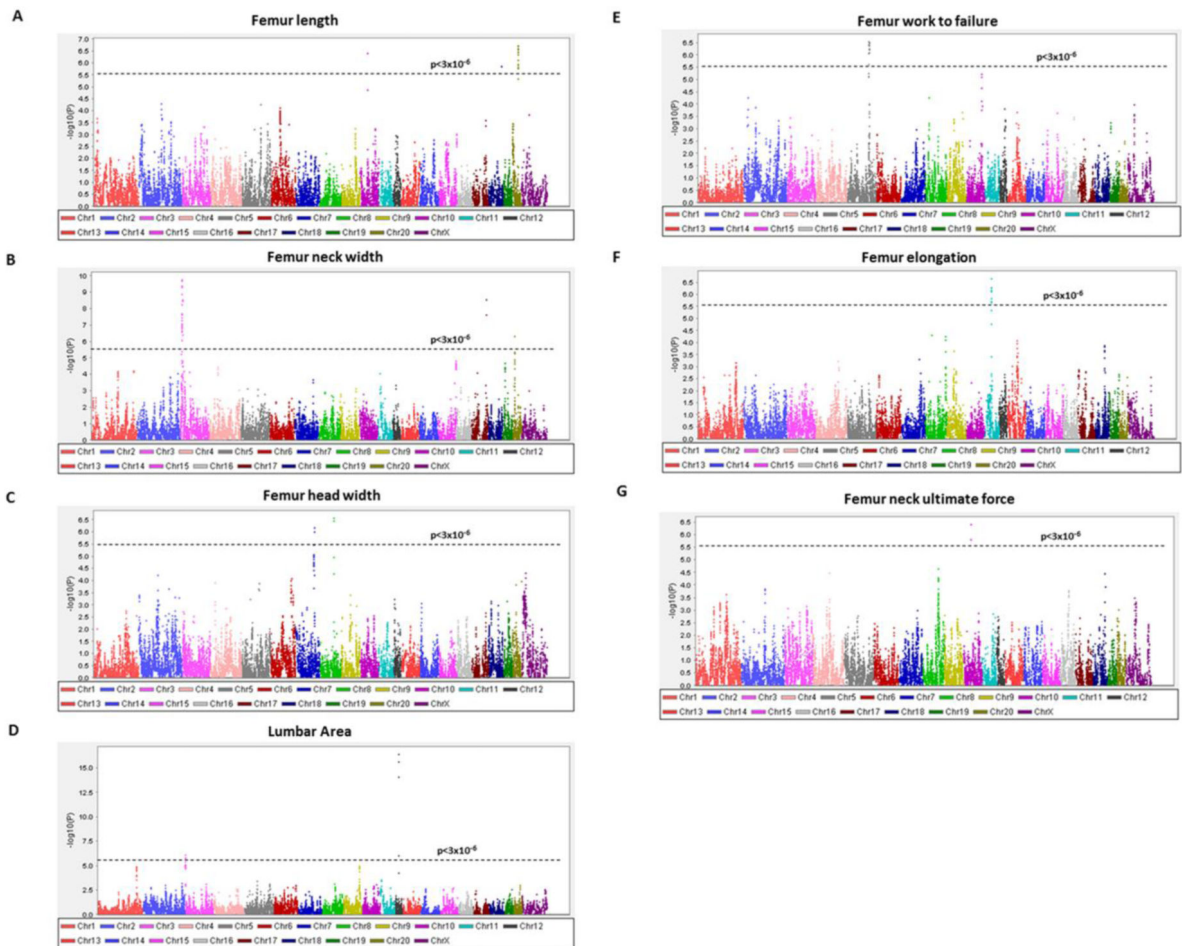
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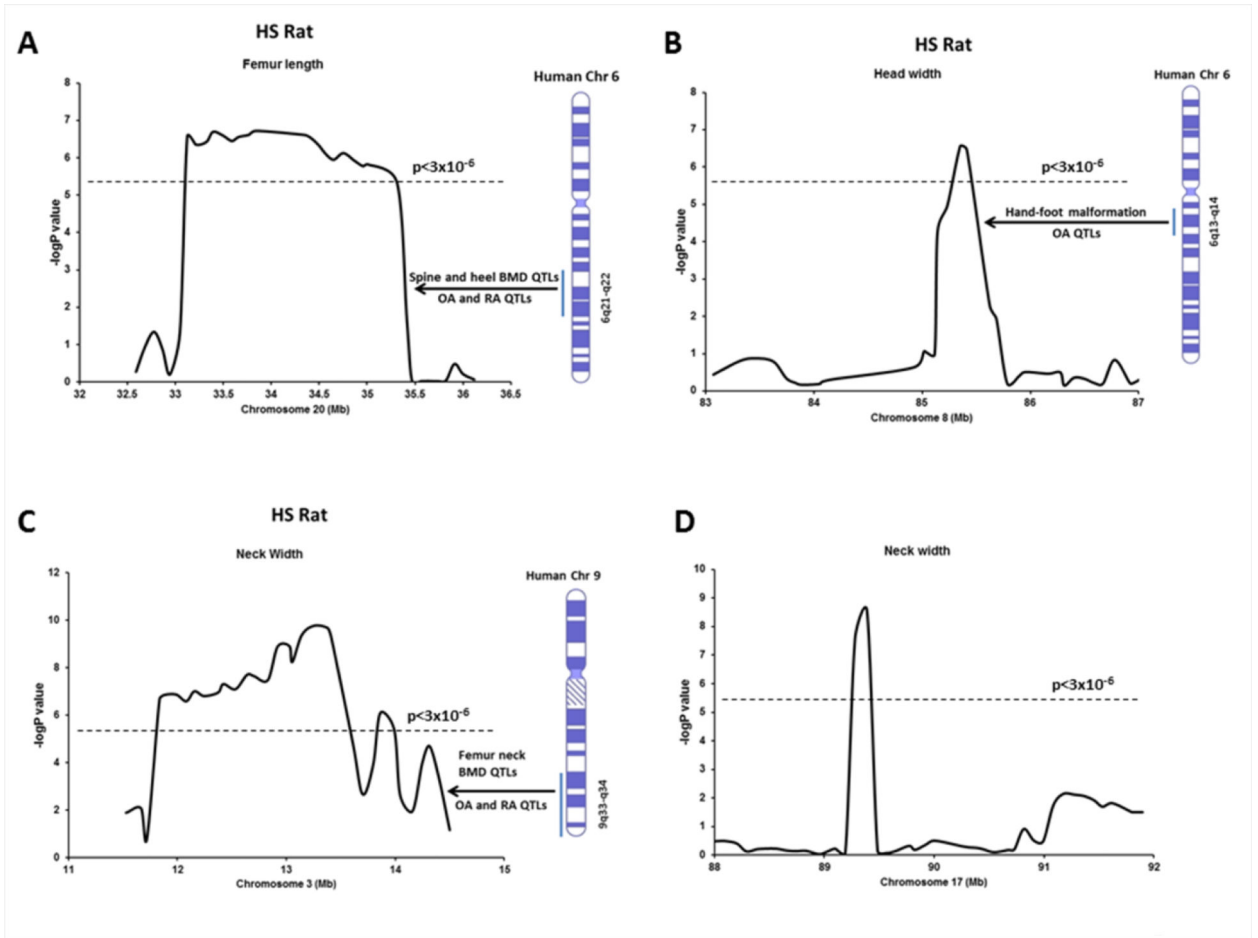
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### Highlights

- We detected QTLs for bone structure and strength phenotypes in HS rats at the most common skeletal fracture sites
- Several chromosomal regions previously identified in our inbred F2 cross were replicated in HS rats
- Most QTLs in HS rats were localized to very narrow genomic regions
- HS rat model allowed us to identify a narrower list of potential candidate genes than the traditional F2 approach
- We demonstrated that HS rats are a powerful resource for fine mapping of QTLs for bone structure and strength phenotypes

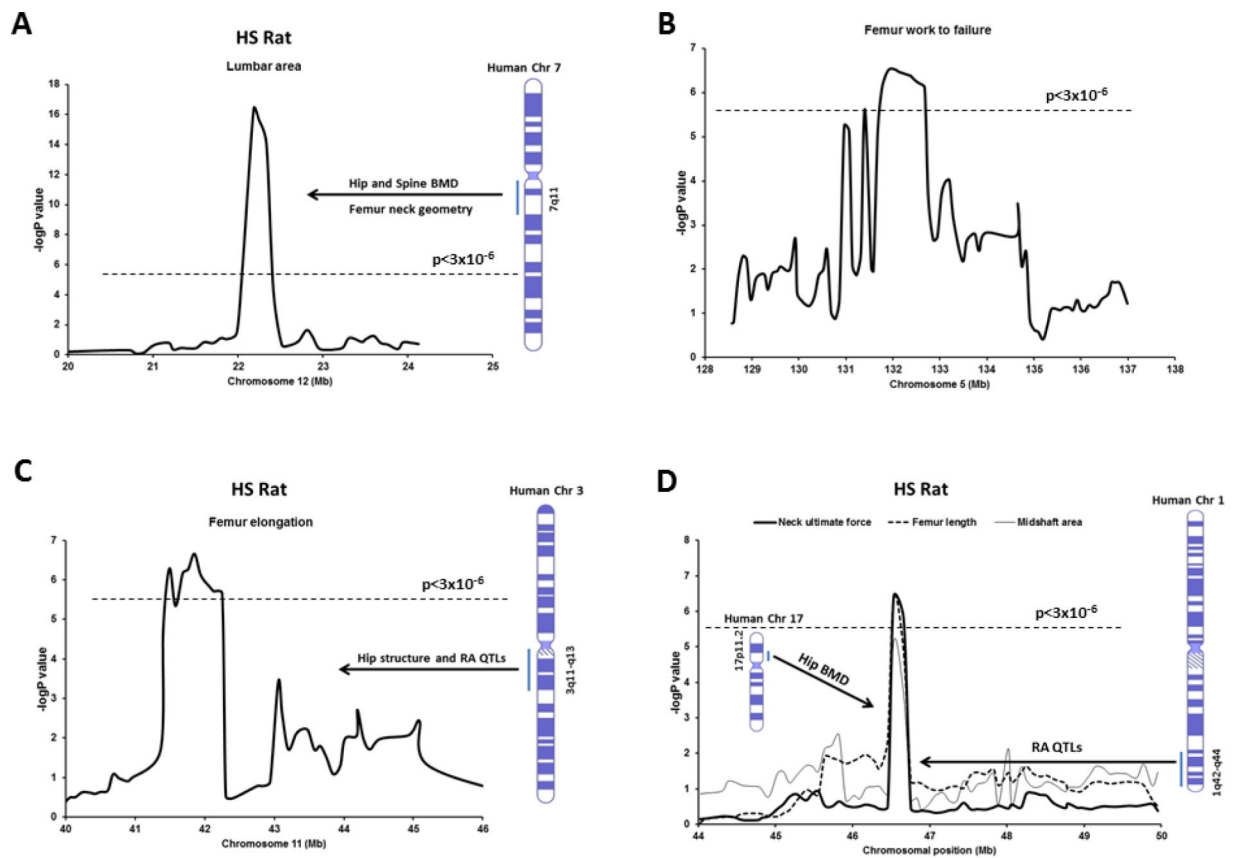


**Fig. 1.** Genome-wide plots for femur length (A), femur neck width (B), femur head width (C), lumbar area (D), femur work to failure (E), femur elongation (F), and femur neck ultimate force (G). The  $-\log_{10}P$  values plotted on the Y-axis versus chromosome position on the X-axis. For comparability with other mapping studies, QTL results are shown at each position regardless of the conservative RMIP threshold (0.3) employed to select the most robust QTLs for our report. The dashed horizontal lines indicate the threshold value for genome-wide significance corresponding to FDR=5% ( $p < 3 \times 10^{-6}$ ).

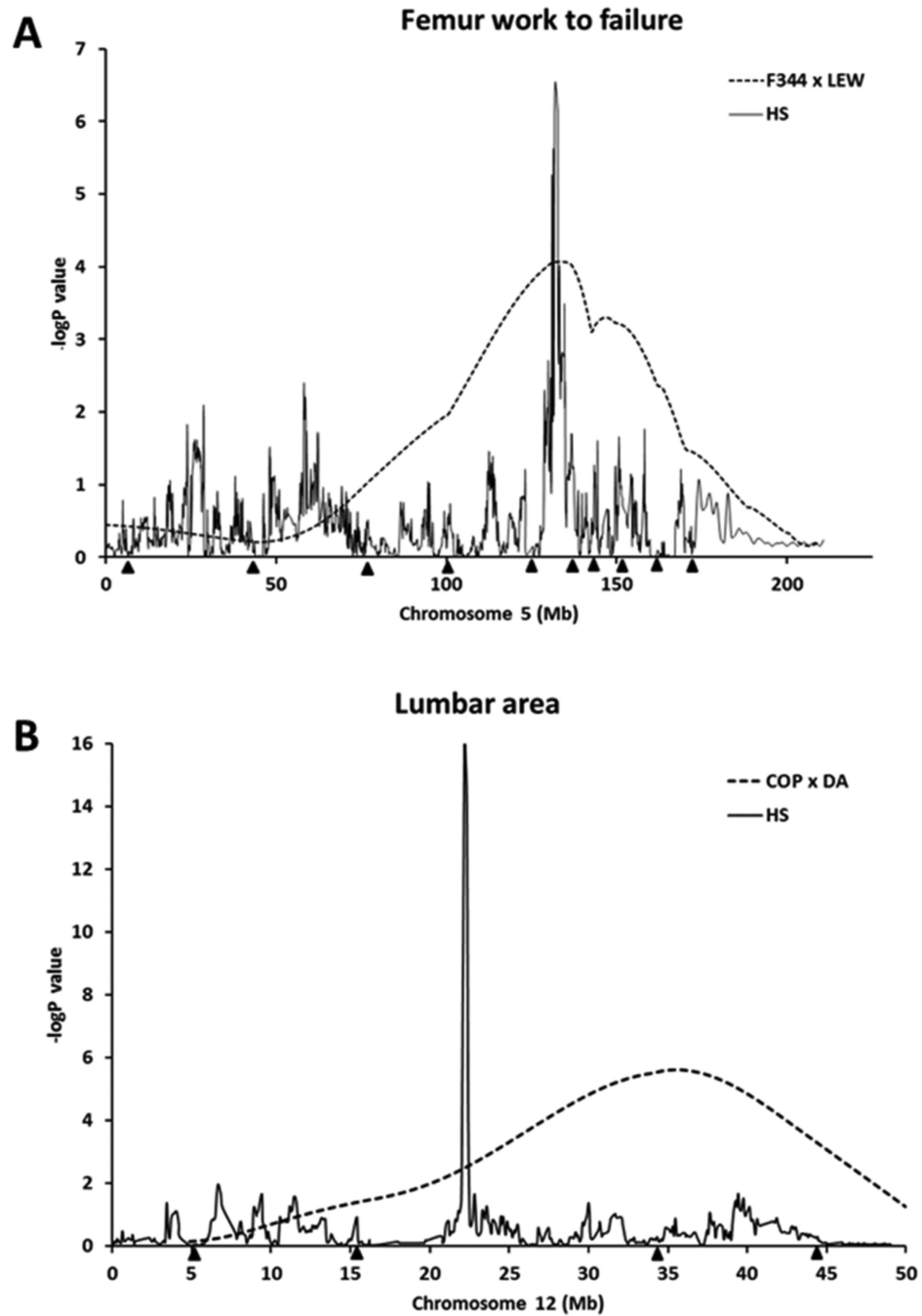


**Fig. 2.** Association results for femur length on chromosome 20 (A), femur head width on chromosome 8 (B), femoral neck width on chromosome 3 (C) and femoral neck width on chromosome 17 (D). The  $-\log P$  values are plotted on the Y-axis vs. the chromosomal position (Mb) on the X-axis. The dashed horizontal lines indicate the threshold value for genome-wide significance corresponding to FDR=5% ( $p < 3 \times 10^{-6}$ ). Corresponding human syntenic regions and associated QTLs for bone phenotypes are indicated.





**Fig. 3.** Association results for lumbar area on chromosome 12 (A), femur work to failure on chromosome 5 (B), femur elongation on chromosome 11 (C), and femoral neck ultimate force, femur length and midshaft area on chromosome 10 (D). The  $-\log P$  values are plotted on the Y-axis vs. the chromosomal position (Mb) on the X-axis. The dashed horizontal lines indicate the threshold value for genome-wide significance corresponding to FDR=5% ( $p < 3 \times 10^{-6}$ ). Corresponding human syntenic regions and associated QTLs for bone phenotypes are indicated.



**Fig. 4.** Mapping results on chromosome 5 (A) for femur work to failure and on chromosome 12 (B) for lumbar area, indicating evidence for QTLs from the HS analysis (solid line) and an F2 intercross (F344 X LEW or COP X DA) reported previously (dotted line). Black triangles along the x-axis correspond to the positions of microsatellite markers typed on each chromosome for the particular F2 intercross.

Chromosomal regions associated with significant linkage ( $p < 3 \times 10^{-6}$ ) for bone structure and strength phenotypes

**Table 1**

Phenotypes	Chromosome	Position (bp)	Interval (Mb)	P-value	logP
Neck width (mm)	3	13253530	12.2 - 15.0	1.75E-10	9.757
Femur work to failure (mJ)	5	131940562	131.0 - 133.5	2.87E-07	6.542
Head width (mm)	8	85352278	84.9 - 85.8	2.71E-07	6.567
Femur length (mm)	10	46530592	45.7 - 47.1	3.84E-07	6.416
Femur neck ultimate force (N)	10	46530592	46.4 - 46.9	3.89E-07	6.410
Femur elongation (mm)	11	41851716	41.4 - 44.3	2.20E-07	6.658
Lumbar area (mm <sup>2</sup> )	12	22185260	22.0 - 22.5	4.00E-17	16.398
Neck width (mm)	17	89388214	89.0 - 89.8	2.78E-09	8.556
Femur length (mm)	20	33840664	32.6 - 35.4	1.90E-07	6.721

**Table 2**

Candidate genes within the chromosomal locations with significant ( $p < 3 \times 10^{-6}$ ) associations for bone structure and strength phenotypes

Phenotype	Chromosome	Interval (Mb)	Gene symbol	Gene name	Human synteny
Neck width (mm)	3	12.2 - 15.0	<i>Angptl2</i>	Angiopoietin-related protein 2	9q31-q34.11
			<i>Cntr1</i>	Centriolin	
			<i>Dab2ip</i>	Disabled homolog 2-interacting protein	
			<i>Fbxw2</i>	F-box/WD repeat-containing protein 2	
			<i>Gapvd1</i>	GTPase activating protein and VPS9 domains 1	
			<i>Ggat1</i>	Glycoprotein alpha-galactosyltransferase 1	
			<i>Ggat1l1</i>	Glycoprotein alpha-galactosyltransferase 1-like 1	
			<i>Gsn</i>	Gelsolin	
			<i>Hspa5</i>	78 kDa glucose-regulated protein	
			<i>Lmx1b</i>	Homeodomain protein LMX1b	
			<i>Mapkap1</i>	Target of rapamycin complex 2 subunit MAPKAP1	
			<i>Pbx3</i>	Pre-B-cell leukemia transcription factor 3	
			<i>Phf19</i>	PHD finger protein 19	
			<i>Psmc5</i>	26S proteasome non-ATPase regulatory subunit 5	
			<i>Rab14</i>	Ras-related protein Rab-14	
			<i>Rabepk</i>	Rab9 effector protein with kelch motifs	
			Femur work to failure (mJ)	5	131.0 - 133.5
<i>Zbtb34/43</i>	Zinc finger and BTB domain-containing protein 34/43				
<i>Agbl4</i>	ATP/GTP binding protein-like 4	1p32.2-p33			
<i>Bend5</i>	BEN domain containing 5				
<i>Cdkn2c</i>	Cyclin-dependent kinase inhibitor 2C (p18 inhibits CDK4)				
<i>Dmrt2</i>	DMRT-like family A2				
<i>Elavl4</i>	ELAV (embryonic lethal abnormal vision Drosophila)-like 4				
<i>Fqf1</i>	Fas (TNFRSF6) associated factor 1				
<i>Skin18</i>	Selection and upkeep of intraepithelial T cells 8				
<i>Slc5a9</i>	Solute carrier family 5 (sodium/sugar cotransporter) member 9				
Head width (mm)	8	84.9 - 85.8	<i>Spata6</i>	Spermatogenesis associated 6	
			<i>Filip1</i>	Filamin A interacting protein 1	6q13-q14.3

Phenotype	Chromosome	Interval (Mb)	Gene symbol	Gene name	Human synteny
			<i>Impg1</i>	Interphotoreceptor matrix proteoglycan 1	
			<i>Myo6</i>	Myosin VI	
			<i>Scnp6</i>	SUMO1/sentrin specific peptidase 6	
	10	45.7 - 47.1	<i>Alkbh5</i>	AlkB alkylation repair homolog 5 (E. coli)	1q42.1-q44
Femur length (mm)			<i>Atpaf2</i>	ATP synthase mitochondrial F1 complex assembly factor 2	17p11.2
			<i>Cops3</i>	COP9 signalosome subunit 3	
			<i>Dhrs7b</i>	Dehydrogenase/reductase (SDR family) member 7B	
			<i>Drg2</i>	Developmentally regulated GTP binding protein 2	
			<i>Fln</i>	Folliculin	
			<i>Flii</i>	Flightless I homolog (Drosophila)	
			<i>Gif3b</i>	Gene trap locus F3b	
			<i>Jmjd4</i>	Jumonji domain containing 4	
			<i>Lgl1</i>	Lethal giant larvae homolog 1 (Drosophila)	
			<i>Lrrc48</i>	Leucine-rich repeat-containing protein 48	
			<i>Map2k3</i>	Mitogen activated protein kinase kinase 3	
			<i>Med9</i>	Mediator complex subunit 9	
			<i>Mprip</i>	Myosin phosphatase Rho interacting protein	
			<i>Myo15a</i>	Myosin XVA	
			<i>Nlrp3</i>	NLR family pyrin domain containing 3	
			<i>Olr1462/1462/1464</i>	Olfactory receptor 1462/1463/1464	
			<i>Pld6</i>	Phospholipase D family member 6	
			<i>Rail</i>	Retinoic acid induced 1	
			<i>Rasd1</i>	RAS dexamethasone-induced 1	
			<i>Shmt1</i>	Serine hydroxymethyltransferase 1 (soluble)	
			<i>Sincr7/8</i>	Smith-Magenis syndrome chromosome region candidate 7/8	
			<i>Scnp47</i>	Synaptosomal-associated protein 47	
			<i>Stebf1</i>	Sterol regulatory element-binding protein 1	
			<i>Tmem11</i>	Transmembrane protein 11	
			<i>Tom1l2</i>	TOM1-like protein 2	
			<i>Top3a</i>	Topoisomerase (DNA) III alpha	
			<i>Zfp496/867</i>	zinc finger protein 496/867	

Phenotype	Chromosome	Interval (Mb)	Gene symbol	Gene name	Human synteny
Femur neck ultimate force (N)	10	46.4 - 46.9	<i>Alkbh5</i>	AlkB alkylation repair homolog 5 (E. coli)	17p11.2
			<i>Atpaf2</i>	ATP synthase mitochondrial F1 complex assembly factor 2	
Femur elongation (mm)	11	41.4 - 44.3	<i>Drg2</i>	Developmentally regulated GTP binding protein 2	
			<i>Ftli</i>	Flightless I homolog (Drosophila)	
			<i>Ljgl1</i>	Lethal giant larvae homolog 1 (Drosophila)	
			<i>Lrrc48</i>	Leucine-rich repeat-containing protein 48	
			<i>Myo15a</i>	Myosin XVa	
			<i>Rail</i>	Retinoic acid induced 1	
			<i>Smer7l8</i>	Smith-Magenis syndrome chromosome region candidate 7/8	
			<i>Srebfl</i>	Sterol regulatory element-binding protein 1	
			<i>Tom1l2</i>	TOM1-like protein 2	
			<i>Top3a</i>	Topoisomerase (DNA) III alpha	
			<i>Ar16</i>	ADP-ribosylation factor-like 6	3q11.2-q13.33
			<i>Cldnd1</i>	Claudin domain containing 1	3q12-q26
			<i>Cms1</i>	Cms1 ribosomal small subunit homolog (yeast)	
			<i>Col8a1</i>	Collagen type VIII alpha 1	
			<i>Cpox</i>	Coproporphyrinogen oxidase	
			<i>Crybg3</i>	Beta-gamma crystallin domain containing 3	
			<i>Dcbld2</i>	Discoidin CUB and LCCL domain containing 2	
			<i>Epha6</i>	Eph receptor A6	
			<i>Filip1l</i>	Filamin A interacting protein 1-like	
			<i>Gabbr3</i>	Gamma-aminobutyric acid (GABA) A receptor rho 3	
<i>Gpr15</i>	G protein-coupled receptor 15				
<i>Mina</i>	Myc induced nuclear antigen				
<i>Nit2</i>	Nitrlase family member 2				
<i>Olf1 clusters</i>	Olfactory receptors clusters				
<i>St3gal6</i>	ST3 beta-galactoside alpha-2,3-sialyltransferase 6				
<i>Tbc1d23</i>	TBC1 domain family member 23				
<i>Tmem30c</i>	Transmembrane protein 30C				
Lumbar area (mm <sup>2</sup> )	12	22.0 - 22.5	<i>Cc12426</i>	Chemokine (C-C motif) ligand 24/26	7q11.23
			<i>Fkbp6</i>	Peptidyl-prolyl cis-trans isomerase FKBP6	

Phenotype	Chromosome	Interval (Mb)	Gene symbol	Gene name	Human synteny
			<i>Hip1</i>	Huntingtin interacting protein 1	
			<i>Mdh2</i>	Malate dehydrogenase, mitochondrial	
			<i>Nsun5</i>	NOL1/NOP2/Sun domain family, member 5	
			<i>Pom121</i>	Nuclear envelope pore membrane protein POM 121	
			<i>Por</i>	NADPH-cytochrome P450 reductase	
			<i>Rhbdd2</i>	Rhomboid domain containing 2	
			<i>Srrm3</i>	Serine/arginine repetitive matrix 3	
			<i>Syx11</i>	Serine/threonine/tyrosine-interacting-like protein 1	
			<i>Tmem120a</i>	Transmembrane protein 120A	
			<i>Trim50</i>	E3 ubiquitin-protein ligase TRIM50	
Neck width (mm)	17	89.0 - 89.8	<i>Arl5b</i>	ADP-ribosylation factor-like 5B	10p12.1-p13
			<i>Cacnb2</i>	Calcium channel voltage-dependent beta 2 subunit	
			<i>Nsun6</i>	NOP2/Sun domain family member 6	
Femur length (mm)	20	32.6 - 35.4	<i>Msl3l2</i>	Male-specific lethal 3-like 2	6q21-q22.33
			<i>Tbc1d32</i>	TBC1 domain family member 32	