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## ORIGINAL ARTICLE

OXFORD

# Identification of a novel FGFRL1 MicroRNA target site polymorphism for bone mineral density in meta-analyses of genome-wide association studies

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## Abstract

MicroRNAs (miRNAs) are critical post-transcriptional regulators. Based on a previous genome-wide association (GWA) scan, we conducted a polymorphism in microRNA target sites (poly-miRTS)-*centric* multistage meta-analysis for lumbar spine (LS)-, total hip (HIP)- and femoral neck (FN)-bone mineral density (BMD). In stage I, 41 102 poly-miRTSs were meta-analyzed in seven cohorts with a genome-wide significance (GWS)  $\alpha = 0.05/41 102 = 1.22 \times 10^{-6}$ . By applying  $\alpha = 5 \times 10^{-5}$  (suggestive significance), 11 poly-miRTSs were selected, with FGFRL1 rs4647940 and PRR5 rs3213550 as top signals for FN-BMD (P = 7.67 × 10<sup>-6</sup> and 1.58 × 10<sup>-5</sup>) in gender-combined sample. In stage II in silico replication (two cohorts), FGFRL1 rs4647940 was the only signal marginally replicated for FN-BMD (P =  $5.08 \times 10^{-3}$ ) at  $\alpha = 0.10/11 = 9.09 \times 10^{-3}$ . PRR5 rs3213550 was also selected based on biological significance. In stage III *de novo* genotyping replication (two cohorts), FGFRL1 rs4647940 was the only signal significantly replicated for FN-BMD (P =  $7.55 \times 10^{-6}$ ) at  $\alpha = 0.05/2 = 0.025$  in gender-combined sample. Aggregating three stages, FGFRL1 rs4647940 was the single stage I-discovered and stages II- and III-replicated signal attaining GWS for FN-BMD (P =  $8.87 \times 10^{-12}$ ). Dual-luciferase reporter assays demonstrated that FGFRL1 3' untranslated region harboring rs4647940 appears to be hsa-miR-140-5p is target site. In a zebrafish microinjection experiment, dre-miR-140-5p is shown to exert a dramatic impact on craniofacial skeleton formation. Taken together, we provided functional evidence for a novel FGFRL1 poly-miRTS rs4647940 in a previously known 4p16.3 locus, and experimental and clinical genetics studies have shown both FGFRL1 and hsa-miR-140-5p are important for bone formation.

## Introduction

Osteoporosis, a common skeletal disease characterized by low bone mineral density (BMD) and deterioration in bone microarchitecture, impaired bone strength and leads to an increased risk of fragility fractures (1). Twin and family studies of BMD have shown that 60–90% of BMD variation can be attributed to genetic factors (2–6).

MicroRNAs (miRNAs) are evolutionarily conserved, endogenous, single-stranded, non-coding RNAs of 18–24 nucleotides in length that regulate gene expression, typically by binding to their complementary sequences located at 3' untranslated regions (UTRs) of target mRNAs by mediating target mRNA degradation and/or protein synthesis repression (7,8). There are 2578 mature human miRNA sequences currently listed in miRBase (9,10). Further, more than 45 000 conserved miRNA target sites within human 3' UTRs have been identified, and more than 60% of human protein-coding genes are under selective pressure to maintain pairing to miRNAs (11). Each miRNA can modulate about 200 target mRNAs (12,13).

Canonical miRNA targeting is mediated by a perfect Watson– Crick pairing of miRNA's 5' seed region, typically comprising nucleotides 2–7 at 5'-end of an miRNA (12), which determines both target site specificity (14–16) and most of energy change involved in miRNA–mRNA binding (17,18). Some 6-mer seeds also match to positions 1–6 (19,20). The miRNA–mRNA binding is determined not only by the thermodynamic property of miRNA, but also by characteristic secondary structure of the target mRNA's 3' UTR containing the miRNA binding site (21), which can be affected by single-nucleotide polymorphisms (SNPs) either inside or outside the miRNA target site that alter miRNA accessibility (13,22).

Disruptions of miRNA binding sites by SNPs present in 3' UTRs of mammalian genes known as polymorphisms in microRNA

target sites (poly-miRTSs), have been clearly documented, e.g. (23–25). By abolishing/modifying/creating miRNA target sites, such SNPs may affect target mRNA/protein expressions, which could modulate diseases risks (23,26–28).

Although genome-wide association (GWA) studies have been successful in identifying new genes with common variants that exert modest effects on complex traits (e.g. BMD), conventional 'hypothesis-free' GWA approach commonly performs 1 million independent association tests, and therefore has strict requirements for controlling occurrences of false positives in such an 'unbiased' approach [typically, a genome-wide significance (GWS) threshold of  $\alpha = 5 \times 10^{-8}$  is applied], resulting in severe multiple testing corrections. True positive associations could be missed, particularly in the presence of limited replication resources (29). More than 90% of SNPs collected in the National Human Genome Research Institute (NHGRI) Genome-wide Association Study catalog (30) are located within non-coding regions (31). However, many such non-coding SNPs are simply neglected due to a lack of functional annotations. Therefore, revisiting GWA scans from the perspective of biological knowledge (e.g. miRNA target sites, promoter methylation regions) could discover new genetic variants that are experimentally testable. Because the human genome harbors a large number of polymiRTSs that are potentially important (32,33), screening exclusively those poly-miRTSs could discover novel regulatory SNPs affecting gene expressions thanks to a less number of statistical tests based on biological meaning. Because such a functional candidate genomic region association approach may increase type I error rate (i.e.  $\alpha$ ), to minimize false positives, a multistage approach was applied, such that those stage I-selected poly-miRTSs based on a moderate threshold ( $\alpha = 5 \times 10^{-5}$ ) are subject to stringent stage II- and stage III-independent replications based on their respective Bonferroni-corrected significance thresholds.

## Results

Basic genotype information and phenotype characteristics for the three stages of GWA meta-analysis focusing on poly-miRTSs were presented in Table 1.

### Stage I (GWA discovery)

As shown in Figure 1, seven cohorts, i.e. OOS (Omaha Osteoporosis study), KCOS (Kansas City Osteoporosis study), COS (Chinese Osteoporosis), FHS (Framingham Heart Study), WHI-AA [Women's Health Initiative (WHI), African American ancestry], and WHI-HiS (WHI, Hispanic ancestry) were included in this GWA discovery stage. Through genotype imputation using 1 KG reference panels, 5 842 825 SNPs (genotyped + imputed) were imputed (34). Because the current study only focused on 41 102 poly-miRTSs of 5 842 825 SNPs, quantile-quantile (Q-Q) plots were generated exclusively for these 41 102 poly-miRTSs for gender-combined (i.e. male and female) sample and female-specific sample, respectively (Supplementary Material, Fig. S1). SNP ranks, names and P-values for five top signals of 11 stage I-selected poly-miRTS for femoral neck (FN)-BMD in gender-combined sample (i.e. rs4647940, rs3213550, rs523200, rs11581122 and rs10739677) and in femalespecific sample (i.e. rs4647940, rs1599795, rs10739677, rs3213550 and rs523200) were indicated. After adjusting BMD phenotypes by five principal components, genomic control (GC) inflation factor  $(\lambda_{GC})$  was computed for each of lumbar spine (LS)-, total hip (HIP)and FN-BMD traits for stage I 41 102 poly-miRTSs in gender-combined and female-specific samples, respectively, and these  $\lambda_{GC}$ 's were compared with those of 5842825 SNPs of the traditional GWA study of Zhang et al. (34). Overall, because these 41 102 polymiRTSs were not random SNPs, but rather SNPs with biologically higher prior probabilities,  $\lambda_{GC}$ 's were slightly increased from the range of 1.03-1.04 to the range of 1.033-1.121 (Supplementary Material, Table S1). To protect against an increase in type I error rate (i.e.  $\alpha$ ), we applied a multi-stage approach such that those stage I-selected poly-miRTSs based on a moderate threshold ( $\alpha = 5 \times 10^{-5}$ ) are subject to stage II- and stage III-independent replications based on their respective Bonferroni-corrected significance thresholds. Three polymiRTSs of two genes attained GWS (i.e.  $\alpha = 0.05/41102 = 1.22 \times 10^{-6}$ ): OSBPL2 rs6089342 (P =  $2.70 \times 10^{-7}$ ) and rs6121978 (P =  $3.65 \times 10^{-7}$ ) located on chromosome 20q13.33 for LS-BMD in gender-combined sample, and TMEM135 rs550773 ( $P = 5.93 \times 10^{-7}$ ) located on chromosome 11q14.2 for FN-BMD in gender-combined sample. Another 37 poly-miRTSs had P-values in the range of  $1.22\times10^{-6}$  to  $5\times10^{-5}.$  Of these 40 top-ranking poly-miRTSs at  $\alpha = 5 \times 10^{-5}$  (suggestive significance), 11 (i.e. SLC22A2 rs3127592 and rs3127593, FGFRL1 rs4647940, CD80 rs1599795, C6orf97-ESR1 rs9479085, PRR5 rs3213550, PTH2R rs1057392, FAM125B rs10739677, AMAC1 rs17547201, FAM46C rs11581122 and SF1 rs523200, located in 10 gene regions) were selected based on SNP selection criteria: (i) statistical significance threshold ( $P < 5 \times 10^{-5}$ ); (ii) allelic association direction (if  $\ge 2$  traits are available, same directions for  $\geq 6$  of seven cohorts for each trait; if only one trait is available, same directions for all seven cohorts); and (iii) biological significance, [i.e. being an miRNA target site disease-associated SNP (miRTSdSNP) according to Bruno et al. (35)].

#### Stage II (in silico replication)

At stage II, these above 11 stage I-selected poly-miRTSs were further subject to *in silico* replication in two independent cohorts: (i) RS (Rotterdam Study; N = 4904, 57.0% women) and (ii) AOGC (Angle-Australasian Osteoporosis Genetics Consortium; N = 1955, 100.0% women). The following SNP selection criteria were applied for stage II SNP selection: (i) statistical significance threshold (Bonferroni-corrected marginal significance, i.e.  $P < 0.1/11 = 9.09 \times 10^{-3}$ ) and (ii) biological

significance. Only one poly-miRTS met statistical significance threshold—FGFRL1 rs4647940, with a  $P = 5.078 \times 10^{-3}$  for FN-BMD in gender-combined sample (Table 2). At stage I, FGFRL1 rs4647940 is top signal among these stage I-selected 11 poly-miRTSs for FN-BMD in gender-combined sample. As shown in Supplementary Material, Figure S1A, for this trait, there was a bigger gap of -log<sub>10-</sub> (P-value) between rs3213550 and rs523200 [ $\Delta$ -log<sub>10</sub>(P-value) =  $-\log_{10^{-10}}$  $(1.58 \times 10^{-5}) + \log_{10}(4.76 \times 10^{-5}) = 0.4789$ ] than between rs523200 and rs11581122  $[\Delta - \log_{10}(P - value) = -\log_{10}(4.76 \times 10^{-5}) + \log_{10}(6.66 \times 10^{-5}))$  $10^{-5}$ ) = 0.1459], and between rs11581122 and rs10739677 [ $\Delta$ -log<sub>10</sub>(Pvalue) =  $-\log_{10}(6.66 \times 10^{-5}) + \log_{10}(1.267 \times 10^{-4}) = 0.2793$ ]. In addition, as shown in Supplementary Material, Figure S1B, second top signal for FN-BMD trait in female-specific sample, i.e. rs1599795, had a less significant P-value (i.e.  $8.32 \times 10^{-5}$ ) than the P-value of second top signal (i.e.  $1.58 \times 10^{-5}$ ) for the same trait in gender-combined sample, i.e. rs3213550. Further, besides rs4647940 ( $P = 7.67 \times 10^{-6}$ ), which attained an  $\alpha = 5 \times 10^{-5}$  threshold in gender-combined and female-specific samples, rs3213550 ( $P = 1.58 \times 10^{-5}$ ) is the only other poly-miRTS that attained an  $\alpha = 5 \times 10^{-5}$  threshold in gender-combined sample, and an  $\alpha = 5.5 \times 10^{-4}$  (a more relaxed threshold compared with  $\alpha = 5 \times 10^{-5}$ ) in female-specific sample, respectively. Taken together, at stage II, PRR5 poly-miRTS rs3213550 exhibited a relatively robust association for FN-BMD at stage I. Although this SNP did not reach stage II marginal significance threshold (P = 0.3138  $> 9.09 \times 10^{-3}$ ), it is notable that at stage I, it had consistent significant associations for FN-BMD in gender-combined and female-specific samples. PRR5 is a recently identified component of mammalian target of rapamycin complex 2 (mTORC2), which also contains four other components, i.e. mTOR, Rictor, mSin1, mLST8/GL and plays a critical role in bone development and homeostasis (36-38). PRR5 interacts with Rictor in regulating skeletal growth (39). Further, prior biological evidence suggests that rs3213550, which is located in 3' UTR of PRR5 gene, is a disease-associated miRTSdSNP (35). Therefore, at stage II, based on biological significance of PRR5 and mTORC2 for bone growth and stage I statistical significance for FN-BMD (i.e. a runner up following rs4647940), PRR5 poly-miRTS rs3213550 was also selected for stage III de novo genotyping replication.

#### Stage III (de novo genotyping replication)

At stage III, the above two stage II-selected poly-miRTSs located in two respective gene regions—FGFRL1 and PRR5, were further subject to replication by *de novo* genotyping in two independent cohorts: (i) KCOSR (KCOS Replication; N = 3932, 57.6% women) and (ii) COSR (COS Replication; N = 2740, 57.7% women). In this stage, SNP selection criterion is solely based on Bonferronicorrected statistical significance threshold (P < 0.05/2 = 0.025) for FN-BMD trait in gender-combined sample. Only FGFRL1 rs4647940 met this criterion for FN-BMD ( $P = 7.55 \times 10^{-6}$ ), in gender-combined sample (Table 2).

#### Stage I+II+III meta-analysis

Meta-analysis results pooling all available data across stages I, II and III for two poly-miRTSs—FGFRL1 rs4647940 and PRR5 rs3213550 for FN-BMD in gender-combined sample revealed that FGFRL1 rs4647940 ( $P = 8.87 \times 10^{-12}$ ) was the only poly-miRTS that attained both the current study's GWS (i.e.  $P < 1.22 \times 10^{-6}$ ) and conventional GWS (i.e.  $P < 5 \times 10^{-8}$ ) (Table 2). Stage I's second top signal for FN-BMD of 11 stage I-selected poly-miRTSs—PRR5 rs3213550 ( $P = 1.17 \times 10^{-5}$ ) did not attain the current study's reduced GWS. Taken together, the current study has identified and robustly replicated FGFRL1 rs4647940 as the only signal associated with FN-BMD in gender-combined sample. As shown in forest plot of stage I + II + III meta-analysis of poly-miRTS,

Sample	N	Population	# Genotyped SNPs	# Imputed SNPs	Female (%)	Age (years)	LS-BMD (g/cm²)	HIP-BMD (g/cm²)	FN-BMD (g/cm²)	Bone densitometer
Stage I <sup>b</sup> (GW	A meta-ar	alysis)								
OOS	987	Caucasian	407 634	6 427 198	49.6	50.3 (18.3)	1.03 (0.16)	0.97 (0.16)	0.81 (0.14)	Hologic QDR 4500W
KCOS	2250	Caucasian	743 768	7 085 256	75.9	51.4 (13.8)	1.02 (0.16)	0.97 (0.17)	0.80 (0.15)	Hologic QDR 4500W
COS	1547	Han Chinese	725 883	5 823 600	50.7	34.8 (13.4)	0.95 (0.13)	0.92 (0.13)	0.81 (0.13)	Hologic QDR 4500W
FHS	3747	Caucasian	405 948	6 456 277	57.3	60.3 (10.7)	1.22 (0.23)	0.95 (0.17)	0.89 (0.16)	Lunar DPX-L
IFS	1488	Caucasian	543 932	7 202 569	100.0	32.7 (7.2)	_	_	_	Lunar DPX-L
WHI-AA	712	African American	799 328	11 862 114	100.0	60.9 (6.9)	1.05 (0.17)	0.95 (0.15)	0.83 (0.14)	Hologic QDR-2000
WHI-HIS	409	Hispanic	647 362	6 916 926	100.0	60.7 (7.2)	0.97 (0.16)	0.86 (0.13)	0.73 (0.12)	Hologic QDR-2000
Total	11 140									
Stage II <sup>c</sup> (in s	ilico replic	ation)								
RS	4904	Caucasian	512 349	6 986 425	57.0	69.4 (9.0)	1.09 (0.18)	NA	0.86 (0.13)	Lunar DPX-L
AOGC	1955	Caucasian	Region-wise	Region-wise	100.0	69.6 (8.6)	1.08 (0.26)	0.89 (0.25)	0.79 (0.21)	Multiple <sup>d</sup>
Total	6859									
Stage III (de r	10vo genot	yping replication)								
KCOSR	3923	Caucasian	3	0	57.6	46.8 (14.5)	1.03 (0.15)	0.96 (0.15)	0.80 (0.14)	Hologic QDR
COSR	2740	Han Chinese	3	0	57.7	32.3 (14.4)	0.93 (0.12)	0.91 (0.13)	0.80 (0.13)	Hologic QDR 4500W
Total	6663					. ,		. ,	. ,	

#### Table 1. Basic genotype information and phenotype characteristics of the study cohorts at stages I, II and III<sup>a</sup>

<sup>a</sup>Adapted from Supplementary Material, Table S1 of Zhang *et al.* (34). Although the Korean Genome Epidemiology Study (KoGES) was included in stage 2 (*in silico* replication) of Zhang *et al.* (34), because none of KoGES results were included in the *in silico* replication of stage I-selected poly-miRTSs, the stage II (*in silico* replication) of the current study only included RS and AOGC, but not KoGES. Data were presented as mean (SD). N denotes sample size for each study cohort. OOS, Omaha Osteoporosis Study; KCOS, Kansas-City Osteoporosis Study; COS, China Osteoporosis Study; FHS, Framingham Heart Study; IFS, Indiana Fragility Study; WHI-AA, Women's Health Initiative African American ancestry; WHI-HIS, Women's Health Initiative Hispanic ancestry. RS, Rotterdam Study; AOGC, Australian Osteoporosis Genetics Consortium; KCOSR, KCOS Replication; COSR, COS Replication. SNP, single-nucleotide polymorphism; poly-miRTS, polymorphism in microRNA target sites; BMD, bone mineral density; LS, lumbar spine; HIP, total hip; FN, femoral neck. '—', not available. λ<sub>GC</sub> ranges from 0.99 to 1.06 (34).

<sup>c</sup>As indicated in Zhang *et al.* (34), for AOGC study, genotype imputations were only performed for specific regions, and only 11 stage I-selected poly-miRTSs were included in stage II of the current study. <sup>d</sup>Either Hologic QDR or Lunar DPX-L series was used to measure BMD.



Figure 1. A flow chart of the poly-miRTS-centric three-stage GWA meta-analysis and experimental validation. GWA, genome-wide association; SNP, single-nucleotide polymorphism; DB, database; poly-miRTSs, polymorphisms in microRNA target sites; study name abbreviations are shown in footnote of Table 1.

FGFRL1 rs4647940 for FN-BMD in gender-combined sample (Fig. 2), not only the overall meta-analysis across these 11 cohorts attained conventional GWS (i.e.  $P < 5 \times 10^{-8}$ ), but also all replication cohorts of stage II (AOGC and RS) and stage III (COSR and KCOSR) have same directions of allelic associations as  $\geq 6$  out of seven stage I cohorts.

## Regional association plots and linkage disequilibrium $r^2$ plots

A regional association plot of traditional GWA meta-analysis results for FN-BMD trait of FGFRL1 poly-miRTS rs4647940 and those stage I SNPs in the ± 100-kb flanking regions, particularly intergenic rs6827815 (currently considered as located within IDUA gene region; http://www.ncbi.nlm.nih.gov/projects/SNP/snp\_ref. cgi?rs=6827815) of Zhang et al. (34) and IDUA rs3755955 of Estrada et al. (40), were shown in Figure 3A, with a zoom-in view of the middle part (i.e.  $\pm$  27-kb flanking regions) spanning these three SNPs shown in Figure 3B. In order to delineate a high-resolution linkage disequilibrium (LD) structure for 4p16.3 locus encompassing these three SNPs, an LD  $r^2$  plot for 58 SNPs (from rs11731377 to rs13114658 spanning 80.744-kb) was generated for OOS (Fig. 4A) and KCOS (Fig. 4B) cohorts, respectively, both of which are of Caucasian ancestry. This entire region is partitioned into left and right haplotype blocks: block 1 (left) extends from rs11731377 to rs4647940 (30 SNPs) and block 2 (right) extends from rs13137819 and rs13114658 (28 SNPs) in each cohort. All these three SNPs (i.e. rs3755955, rs6827815 and rs4647940) are located within block 1 in both cohorts, such that rs4647940 is in a moderately high LD with both rs3755955  $[r^2 = 0.649$  and 0.842 for OOS (N = 987) and KCOS (N = 2250), respectively] and rs6827815 ( $r^2 = 0.702$  and 0.857 in OOS and KCOS, respectively).

#### Conditional meta-analysis

In rs3755955-rs6827815-rs4647940 region, because rs6827815 (distance: 20.946 kb) is physically closer to rs4647940 than

rs3755955 (distance: 25.977 kb), two conditional analyses were performed: (i) rs4647940 conditional on rs6827815: under a fixed-effects model,  $P = 1.35 \times 10^{-3}$  for FN-BMD in stage I gender-combined sample, which remains to be significant at  $\alpha = 5.00 \times 10^{-3}$ , suggesting rs4647940 and rs6827815 represent distinct signals at this chromosomal locus and (ii) rs4647940 conditional on both rs3755955 and rs6827815: under a fixed-effects model,  $P = 1.33 \times 10^{-3}$  for FN-BMD in stage I gendercombined sample.

## Predicted RNA secondary structures of FGFRL1 3' UTR harboring rs4647940

The secondary structure of a 121-bp (i.e. rs4647940 with ± 60-bp flanking regions) FGFRL1 3' UTR segment carrying either wild-type (WT) (i.e. 'C') or mutant (MUT) (i.e. 'G') allele of rs4647940 was predicted by RNAfold. Difference of minimum free energies (MFEs) between folding patterns for MUT and WT alleles is  $\Delta$ MFE = MFE<sub>MUT</sub> - MFE<sub>WT</sub> = (-34.30) - (-34.10) = -0.20 kcal/mol. Therefore, the secondary structure of WT allele such that the SNP is located in a stem connected to a terminal loop and an internal loop (Fig. 5A) is less stable than that of MUT allele such that the SNP is located in a stem connected to two internal loops (Fig. 5B). Therefore, this SNP causes a change of RNA secondary structure of FGFRL1 3' UTR, potentially affecting miRNA target site accessibility.

## Evolutionary conservation of FGFRL1 3' UTR harboring rs4647940

Multiple sequence alignment of orthologous sequences of FGFRL1 3' UTR segment encompassing rs4647940 from human, chimpanzee, gorilla, gibbon, orangutan and rhesus macaque species showed that this SNP corresponds to a highly conserved

Doly miDTC			Ctored I			Ctore II			Ctore III			C+0.00 I - 11 - 111
dbSNP ID	Locus	Gene	Phenotype	Analysis	P-value	Phenotype	Analysis	P-value	Phenotype	Analysis	P-value	P-value
rs3127592	6q25.3	SLC22A2	HIP-BMD	Combined	$3.24 \times 10^{-6}$	FN-BMD	Combined	0.5034	I	I	I	I
rs3127593	6q25.3	SLC22A2	HIP-BMD	Combined	$6.59 \times 10^{-6}$	FN-BMD	Combined	0.4638	I		I	I
rs4647940	4p16.3	FGFRL1	FN-BMD	Combined	$7.67  imes 10^{-6}$	FN-BMD <sup>b</sup>	Combined	$5.078 \times 10^{-3}$	FN-BMD <sup>b</sup>	Combined	$7.55 \times 10^{-6}$	$8.87 \times 10^{-12}$
rs1599795	3q13.33	CD80	HIP-BMD	Combined	$1.32 \times 10^{-5}$	FN-BMD	Combined	0.3689	I			I
rs9479085	6q25.1	C6orf97	LS-BMD	Combined	$1.47 \times 10^{-5}$	LS-BMD <sup>b</sup>	Combined	$9.202 \times 10^{-3}$	I		I	I
rs3213550	22q13.31	PRR5	FN-BMD	Combined	$1.58 \times 10^{-5}$	FN-BMD <sup>b</sup>	Combined	0.3138	FN-BMD	Combined	0.08208	$1.17 \times 10^{-5}$
rs1057392	2q34	PTH2R	HIP-BMD	Combined	$2.60 \times 10^{-5}$	FN-BMD	Combined	0.3167	I			I
rs10739677	9q33.3	FAM125B	HIP-BMD	Female	$2.67 \times 10^{-5}$	FN-BMD	Combined	0.4262	I		I	I
rs17547201	17q12	AMAC1	HIP-BMD	Female	$2.79 \times 10^{-5}$	FN-BMD	Combined	0.4009	Ι		I	I
rs11581122	1p12	FAM46C	HIP-BMD	Combined	$4.47 \times 10^{-5}$	FN-BMD	Combined	0.6717			I	I
rs523200	11q13.1	SF1	FN-BMD	Combined	$4.76 \times 10^{-5}$	FN-BMD <sup>b</sup>	Combined	0.1879			I	

were available for two cohorts in each respective stage of stages II and III. Otherwise, data were available for only one cohort in each respective stage of stages II and III.  $[+ II + III (i.e. P < 5.21 \times 10^{-6})$  was highlighted in bold font. <sup>b</sup>Data v

nucleotide (Fig. 6), which could be under high selective pressures during evolution, and therefore is likely functional.

## Predicted miRNAs that potentially bind to FGFRL1 rs4647940

Based on predictions of four in silico tools (i.e. MicroSNiPer, MirSNP, RegRNA 2.0 and TargetScan), 13 miRNAs could target FGFRL1 rs4647940 (Table 3).

## Differential expressions of mouse miRNA orthologs in bone during skeletal development

Based on miRNA-seq study of a mouse model for age-related osteoporosis (43), i.e. mmu-miR-140-5p, mmu-miR-143-5p, mmumiR-34c-5p, mmu-miR-106b-3p, mmu-miR-30c-2-3p, mmu-miR-92a-2-5p and mmu-miR-17-3p, were differentially expressed between 25-m versus 2-m, 8-m versus 2-m and 25-m versus 8-m time points in bone (Table 4), with their corresponding human orthologs highlighted in Table 3. Two of them, i.e. mmu-miR-34c-5p and mmu-miR-140-5p, not only were significantly differentially expressed across all three comparisons, but also had same directions of fold changes (FCs) (i.e. consistently down-regulated from 2 to 8 and to 25 months). Most prominently, mmu-miR-140-5p had greatest FCs (5.88-, 4- and 1.47-folds of down-regulation) among these seven miRNAs, which attained highest statistical significance levels for 25-m versus 2-m (P =  $9.15 \times 10^{-91}$ ) and 8-m versus 2-m ( $P = 9.63 \times 10^{-82}$ ) comparisons. Because hsa-miR-140-5p is highly conserved during evolution across a wide spectrum of species (Supplementary Material, Fig. S2), such that both mmumiR-140-5p and dre-miR-140-5p have same sequences as hsamiR-140-5p, only hsa-miR-140-5p was chosen for experimental validation.

#### In vitro dual-luciferase reporter assay results

Human FGFRL1 gene, which resides in chromosome 4p16.3, consists of six exons. Exon 1 contains 5' UTR followed by a coding sequence for signal peptide (SP). Exons 2, 4 and 5 encode immunoglobulin (Ig)-like C2-type 1, Ig-like C2-type 2 and Ig-like C2-type 3 domains, respectively. Exon 6 encodes transmembrane (TM) domain, cytoplasmic tail and 3' UTR. Exon-intron structure of FGFRL1 is highly conserved based on previous phylogenetic analysis (44), and rs4647940 is located in the 3' UTR, which is a part of exon 6 (Fig. 7). FGFRL1 rs4647940 WT allele (i.e. 'C') is complementary with the third position (underlined) of hsa-miR-140-5p 5' seed region (i.e. 5'-CAGUGG-3'), whereas MUT allele (i.e. 'G') causes a mismatch. In dual-luciferase reporter assay, a negative control (NC) miRNA mimic was co-transfected with an empty vector, or a vector carrying FGFRL1 3' UTR WT insert, or a vector carrying FGFRL1 3' UTR MUT insert. In human embryonic kidney (HEK) 293 cells, for NC miRNA co-transfection, compared with an empty vector as baseline, a vector carrying either FGFRL1 3' UTR WT insert  $(-12.15 \pm 4.83\%, P = 0.031)$  or FGFRL1 3' UTR MUT insert  $(-18.33 \pm 5.66\%, P = 8.88 \times 10^{-3})$  demonstrated significant inhibitions of respective relative luciferase activities, but no statistically significant difference was observed between 3' UTR WT and MUT inserts (P = 0.20) (Fig. 8). For hsa-miR-140-5p co-transfection, compared with an empty vector, a vector carrying either FGFRL1 3' UTR WT insert (-45.07  $\pm$  3.90%, P = 4.19  $\times$  10<sup>-7</sup>) or FGFRL1 3' UTR MUT insert (-48.20  $\pm$  5.95%, P = 1.06  $\times$  10<sup>-5</sup>) exhibited significant inhibitions of relative luciferase activities. No statistically significant difference was detected between 3' UTR WT and MUT inserts (P = 0.58). Nonetheless, relative luciferase activities differed significantly



#### Forest Plot of FGFRL1 rs4647940 for FN-BMD

Figure 2. A forest plot of FGFRL1 rs4647940 for FN-BMD trait for stage I + II + III for gender-combined (i.e. male and female) cohorts. BMD, bone mineral density; FN, femoral neck.



Figure 3. Regional association plots for chromosome 4p16.3 loci FGFRL1 rs4647940, IDUA rs6827815 and IDUA rs3755955 for FN-BMD trait (based on hg19/1000 Genomes Mar 2012 EUR). (A) The region encompassing rs4647940 with ±100-kb flanking regions, and (B) a zoom-in view of the center region, [i.e. the dashed rectangle in (A)], encompassing rs4647940 with ±27-kb regions. BMD, bone mineral density; EUR, European; FN, femoral neck.

between NC miRNA and hsa-miR-140-5p for both 3' UTR WT insert ( $P = 1.33 \times 10^{-5}$ ) and 3' UTR MUT insert (P = 0.0051), indicating that the FGFRL1 3' UTR insert bearing rs4647940 is a potential target site for hsa-miR-140-5p.

#### In vivo zebrafish microinjection experiment results

Three independent miRNA microinjection experiments were performed, with similar morphological phenotype results obtained. Data from a representative experiment of them were shown in Figure 9. N = 11, 14 and 14 zebrafish embryos were,

respectively, included in non-injection control (left panel), NC miRNA-injected (middle panel), and dre-miR-140-5p-injected (right panel) groups. Morphological phenotypes were obtained at two time points—5 days post-fertilization (dpf) and 7 dpf, respectively. Figure 9A–F compared zebrafish skeletal morphologies across non-injection control, NC miRNA-injected and dre-miR-140-5p-injected groups at 5 dpf, whereas Figure 9G–O compared skeletal morphologies across them at 7 dpf, respectively. At 5 dpf, the body length of dre-miR-140-5p-injected larva appeared shorter (in example shown, 22.61%) compared with either non-injection control, or NC miRNA-injected larva, which had



Figure 4. The physical locations and linkage disequilibrium pairwise  $r^2$  plot generated by Haploview (41,42) for the 80.744-kb human FGFRL1 region (total 58 SNPs) encompassing FGFRL1 rs4647940 (current study), rs6827815 [Zhang *et al.* (34)] and rs3755955 [Estrada *et al.* (40)] for (A) OOS and (B) KCOS, respectively. Haplotype blocks 1 and 2 are shown by dashed lines. OOS, Omaha Osteoporosis Study; KCOS, Kansas-City Osteoporosis Study; SNP, single-nucleotide polymorphism.



Figure 5. Predicted secondary structure of FGFRL1 3' UTR 121-bp mRNA sequence carrying either (A) rs4647940-C allele or (B) rs4647940-G allele by RNAfold. MFE, minimum free energy.



Figure 6. Cross-species comparison of DNA sequences of FGFRL1 3' UTR encompassing rs4647940 in human (GenBank accession number NM\_001004356.2), chimpanzee (GenBank accession number AC194569.3), gibbon (GenBank accession number NW\_003501383.2), gorilla (GenBank accession number NW\_004002168.1), orangutan (GenBank accession number NW\_002878038.1) and rhesus macaque (GenBank accession number NW\_001111081.1). A 15-bp consensus motif surrounding FGFRL1 rs4647940 is represented by a WebLogo. The box (a 6-bp sequence) denotes a 5' seed region binding site for hsa-miR-140-5p, which includes FGFRL1 rs4647940 (i.e. at fourth position). Multiple DNA sequence alignment was performed by ClustalX version 1.81. The asterisks denote nucleotides conserved across all the species that were compared.

same lengths (Fig. 9A–C). A similar pattern of body length comparisons was observed at 7 dpf (Fig. 9G–I). Further, compared with non-injection control and NC miRNA-injected larvae at 5 dpf (Fig. 9D and J) and 7 dpf (Fig. 9E and K), dre-miR-140-5p-injected larvae at 5 dpf (Fig. 9F) and 7 dpf (Fig. 9L) showed somewhat reduced Meckel's cartilage (denoted by 'm') and almost absent

miR-Name	# Programs	MicroSNiPer	MirSNP Score	RegRNA2.0 Score	TargetScan Context Score Percentile
hsa-miR-17-3p	1	Seed length: 7 (Yes)	— (No)	<150 (No)	— (No)
hsa-miR-30c-2-3p	1	Seed length: 7 (Yes)	— (No)	<150 (No)	— (No)
hsa-miR-34c-5p	1	Seed length: 6 (Yes)	— (No)	<150 (No)	— (No)
hsa-miR-92a-2-5p	1	Seed length: 8 (Yes)	— (No)	<150 (No)	— (No)
hsa-miR-106b-3p	1	Seed length: 6 (Yes)	— (No)	<150 (No)	— (No)
hsa-miR-140-5p	1	Seed length: 6 (Yes)	— (No)	<150 (No)	— (No)
hsa-miR-143-5p	1	Seed length: 6 (Yes)	— (No)	<150 (No)	— (No)
hsa-miR-4667-5p	2	Seed length: 8 (Yes)	144.00 (Yes)	<150 (No)	— (No)
hsa-miR-4700-5p	2	Seed length: 11 (Yes)	161.00 (Yes)	<150 (No)	— (No)
hsa-miR-4723-5p	2	Seed length: — (No)	144.00 (Yes)	<150 (No)	77 (Yes)
hsa-miR-5698	2	Seed length: — (No)	162.00 (Yes)	≥150 (Yes)	— (No)
hsa-miR-3175	3	Seed length: — (No)	159.00 (Yes)	≥150 (Yes)	86 (Yes)
hsa-miR-491-5p	4	Seed length: 8 (Yes)	148.00 (Yes)	≥150 (Yes)	76 (Yes)

Table 3. Putative human miRNAs that bind to FGFRL1 Poly-miRTS rs4647940

GWA, genome-wide association; poly-miRTS, polymorphism in microRNA target sites; '# Programs', total number of programs that gave the prediction, denoted by 'Yes' in parentheses (otherwise, 'No' is shown in parentheses); '—', not available. Seven human miRNAs that correspond to mouse miRNAs significantly differentially expressed in bone between different time points [He *et al.* (43)] were in *italic font*, which includes hsa-miR-140-5p (in bold font). The miRNAs were first sorted by the '# Programs' (lowest to highest), and then sorted by miR number (smallest to largest).

Table 4. Mouse miRNAs that show	differential expressions i	n bone among three time p	oints determined by miRNA-Seq

miR-Name	25-m versi	us. 2-m	8-m versus. 2-m		25-m vers	us. 8-m
	FC	P-value	FC	P-value	FC	P-value
mmu-miR-140-5p	0.17	9.15 × 10 <sup>-91</sup>	0.25	9.63 × 10 <sup>-82</sup>	0.68	$1.79 \times 10^{-3}$
mmu-miR-143-5p	0.45	$1.91 \times 10^{-27}$	0.34	$1.22 \times 10^{-51}$	1.34	$1.90 \times 10^{-3}$
mmu-miR-34c-5p	0.47	$7.33 \times 10^{-24}$	0.72	8.95 × 10 <sup>-8</sup>	0.66	$1.85 \times 10^{-7}$
mmu-miR-106b-3p	1.34	$1.10 \times 10^{-4}$	1.00	0.96	1.33	$1.43 \times 10^{-4}$
mmu-miR-30c-2-3p	0.91	0.048	0.88	$2.80 \times 10^{-3}$	1.04	0.44
mmu-miR-92a-2-5p	0.66	0.1134	1.45	0.061	0.45	$1.11 \times 10^{-3}$
mmu-miR-17-3p	0.91	0.17	1.90	$2.90 \times 10^{-32}$	0.47	$1.20 \times 10^{-33}$

2-m, 2-month; 8-m, 8-month; 25-m, 25-month; FC, fold change. Data were obtained from He *et al.* (43). Three mouse miRNAs with significant differences (i.e. P < 0.05/3 = 0.0167) of their expressions across three time points (i.e. 2-m, 8-m and 25-m) were shown in *italic font*, which includes -miR-140-5p (in **bold font**). The miRNAs were sorted by their levels of statistical significance for 25-m versus. 2-m comparison (highest to lowest).

ceratobranchial cartilages (denoted by 'cb1-5'). Significant skeletal morphological differences were detected between noninjection control/NC miRNA-injected and dre-miR-140-5p-injected larvae at 7 dpf (Fig. 9M-O). Florescent images demonstrated that notochord (denoted by 'nc') and parasphenoid (denoted by 'ps') were present in non-injection control and NC miRNA-injected groups (Fig. 9M and N), but were absent in dre-miR-140-5p-injected group (Fig. 90). Overall, skeletal malformations were observed in 0/14 (0.00%), 2/14 (14.29%) and 5/11 (45.45%) for non-injection control, NC miRNA-injected, and dre-miR-140-5p-injected groups, respectively. Although the percentage of dre-miR-140-5p-injected group (45.45%) was not statistically different from that of NC miRNA-injected group (14.29%) [P-value (two-sided) = 0.18], the percentage of noninjection group (0.00%) was significantly different from that of dre-miR-140-5p-injected group (45.45%) with a P-value (two-sided) = 0.0087. Further, non-injection control + NC miRNA-injected groups compared with dre-miR-140-5p-injected group gives a significant P-value (two-sided) = 0.012.

## Discussion

A traditional GWA meta-analysis approach has been widely applied for discovering novel genetic loci for common human

diseases. To date, such an approach has identified a large number of genetic loci underlying disease susceptibilities (45-47). However, in traditional GWA studies, the significantly associated variants are seldom those that play functional roles in phenotypic determination, but are instead in high LD with a causal variant. Consequently, the identification of causal variants is important in understanding molecular mechanisms underlying disease pathogenesis, such that additional well-focused intensive studies (e.g. fine mapping) are required to complement traditional GWA studies to identify disease-causing alleles. Because a functional candidate genomic region association approach focusing exclusively on SNPs with higher prior probabilities for biological functions may increase the type I error rate (i.e.  $\alpha$ ), the best strategy to differentiate true positives from false positives is to perform replication studies in independent samples. Therefore, focusing exclusively on those poly-miRTSs, a multi-stage approach, which typically includes a GWA discovery stage followed by in silico and de novo genotyping replication stages, is a conservative strategy to identify novel functional SNPs located in noncoding 3' UTRs potentially undetected by previous traditional GWA meta-analysis studies due to an overly strict statistical significance threshold. Such a 'hybrid' approach combines strengths of both a multi-stage GWA meta-analysis approach and a hypothesisdriven approach. Johnson et al. (29) employed a similar multi-stage



Figure 7. FGFRL1 gene structure, rs4647940 physical location and the potential binding of FGFRL1 mRNA with hsa-miR-140-5p. aa, amino acid; bp, base pair; Acc #, accession number; Ig, immunoglobulin; SP, signal peptide; TM, transmembrane; UTR, untranslated region; WT, wild-type; MUT, mutant. '|' denotes perfect match; '.' denotes G:U wobble.



Figure 8. Dual-luciferase report assay results for FGFRL1 rs4647940. The relative luciferase activities for six different conditions (three reporter constructs: Empty/WT/MUT vectors, two miRNA types: NC miRNA/hsa-miR-140-5p miRNA). On the y-axis, relative luciferase activity (in percentage) was computed as the ratio of firefly luciferase activity to Renilla luciferase activity is given. On the x-axis, different transfection groups are shown. Data are presented as mean ± SEM from six independent replicates. miRNA, microRNA; MUT, mutant; NC, negative control; NS, not significant; SEM, standard error of the mean.

strategy of the current study for blood pressure and hypertension traits focusing exclusively on 6683 SNPs located within 60-kb of each of 30 candidate gene regions encoding known antihypertensive drug targets in stage I. Two novel SNPs, i.e. ADRB1 rs1801253 [for systolic blood pressure (SBP) and diastolic blood pressure (DBP)], and AGT rs2004776 (for DBP) were identified



Figure 9. Craniofacial and overall morphological phenotypes of zebrafish larvae in microRNA microinjection experiments. (A-O) Left, middle and right panels depict images corresponding to non-injection control, NC miRNA-injected and dre-miR-140-5p-injected groups at 5 dpf and 7 dpf larval stages, respectively. (A-E) 5 dpf stage of zebrafish larvae after microinjection with respective miRNAs were stained with Alcian blue 8 GX to observe overall morphological phenotypes (A-C) or craniofacial cartilage structures (D-E). (G-O) 7 dpf stage of zebrafish larvae after microinjection with respective miRNAs were stained with Alcian blue 8 GX to observe overall morphological phenotypes (A-C) or craniofacial cartilage structures (D-E). (G-O) 7 dpf stage of zebrafish larvae after microinjection with respective miRNAs were stained with both Alcian blue 8 GX (G-L) and Alizarin red S (M-O) to observe overall morphological phenotypes (G-I) or craniofacial cartilage structures (I-L) or mineralized bone (MO). The RNA sequence of dre-miR-140-5p is exactly the same as that of hsa-miR-140-5p, indicating cross-species conservation (Supplementary Material, Fig. S1). Three independent experiments comparing non-injection control, NC miRNA-injected and dre-miR-140-5p-injected groups were performed, and consistent morphological phenotypes were obtained for each of these three groups across these experiments. Images presented are from one representative experiment. NC, negative control; dpf, days post-fertilization.

and replicated, which were missed by their previous traditional GWA scan (i.e. CHARGE Consortium) (48). Another study by Xu *et al.* (49) also applied a functional candidate gene association approach for coronary artery disease (CAD) that revealed two novel regulatory SNPs (rs7842 and rs4400266) located, respectively, in C3AR1 and C6 genes to be associated with CAD, which were missed by previous traditional GWA scans.

By interrogating exclusively 41102 poly-miRTSs collected from Poly-miRTS database (50,51), the probability of detecting functional poly-miRTSs causally linked with BMD traits has significantly increased. A total of 11 stage I-selected poly-miRTSs (corresponding to 10 chromosomal loci) were selected based on (i) statistical significance threshold, (ii) allelic association direction and (iii) biological significance. In stage II in silico replication, FGFRL1 rs4647940 (P =  $5.078 \times 10^{-3}$ ) met a relatively stringent statistical significance threshold (i.e.  $P < 9.09 \times 10^{-3}$ ) for FN-BMD in gender-combined sample. Because FGFRL1 rs4647940 is top signal among these stage I-selected 11 poly-miRTSs for FN-BMD in gender-combined sample, in order to avoid missing potentially functional poly-miRTSs for FN-BMD trait, among these 11 stage I-selected poly-miRTSs, we also included stage I's second top signal for FN-BMD in gender-combined sample, i.e. PRR5 polymiRTS rs3213550 (P-value:  $1.58 \times 10^{-5}$ ), which is a disease-associated miRTSdSNP, although this SNP did not reach stage II significance threshold. In stage III, based on Bonferroni-corrected statistical significance threshold (P < 0.05/2 = 0.025) for FN-BMD trait in gender-combined sample, only FGFRL1 rs4647940 attained statistical significance (Fig. 1). In Zhang et al. (34), 33 stage 1selected SNPs, [i.e. 10 SNPs reaching GWS (i.e.  $\alpha = 5.00 \times 10^{-8}$ ) and 23 SNPs reaching borderline significance (i.e.  $\alpha = 1.00 \times 10^{-6}$ )] corresponding to 33 chromosomal loci were selected and subjected to stage 2 in silico analysis. None of the current study's 11 stage I-selected poly-miRTSs overlap with these 33 stage 1selected SNPs of previous traditional study. Four chromosomal loci {i.e. 2q33 (PTH2R), 4p16.3 [intergenic (currently IDUA)], 6q25.1 (C6orf67-ESR1) and 20q13.33 (OSBPL2)} were shared in common, but were represented by totally different SNPs. Of these 33 stage 1-selected chromosomal loci, 13 previously reported and 2 novel loci reached conventional GWS (34). Of them, only chromosome 4p16.3 [intergenic (currently IDUA)] was commonly shared with the current study, but was represented by a totally different gene, i.e. FGFRL1. Estrada et al. (40) performed a traditional multi-stage GWA scan that studied ~2.5 million autosomal + chromosome × SNPs in 17 cohorts (N = 32 961) in stage 1 (GWA discovery). Based on SNP selection criteria: (i)  $P < 5 \times 10^{-6}$  (both unconditional and conditional analysis) for autosomal SNPs and (ii)  $P < 5 \times 10^{-5}$  for chromosome × SNPs, 96 SNPs (87 autosomal SNPs and 9 chromosome × SNPs) corresponding to 83 chromosomal loci were subject to stage 2 de novo + in silico replication in 34 cohorts (N = 50 933). None of the current study's 11 stage I-selected poly-miRTSs overlap with these 96 stage 1-selected SNPs of Estrada et al. (40), but three chromosomal loci [4p16.3 (IDUA), 6q25.1 (C6orf67-ESR1) and 11q13.1 (SCYL1)] were shared in common, which were represented by totally different SNPs, and at 4p16.3

and 11q13.1, were represented by totally different genes. At stage 2 of Estrada et al. (40), 64 [54 chromosomal loci containing 56 gene loci (40)] of these 96 stage 1-selected SNPs attained conventional GWS (i.e.  $P < 5 \times 10^{-8}$ , stages 1 + 2-only), 16 (14 chromosomal loci) of which were further replicated in stage 3 for association with fractures ( $P < 5 \times 10^{-4}$ , stage 3-only) in 50 fracture cohorts (N = 133460). Of these 54 BMD-associated chromosomal loci that attained conventional GWS, only 4p16.3 (IDUA) was commonly shared with the current study, but was represented by a totally different gene, i.e. FGFRL1. None of those 16 BMD- and fracture-associated loci were shared with the current study. Taken together, FGFRL1 rs4647940 is a novel poly-miRTS for FN-BMD that has been discovered in stage I and subsequently replicated in stages II and III of the current study, respectively. If not focusing exclusively on polymiRTSs in stage I, this FGFRL1 rs4647940 ( $P = 7.67 \times 10^{-6}$  for FN-BMD at stage I) would not have been discovered at all-e.g. this potentially functional SNP did not reach stage 1's borderline significance threshold  $\alpha = 1.0 \times 10^{-6}$  in Zhang et al. (34), and therefore did not survive to be further validated in stages 2 and 3. Therefore, by using a more relaxed statistical significance threshold (i.e.  $5 \times 10^{-5}$ , because only 41 102 poly-miRTSs were examined), this SNP was detected in stage I of the current study, and upon replications in subsequent stages II and III, reached GWS ( $P = 8.87 \times 10^{-12}$ ) in stage I+II+III (N=24662). A meta-analysis of rs4647940 conditional on rs3755955 remained suggestively significant  $(P = 1.35 \times 10^{-3})$  for FN-BMD in stage I gender-combined sample at  $\alpha = 5.00 \times 10^{-3}$ , whereas a meta-analysis of rs4647940 conditional on both rs3755955 and rs6827815 was also significant  $(P = 1.33 \times 10^{-3})$  for FN-BMD in stage 1 gender-combined sample.

For FGFRL1 rs4647940, based on predictions by four in silico programs, 13 human miRNAs could potentially bind to this poly-miRTS site (Table 3). Of them, according to miRNA-seq data (43), mouse orthologs of hsa-miR-17-3p, mmu-miR-30c-2-3p, hsa-miR-34c-5p, hsa-miR-92a-2-5p, hsa-miR-106b-3p, hsamiR-140-5p and hsa-miR-143-5p appear to be differentially expressed at different time points during development in a mouse model of age-related osteoporosis (Table 4). Of them, mmumiR-140-5p (a mouse ortholog of hsa-miR-140-5p) appeared to exhibit greatest magnitudes of differential expressions among comparisons of three time points (i.e. 2-m, 8-m and 25-m), and highest levels of statistical significance for 25-m versus 2-m and 8-m versus 2-m comparisons (Table 4). To experimentally test the potential biological role of FGFRL1 poly-miRTS rs4647940, both in vitro and in vivo functional studies were conducted. First, luciferase activity assay results showed that, when co-transfected with hsa-miR-140-5p, reporter construct containing either FGFRL1 3' UTR WT insert or FGFRL1 3' UTR MUT insert repressed luciferase activity to similar extents (Fig. 8). These experimental findings are concordant with a regulatory role of hsa-miR-140-5p in modulating FGFRL1 expression by binding to this 3' UTR segment harboring rs4647940, causing a pronounced inhibition of luciferase activity. As indicated in both Figure 7 and Supplementary Material, Figure S2, hsa-miR-140-5p contains a 6-mer 5' seed region (predicted by MicroSNiPer) that is complementary to FGFRL1 rs4647940 SNP site. Because miRNAs with 6-mer seed regions typically modestly down-regulate their respective mRNA targets (52), these luciferase activity assay results are in agreement with the notion that FGFRL1 poly-miRTS rs4647940 is located in 5' seed region binding site of hsa-miR-140-5p. Because an miRNA's 5' seed sequence plays an important role in target recognition and binding, a 3' UTR polymorphism located in an miRNA's 5' seed region binding site, e.g. FGFRL1 rs4647940, may have a higher probability of functional importance, compared with a 3' UTR polymorphism located in that miRNA's 3' mismatch tolerant region (MTR) binding site.(53) We

further tested whether hsa-miR-140-5p plays a significant role in skeletal formation in vivo. Nakamura *et al.* (54) demonstrated that  $Mir140^{-/-}$  mice had shortened endochondral bones. In another  $Mir140^{-/-}$  mouse model, a mild skeletal phenotype was observed postnatally, with reduced stature and lower body weight, as well as craniofacial deformities characterized by shorter snout and domed skull (55). In a previous zebrafish model, Mir140 is found expressed in cartilage of pharyngeal arches and in head skeleton (56). Further, Eberhart *et al.* (57) observed that dre-miR-140-5p-injected zebrafish exhibited craniofacial skeletal defects. The current study's *in vivo* zebrafish miRNA microinjection experiments gave rise to similar results, demonstrating that dre-miR-140-5p-injected group had a significantly higher percentage of abnormal craniofacial skeletal formation compared with non-injected control + NC miRNA-injected groups.

Fibroblast growth factor (FGF) signaling pathway is pivotal in a variety of developmental processes, including cartilage formation (58) and bone growth (59). FGFRL1 is FGFR gene family's fifth member, and mutations of FGFR1-FGFR4 cause skeletal disorders (e.g. craniosynostosis syndromes and chondrodysplasias) (60). Interestingly, FGFRL1 orthologous genes in species ranging from cnidarians to bilaterians are linked with other FGF signaling pathway members within a physical distance <10 Mb (44). For instance, in sea urchin, Fgfrl1 is closely linked to Fgfr1. Human FGFRL1 is located in close proximity to FGFR3 (44). The fact that FGFRL1 is physically linked to other FGF signaling pathway genes throughout evolution is suggestive of FGFRL1's functional importance in this biological pathway, and likely, also in bone formation: (i) FGFRL1 is expressed in skeletal tissues shown by northern blotting and in situ hybridization (61); (ii) a depletion of zebrafish fqfrl1a and fqfrl1b results in a craniofacial phenotype (62); (iii) Fqfrl1<sup>-/-</sup> mice exhibited hypoplasia of all skeletal elements, including shortened axial and appendicular skeletons, malformed vertebrae, small pelvic girdle and small rib cage (63); and (iv) in humans, as in zebrafish and mice, FGFRL1 could be implicated in craniofacial formation during embryogenesis, such that FGFRL1 deletions or frameshift mutation result in craniofacial malformations (64-66).

The current study's in vitro and in vivo experimental validation results, combined with findings of previous functional studies of FGFRL1 and hsa-miR-140-5p as well as clinical genetic studies of FGFRL1 gene mutations, provided strong evidence that FGFRL1 and hsa-miR-140-5p, which are evolutionarily conserved, play significant biological roles during skeletogenesis. FGFRL1 rs4647940, attaining conventional GWS for FN-BMD in the current study, could change hsa-miR-140-5p's 5' seed region binding site located in FGFRL1's 3' UTR, which could then modulate FGFRL1's mRNA expression level that can affect bone formation.

Our study has several limitations. First, the luciferase activity assay's results demonstrated that FGFRL1 3' UTR WT and MUT inserts could both bind to hsa-miR-140-5p rather than NC miRNA, but MUT allele did not appear to significantly de-repress luciferase activity in comparison with WT allele. However, rs4647940 may only have a relatively moderate effect on FGFRL1 mRNAhsa-miR-140-5p binding, because 5' seed region of hsa-miR-140-5p is a 6-mer. Further, multiple factors could affect results of luciferase activity assay, such as insert length, cell line, and transfection conditions. Besides hsa-miR-140-5p, FGFRL1 rs4647940 could affect other bone metabolism-related miRNAs' binding sites, e.g. hsa-miR-17-3p and hsa-miR-92a-2-5p (Table 3) predicted by RNAfold. Secondly, in vivo experiment in a zebrafish model showed that dre-miR-140-5p microinjection results in a dramatic effect on bone development (Fig. 9), but whether such an effect was mediated by its binding with a target site located on 3' UTR

of either fgfrl1a or fgfrl1b in zebrafish remains to be elucidated. Nevertheless, results of mouse miRNA-seq (Table 4) and zebrafish microinjection (Fig. 9) experiments unequivocally demonstrated a critical role of miR-140-5p in bone growth. Given that FGFRL1 rs4647940 is possibly located in a 5' seed region binding site of miR-140-5p based on in vitro luciferase activity assay results (Fig. 7), FGFRL1 rs4647940 is likely a regulatory variant causally linked with BMD.

Taken together, through a combination of a three-stage, polymiRTS-centric GWA meta-analysis and functional experiments, FGFRL1 poly-miRTS rs4647940 is significantly associated with FN-BMD trait, attaining conventional GWS. Based on abundant data accumulated from *in vitro* and *in vivo* experimental and clinical genetics studies, FGFRL1 rs4647940 is likely to play an important role in modulating the expression of FGFRL1 during skeletogenesis, and further functional characterizations of this SNP in bone metabolism is deserved.

## **Materials and Methods**

A flow chart outlining steps of the current study is depicted in Figure 1. Detailed information on study participants, phenotype measurement and modeling, DNA genotyping, quality control (QC) and genotype imputation for the three-stage GWA metaanalysis is provided in Supplementary material, Materials and Methods.

#### Association analysis

In the current study, only at stage I (seven GWA cohorts), genderspecific (i.e. male- and female-specific) and gender-combined (i.e. male and female) analyses were performed. Nonetheless, only four stage I's GWA cohorts (i.e. OOS, KCOS, COS and FHS) contain males (Table 1), such that male-specific sample size was much smaller than female-specific sample size, giving rise to less statistical power. Therefore, same as in the traditional GWA scan (34), Q-Q plot was generated only for female-specific and gender-combined samples, respectively. At stages II and III, because there were two cohorts at each stage, only gender-combined analyses were performed. Association tests at each stage are elaborated as follows. In stage I, associations of 41 102 directly typed or imputed poly-miRTSs with LS-, HIP- and FN-BMD traits were tested under an additive genetic model for each GWA cohort. Specifically, for five population-based samples—OOS, KCOS, COS, WHI-AA and WHI-HIS, associations were examined by fitting a linear regression model by MACH2QTL (http://www.sph. umich.edu/csg/abecasis/MACH/download/), in which an allele dosage was used as a predictor of phenotype. For two familybased samples—FHS and IFS, a mixed linear model was applied that took into consideration the effect of genetic relatedness within each pedigree (67). In stage II, association analyses in RS sample were performed by MACH2QTL implemented by GRIMP (68). Imputation and association analyses in KoGES were performed by IMPUTE v2 (69) and PLINK (70). Detailed statistical methods for association analyses of HIP-, LS- and FN-BMD traits in AOGC sample were presented previously by Duncan et al. (71). Briefly, for HIP-BMD, association analysis for imputed SNPs was performed using an additive genetic model including four EIGEN-STRAT eigenvectors by MACH2DAT, accounting for uncertainties in imputed genotype data by weighting genotypes by their posterior probabilities. For LS- and FN-BMD, Z-transformed residual BMD scores (in g/cm<sup>2</sup>) were generated for the entire AOGC cohort after adjusting for age, age<sup>2</sup>, weight and center of BMD measurement. An association test developed by Kung et al. (72) was applied to account for selections of extreme samples. In stage III, association tests were carried out using PLINK (70) for each study.

#### Meta-analysis

As described by Zhang *et al.* (34), a P-value based meta-analysis was used in METAL (http://www.sph.umich.edu/csg/abecasis/ metal/) (73), weighted by square root of sample size. *Cochran*'s Q statistic and I<sup>2</sup> were computed as measures of between-study heterogeneity. Random-effect meta-analyses were performed for those poly-miRTSs with Q statistic P < 0.05 or I<sup>2</sup> value > 50% by applying the 'rmeta' package (http://cran.r-project.org/web/ packages/rmeta/index.html). In stage 1, meta-analysis of a given SNP conditional on one or two other SNPs in LD was also performed by GCTA version 1.20 (http://www.complextraitgeno mics.com/software/gcta/massoc.html) (74).

#### Regional association plot and LD $r^2$ plot

Regional association plots were generated by applying Locus-Zoom (http://csg.sph.umich.edu/locuszoom/) (75). LD  $r^2$  Plots were generated by Haploview (41,42) for 58 SNPs at chromosome 4p16.3 for OOS and KCOS cohorts, respectively.

#### Poly-miRTSs in miRNA target sites

The poly-miRTS-centric GWA meta-analysis focuses exclusively on 41 102 poly-miRTSs in stage I, in contrast to 5 842 825 SNPs in stage 1 of previous traditional GWA scan (34). Detailed information on poly-miRTS selection is presented in Supplementary Material, Text S1.

#### Computational predictions of RNA secondary structures

The miRNA–mRNA hybridization is a two-step process such that an miRNA first binds to a short accessible region of its target mRNA, and then, the target mRNA's secondary structure unfolds as the miRNA completes its binding to target site (76). The secondary structure of an mRNA can influence its accessibility to miRNA (77). In order to assess potential impacts of WT and MUT alleles on the secondary structure of the 3' UTR of FGFRL1, a 121-bp FGFRL1 3' UTR segment carrying either WT or MUT allele of rs4647940 were predicted by RNAfold from the Vienna RNA package (http://rna.tbi.univie.ac.at/cgi-bin/RNAfold.cgi) (78,79) based on MFE algorithm with default parameters.

#### Multiple sequence alignment and sequence logo

Polymorphisms located at evolutionarily conserved nucleotides are likely to be of greater functional significance than those located at evolutionarily divergent nucleotides. To further bioinformatically assess functional significance for FGFRL1 rs4647940, cross-species comparisons of orthologous sequences of FGFRL1 3' UTR segment encompassing rs4647940 from six species, i.e. human, chimpanzee, gorilla, gibbon, orangutan and rhesus macaque, was performed by ClustalX version 1.81 (80) with default parameters. A Sequence Logo corresponding to a middle 15-bp DNA segment was generated using WebLogo online program (81).

#### In silico predictions of miRNAs that bind to a poly-miRTS

Human miRNAs that could bind to FGFRL1 rs4647940 were predicted by four online tools: (i) MicroSNiPer (http://cbdb.nimh.nih .gov/microsniper) (82), (ii) MirSNP (http://cmbi.bjmu.edu.cn/ mirsnp) (83), (iii) RegRNA 2.0 (http://regrna2.mbc.nctu.edu.tw/) (84,85) and (iv) TargetScan (http://www.targetscan.org/) 6.2 (11,16,86).

#### In vitro dual-luciferase reporter assays

To assess whether FGFRL1 3' UTR segment containing either WT or MUT allele of rs4647940 could bind to hsa-miR-140-5p in vitro, a pmirGLO dual-luciferase miRNA target expression vector harboring FGFRL1 3' UTR WT or MUT inset was constructed, which was subsequently transfected into HEK 293 cells. Details about cloning and transfection, as well as luciferase activity assays are presented in Supplementary Material, Text S1.

#### In vivo zebrafish microinjection experiments

To assess an *in vivo* role of hsa-miR-140-5p in bone formation, zebrafish microinjection experiments were performed, with each experiment consisting of three groups: (i) a non-injection control group, (ii) an NC miRNA microinjection group and (iii) a dre-miR-140-5p microinjection group, respectively. Detailed experimental procedures were described in Supplementary Material, Text S1. These procedures were repeated three times, and microscope image data of morphological phenotypes from a representative experiment at 5 dpf and 7 dpf were obtained from each respective group.

#### Supplementary Material

Supplementary Material is available at HMG online.

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