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# Genome and epigenome analysis of monozygotic twins discordant for congenital heart disease

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## Abstract

**Background:** Congenital heart disease (CHD) is the leading non-infectious cause of death in infants. Monozygotic (MZ) twins share nearly all of their genetic variants before and after birth. Nevertheless, MZ twins are sometimes discordant for common complex diseases. The goal of this study is to identify genomic and epigenomic differences between a pair of twins discordant for a form of congenital heart disease, double outlet right ventricle (DORV).

**Results:** A monoamniotic monozygotic (MZ) twin pair discordant for DORV were subjected to genome-wide sequencing and methylation analysis. We identified few genomic differences but 1566 differentially methylated regions (DMRs) between the MZ twins. Twenty percent (312/1566) of the DMRs are located within 2 kb upstream of transcription start sites (TSS), containing 121 binding sites of transcription factors. Particularly, *ZIC3* and *NR2F2* are found to have hypermethylated promoters in both the diseased twin and additional patients suffering from DORV.

**Conclusions:** The results showed a high correlation between hypermethylated promoters at *ZIC3* and *NR2F2* and down-regulated gene expression levels of these two genes in patients with DORV compared to normal controls, providing new insight into the potential mechanism of this rare form of CHD.

**Keywords:** CHD, MZ twins, *ZIC3*, *NR2F2*, DNA methylation, RRBS, WGS

## Background

Congenital heart disease (CHD) is the leading non-infectious cause of death in infants. In Asia, CHD occurs in 9.3 per 1000 live births [1]. Double outlet right ventricle (DORV), defined when both great arteries originate from the morphological right ventricle in a heart, is a rare form of congenital heart disease, accounting for 1–3% of all CHD cases [2–4]. Multiple factors have been identified in contributing to the disease, of which both genetic and epigenetic changes and the interplay between them and the related environment play a key role in the pathogenesis [5, 6].

During the normal development of the heart, the outflow tract initially connects exclusively with the primitive right ventricle and must remodel to divide into a separate pulmonary artery and aorta; subsequently, there is continued remodeling to establish direct continuity from the left ventricle to the aorta [4]. In double outlet right ventricle, drainage of the left ventricle is commonly achieved through a ventricular septal defect (VSD) at different locations and with varying relations to the pulmonary and aortic outflow tract. An insufficient mitral valve and an atrial septal defect (ASD) can be found in DORV cases [3]. Since temporal and spatial expression of transcription factors (TFs) is a major determinant of cell lineage specification and patterning of the heart [7–10], mutations or expression dysregulation in them can impair cardiac development and lead to congenital heart malformations and dysfunction [7]. Changes of epigenetic modifications also affect the expression patterns of these TFs [11]. Environmental alterations or

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stresses including drugs may perturb the TFs-related transcriptional and epigenetic programs in the process of cardiac development and give rise to CHD [12–14].

Cytosine methylation, an epigenetic modification, is essential in mammalian development and particularly in cell-lineage specification [15, 16]. Although each individual's genome is fixed throughout life and across cell types, epigenetic modifications are plastic and influence the temporal and spatial pattern of gene expression [14]. Cell type-specific DNA methylation patterns emerge during development and play a role in gene expression by directing chromatin activation or interfering with the binding of TFs [17]. Emerging evidence suggests that DNA methylation is responsive to both physical and social environments during pregnancy and early life [14, 18].

Monozygotic (MZ) twins share nearly all of their genetic variants before and after birth. Nevertheless, MZ twins are often discordant for common complex diseases, such as type 1 diabetes (T1D; 61%), type 2 diabetes (41%) [19], autism (58 to 60%) [20, 21], schizophrenia (58%), and different types of cancer (up to 16%) [22, 23]. These observations support the model that for many complex traits, genotype alone may not fully determine phenotypic variation, and the interplay between genes and environment needs to be considered and epigenetics has been proposed to be one of the main mediators of this interaction [24–26]. Therefore, disease-discordant MZ twin pairs provide an ideal model for examining epigenetic functions in diseases due to their shared genetic and environmental factors during the pregnancy [24]. Analysis of discordant MZ twins has been successfully used to study epigenetic mechanisms in aging, cancer, autoimmune disease, and psychiatric, neurological and other traits [20, 21, 23]. However, comprehensive analysis of genome-wide DNA methylation in a MZ twin pair discordant for double outlet right ventricle (DORV) is lacking.

In this study, we dissected the contributions of DNA methylation pattern to the pathogenesis of DORV through DNA methylation profiling at single nucleotide level by utilizing the whole-blood-DNA derived from a MZ twin pair discordant for DORV. The two years and two months old Chinese girl, given a diagnosis of DORV at birth, has a healthy MZ twin sister. Their parents have no past or family history of heart diseases and are not consanguineous. Thus, we hypothesize that genome-wide analysis in this phenotype-discordant twins will provide insights into genetic and epigenetic factors affecting normal heart development.

## Results

### Genome sequence differences in MZ twins discordant for DORV

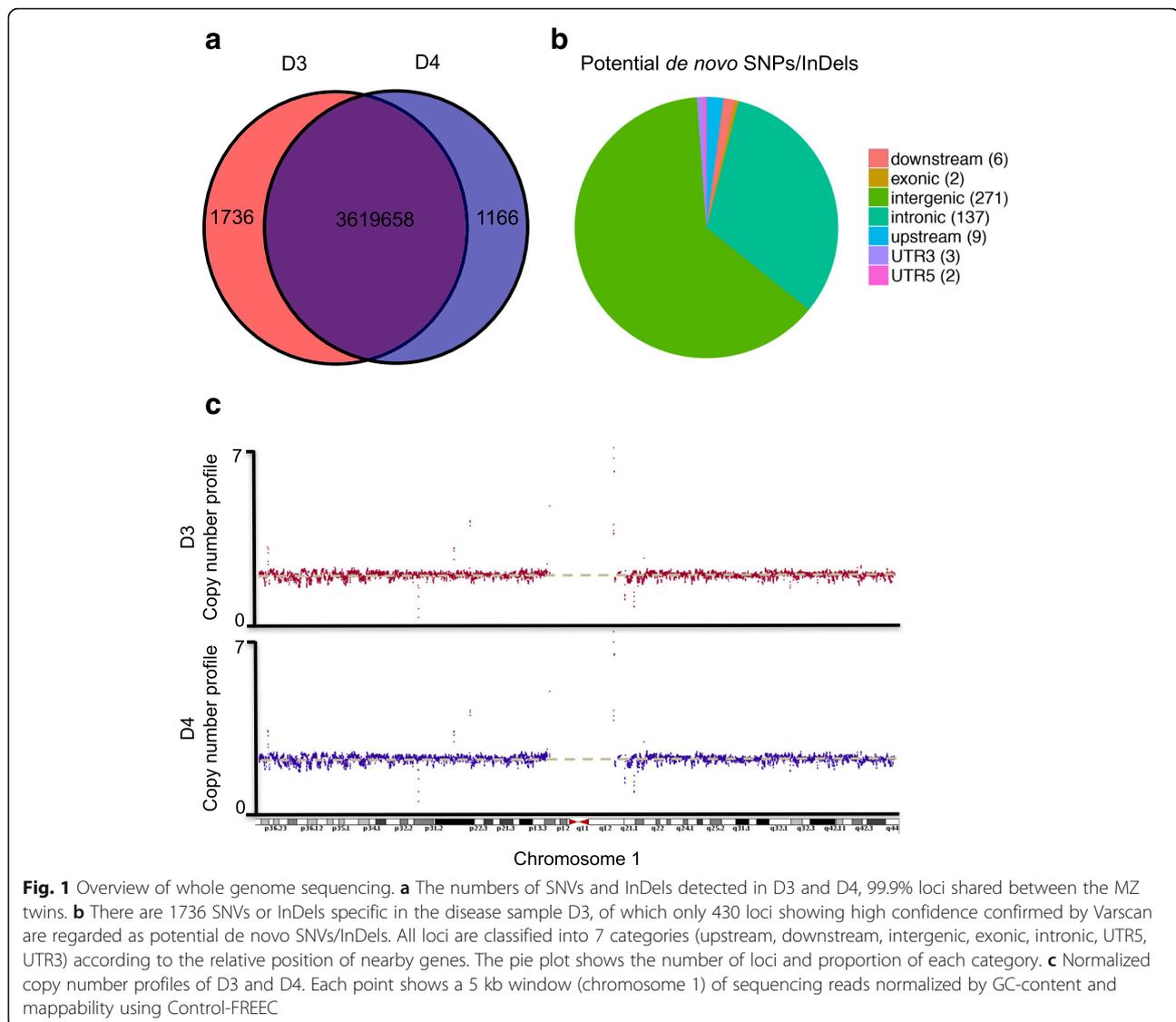
We first tried to identify de novo genomic sequence variation through whole genome sequencing. DNA

extracted from whole blood samples of the MZ twins discordant for DORV (septal-defect heart (D3) and normal heart (D4) was sequenced by Illumina HiSeq X-Ten (150 bp paired-end reads) and aligned to the hg19 reference human genome. The average sequencing depth of D3 and D4 were 31.9 and 28.5 respectively, and 4-fold coverage represented more than 91% of the hg19 human reference genome (Additional file 1: Table S1). Single-nucleotide variations (SNVs) and short insertions/deletions (InDels) were identified using SAMtools [27] and filtered by Varscan [28]. More than 99.9% SNVs shared between the MZ twins (Fig. 1a). Three hundred and sixteen SNVs and 114 InDels were identified specifically in D3. After filtering by the dbSNP (Version 138) database, forty-one SNVs and 71 InDels in D3 remained (Additional file 2: Table S2). There was one deletion located in non-coding RNA (ANKRD30BP2, pseudogene) and one synonymous SNV in the exon of DSPP gene, but none of the SNVs or InDels altered proteins (Fig. 1b & Additional file 2: Table S2). No pathogenic variation specific to D3 was detected when filtered by the Online Mendelian Inheritance in Man (OMIM) and Human Genetic Mutation Database (HGMD). Sequence variants in promoter of *GATA4* and *TBX1*, which were closely related to VSD [29, 30], were found in both of our samples, indicating that the sequences variants in the promoters of these two transcription factor may not contribute to the pathogenesis of DORV in D3 (Additional file 3: Table S3).

Copy number variants (CNVs) are deletions or amplifications of DNA segments that arise from inappropriate chromatid recombination or segregation during cell division. As CNVs alter the gene expression dosage of contiguous genes, they may result in syndromic CHDs [31]. Using Control-FREEC [32], we detected 15 focal CNVs; however, these CNVs did not pass CNVnator confirmation criteria [33], suggesting the absence of bona fide CNVs (Fig. 1c; Additional file 4: Figure S1 & Additional file 5: Table S4). Structural variation (SV), typically a large insertion/deletion, inversion or translocation affecting a sequence length from 1 kb to 3 Mb, was not detected to be different between the two samples using the CREST software (Additional file 6: Figure S2). Together, the genomic analyses suggest that the DORV in D3 is not likely caused by genome alterations.

### DNA methylation differences between the MZ twin pair

DNA methylation is involved in multiple processes, including regulation of gene expression, silencing of retrotransposons, genomic imprinting, X-chromosome inactivation and occurrence of various diseases [34, 35]. We next sought to compare genome-scale DNA methylation profiles between the MZ twins at nucleotide resolution. DNA samples were extracted from whole blood

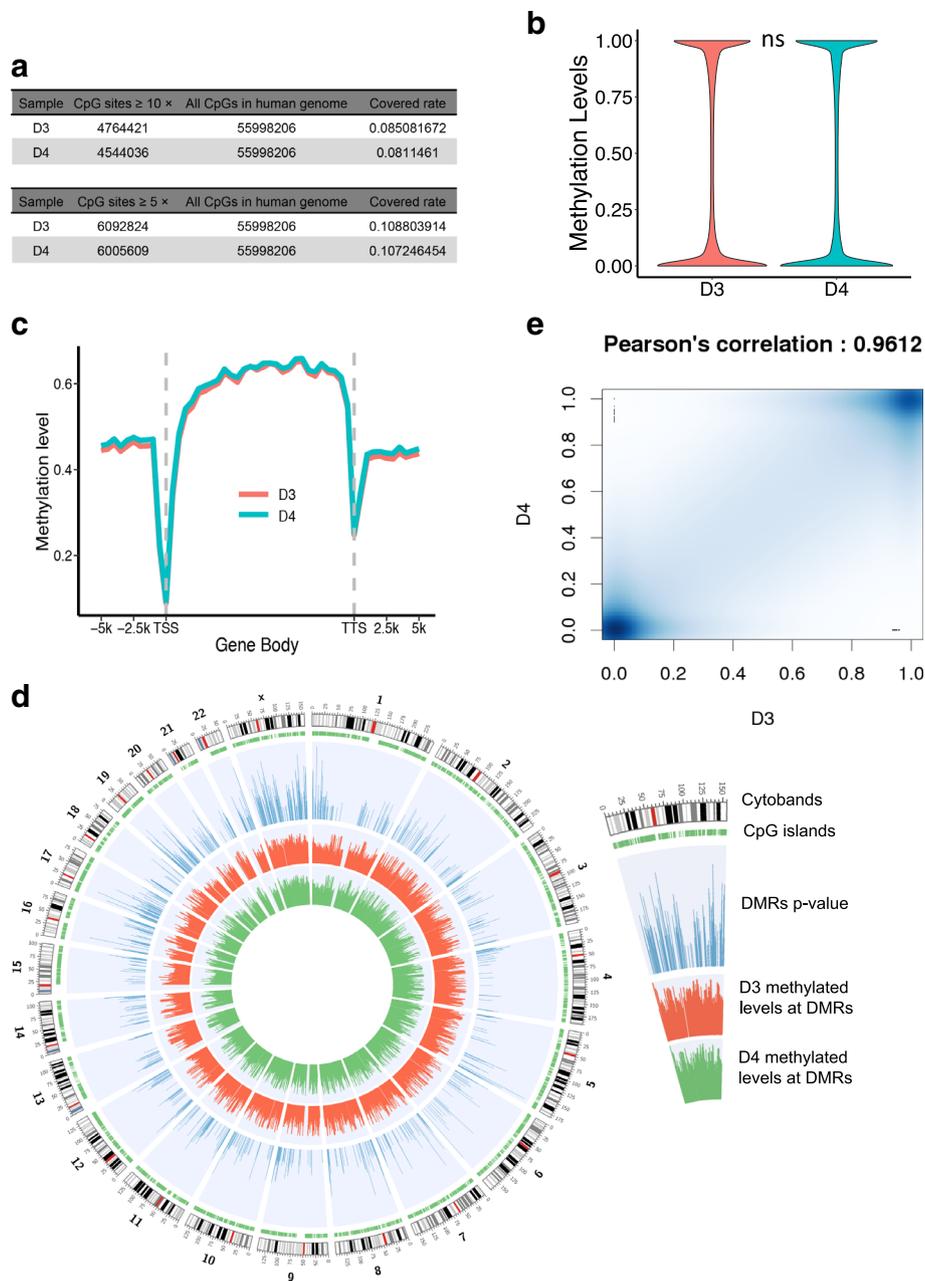


acquired before heart surgery, and gel-free reduced representation bisulfite sequencing (RRBS) libraries were constructed as previously reported [36] and then sequenced on Illumina HiSeq2000 platform (100 bp paired-end reads). After aligning the reads to the hg19 reference genome, we obtained 56 million and 48 million high-quality, 100-nucleotide, uniquely mapped reads from the D3 and D4 samples, respectively. The two samples had very similar sequencing-depth patterns of cytosine sites and covered more than 34 million C sites with sequencing depth at least 5 fold (Additional file 7: Table S5). More than 6 million high-quality CpG dinucleotides were supported by at least by 5 reads (depth  $\geq 5\times$ ), which covered 10% of all CpG sites (Fig. 2a). In addition, we checked the methylation status of samples from blood cell and heart tissue in ENCODE project (Accession ID: ENCF388NTJ, ENCF107RMQ). We

found a high correlation between B cell and heart with Pearson's correlation coefficient equal to 0.9238, and visualizing the genome-wide methylation between them in IGV showed similar patterns (Additional file 8: Figure S3), suggesting that the DNA methylation pattern in blood correlate with that in heart.

The methylation levels of CpG dinucleotides in both samples showed a bimodal distribution with most CpG sites being unmethylated or extensively methylated (Fig. 2b). As expected, genome-wide patterns of DNA methylation (CpG and non-CpG) were highly correlated between the MZ twin pair (Figs. 2c-e & Additional file 9: Figure S4), suggesting that DORV is not associated with a global reprogramming of methylation.

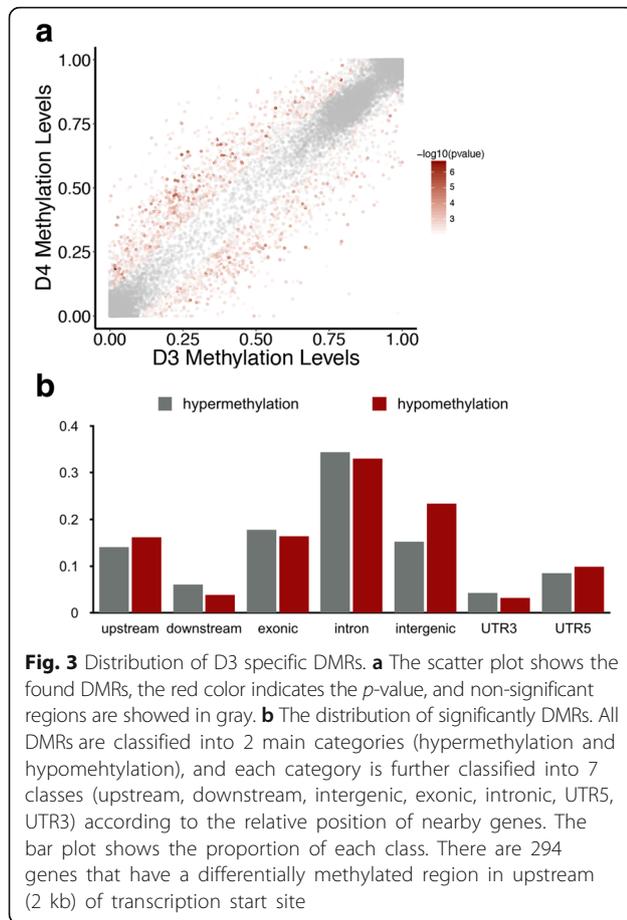
Next, we sought to identify differentially methylated regions (DMRs) between the twin pair using a window sliding strategy to reduce the sampling variation of



**Fig. 2** Comparison of CpG methylomes between two samples. **a** Overall reads coverage of reduced representation bisulfite sequencing (RRBS) at CpGs between the twins. The RRBS strategy shows a high covered rate of CpGs in two samples. 10.88% and 10.72% of all human CpGs are sequenced by more than 5 reads (5x) in D3 and D4, respectively. **b** Overall distribution of CpGs' methylated levels in D3 and D4. This violin plot shows that most CpGs are 100% methylated or 0% methylated, and the global methylation level is unchanged between the pair (Wilcoxon test non-significant). **c** Average CpGs' methylation profile in gene body, upstream (-2 kb of TSS) and downstream (+2 kb of TTS). **d** Circos plot shows the distribution of the DMRs along the genome. The tracks from outsider to inner: CpG islands downloaded from UCSC (green); the  $-\log_{10} p$ -value of detected DMRs (blue); the average methylation levels per 1 kb in D3 (red); the average methylation levels per 1 kb in D4 (green). **e** Scatter diagram of all CpGs' methylation levels calculated by RRBS data between two samples, D3 and D4, showing a similar overall CpG methylation levels with Pearson correlation coefficient equal to 0.9613

individual CpG sites (see Methods). We identified 1566 significant DMRs between the MZ twin pair (Fig. 3a). Hypermethylation and hypomethylation DMRs in D3 showed similar genomic distributions, with 80% (1254/

1566) of the DMRs distributed in gene bodies or intergenic regions and 20% (312/1566) of the DMRs located within 2 kb upstream of TSS (Fig. 3b and Additional file 10: Table S6). We concluded that DMRs



between the MZ twins may be involved in the pathogenesis of DORV.

### Gene ontology (GO) and transcription factor binding sites enriched in DMRs

We analyzed the genes that contained DMRs within 2 kb upstream of their TSS. In total, three hundred and twelve DMRs were located in the upstream of 621 TSSs (belonging to 294 genes annotated in Refseq) (Fig. 3b & Additional file 11: Table S7). These DMR-associated genes were then subjected to KEGG (Kyoto Encyclopedia of Genes and Genomes) pathway and Gene Ontology (GO) analysis using the Enrichr and DAVID Web servers [37–39]. GO analysis revealed that genes associated with cardiolipin acyl-chain remodeling, cardiac muscle tissue regeneration, vascular function and organ growth are enriched in DMR-associated genes (Fig. 4a & Additional file 11: Table S7), suggesting that DMRs may be associated with the abnormal heart development of D3.

We next analyzed the 851 genes containing DMRs in their gene bodies. These genes were also enriched in several biological processes that are involved in various stages of

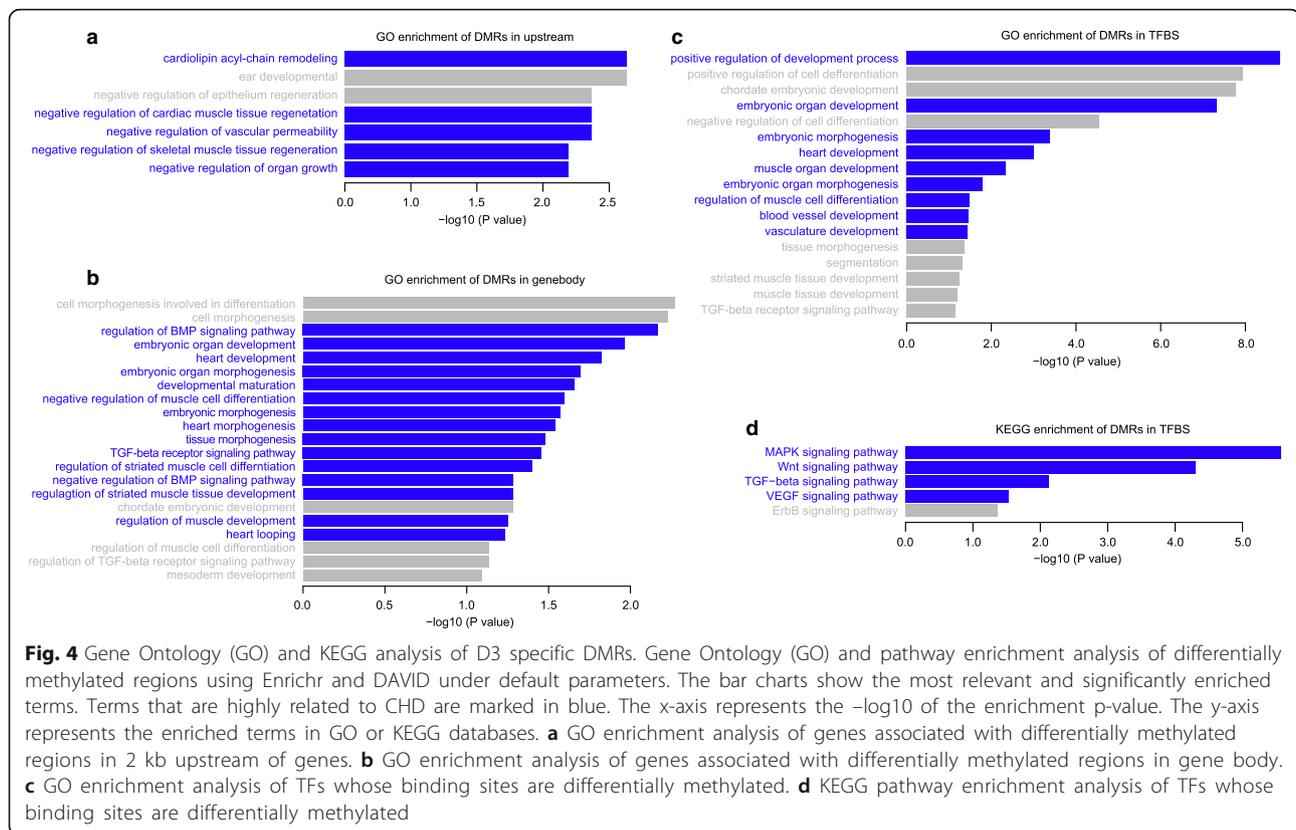
cardiovascular development (Fig. 4b and Additional file 12: Table S8). Furthermore, multiple signaling-pathways involved in heart development were also enriched, including regulation of BMP signaling and TGF beta receptor signaling (Fig. 4b and Additional file 12: Table S8). These results suggest that gene regulatory networks during the heart development of D3 may be affected by the DMRs.

Moreover, DMRs can influence gene expression through directly altering the binding of transcription factors to their targets. We analyzed the TF binding motifs in DMRs by using ANNOVAR (using tfbsConsSites database downloaded from UCSC). We identified 138 TFs (Additional file 10: Table S6) that belong to GATA family and NKX family, which are essential for cardiac development (Additional file 13: Table S9). GO analysis showed that many of these TFs were involved in heart development, muscle organ development, regulation of muscle cell differentiation, and blood vessel development (Fig. 4c and Additional file 13: Table S9). These TFs were also enriched in KEGG signaling pathways including MAPK signaling, Wnt signaling, TGF beta signaling, and VEGF signaling pathway (Fig. 4d and Additional file 13: Table S9), which were all involved in heart development [40–45]. Taken together, these results imply that DMRs in TFs binding sites may contribute to the DORV pathogenesis.

### Aberrant promoter methylation of *ZIC3* and *NR2F2* in the diseased twin

Since promoter hypermethylation is typically associated with the repression of gene transcription [44], we then focused on promoter DMRs for further analysis. We found that DMRs existed in the upstream of multiple genes whose family members have been reported to be involved in pathogenesis of CHDs, and their normal functions are critical in morphogenesis and establishment of the cardiovascular system during cardiac development [46–48]. These genes include *CITED1* (member of CREB-binding protein/p300-interacting transactivator with Asp/Glu-rich C-terminal domain (CITED) family of proteins, hypomethylated), *GATA2* (member of the GATA family of zinc-finger TFs, hypermethylated), *SOX3* (member of the SOX (SRY-related HMG-box) family of transcription factors, hypomethylated) (Additional file 14: Figure S5, Additional file 15: Figure S6 and Additional file 16: Figure S7).

We also found that genes encoding important epigenetic factors contained DMRs in their upstream of TSS, implying that these factors may play roles in causing CHDs through regulating expression of genes implicated in heart development. The genes include *NSD1* (Nuclear Receptor Binding SET Domain Protein 1, which preferentially methylates ‘Lys-36’ of histone H3 and ‘Lys-20’ of histone H4, hypomethylated), *MTA2* (Metastasis Associated 1 Family, Member 2, a component of NuRD,



hypomethylated), *MECP2* (Methyl CpG Binding Protein 2, hypermethylated) and *SUV39H1* (Suppressor of Variegation 3–9 Homolog 1, a histone methyltransferase that trimethylates lysine 9 of histone H3, hypomethylated) (Additional file 17: Figure S8, Additional file 18: Figure S9, Additional file 19: Figure S10 and Additional file 20: Figure S11). We also utilized the public expression profiling data of embryo and adult heart from ENCODE (Accession ID: ENCF704AHC, ENCF199GQY, ENCF987YOV) to analyze the possible contribution of these genes to DORV. We found that these genes were expressed in both embryo and heart (Additional file 21: Table S10), suggesting that these genes may play important roles in embryonic and cardiac development and dysregulated expression of them may contribute to CHD such as DORV.

Moreover, by scrutinizing all the DMRs located in gene promoter regions, we noticed that two genes, *ZIC3* and *NR2F2*, encode TFs annotated with CHD in OMIM (300,265 and 107,773) [49–51]. In the DORV diseased twin D3, the upstream of *ZIC3* (harboring P300 and HNF1 binding sites) was hypermethylated, corresponding to a region with high Pol II binding density in hESC cells (ENCODE data) (Fig. 5a and c). Similarly, hypermethylation of *NR2F2* was detected in the upstream of the TSS (harboring an IRF2 binding site) of the shortest *NR2F2* transcript variant, corresponding to a region with

high intensity of TBP and Pol II binding in K562 cells (ENCODE data) (Fig. 5b and d). These results suggested a possible association of hypermethylated promoters of *ZIC3* and *NR2F2* and their functions during the heart development of DORV patients.

#### Hypermethylation and dysregulation of *ZIC3* and *NR2F2* in additional DORV patients

In order to further confirm the dysregulation of *ZIC3* and *NR2F2* in DORV pathogenesis, we collected twenty DNA samples of whole blood from normal individuals and clinical DORV patients. In order to guarantee the similarity in age and in gender ratio between the normal group and the patient cases, the samples included five controls with normal heart development (aged 0.8–3.8 years; 3 males, 2 females) and fifteen cases with DORV diagnosis (aged 1–3.5 years; 9 males, 6 females). Using bisulfite sequencing, we confirmed hypermethylated promoters of both *ZIC3* (Fig. 6a and b) and *NR2F2* (Fig. 6c and d) in twelve of fifteen DORV patients compared to normal subjects (Additional file 22: Figure S12, Additional file 23 Figure S13). The association of DORV and hypermethylated *ZIC3* and *NR2F2* promoters showed a significant correlation by Fisher's exact test ( $p$  values are both 0.0036) (Fig. 6a and c). Correspondingly, samples harboring hypermethylated promoters of the two genes have comparatively lower

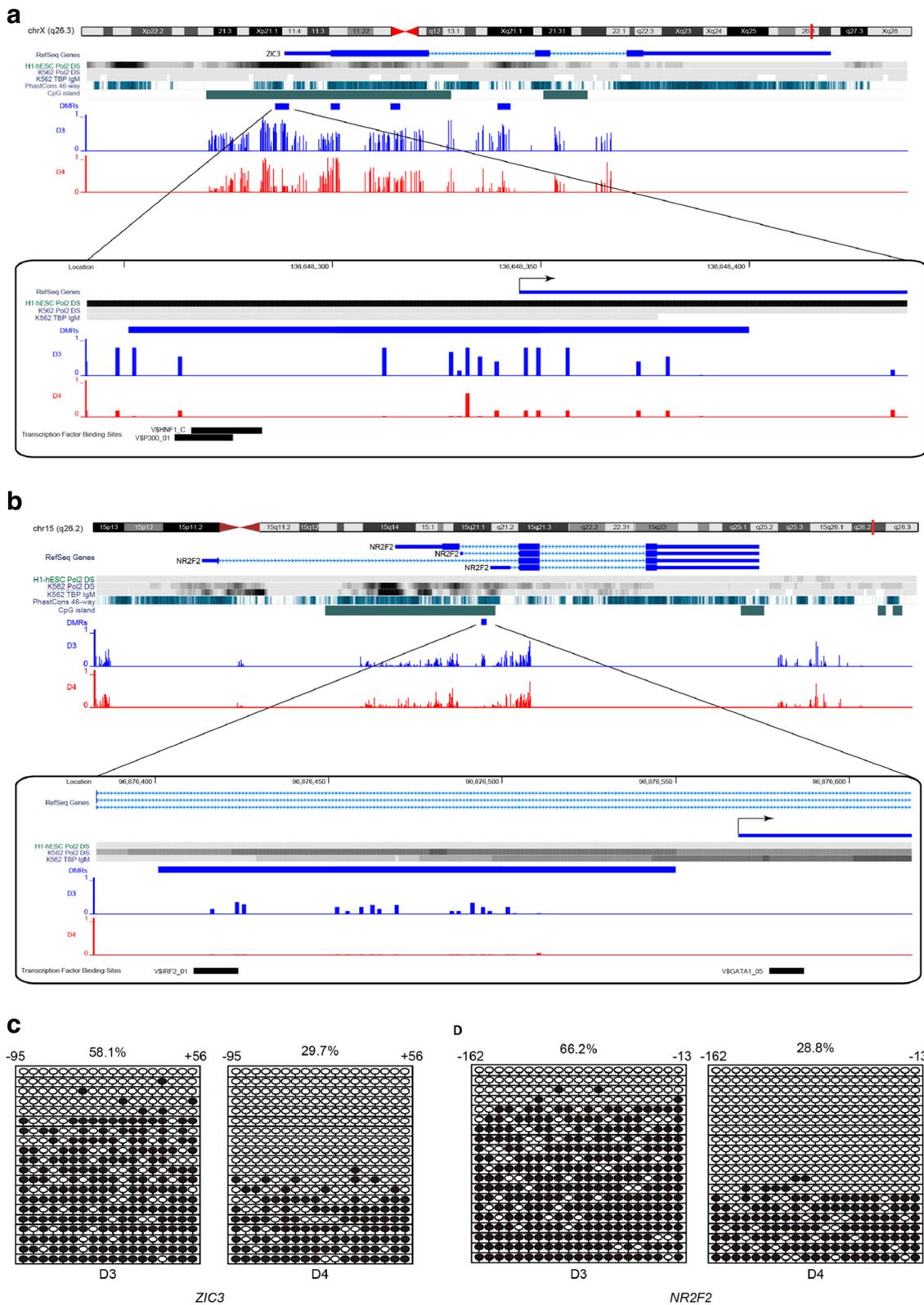


Fig. 5 (See legend on next page.)

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**Fig. 5** Aberrant methylation in the upstream regions of *ZIC3* and *NR2F2*, visualized in UCSC genome browser. DMRs are indicated by light blue bar; methylated levels in the twins are showed in blue (D3) and red (D4) bars. Transcription factor binding sites are also showed in zooming-in panels, which are indicated by black bars with names marked in front. An arrow gives TSS and transcriptional orientation. Two genes, *ZIC3* (a) and *NR2F2* (b), are showing differentially methylated in the upstream of TSS, and these two genes are known be associated with CHD. Transcription factor binding sites analyses are performed by ChIP-seq data of RNA Pol II and TBP derived from ENCODE. Bisulfite sequencing data (c and d) show methylation status of the same region of *ZIC3* and *NR2F2* as in (a) and (b). Methylated and unmethylated CpG sites are shown as black and white circles, respectively

gene expression levels (Fig. 6e and f), and the methylation and gene expression levels of these two genes were negatively correlated (Fig. 6g and h). These results confirm that lower gene expression levels of *ZIC3* and *NR2F2* are associated with promoter hypermethylation of these two genes in normal individuals and DORV patients.

### Discussion

This study represents the first analysis of genome and epigenome profiling of MZ twins discordant for DORV, and provides the evidence for the presence of epigenetic differences between the twin pair. Genetic variations between twins can affect proteins coding, gene transcription and epigenetic modifications [52]. We therefore first performed genomic sequence variation detection and revealed some differences between the twin pair, but stringent filtering analyses of CNVs, SNVs and short InDels failed to identify genomic differences that may contribute to pathogenic DORV. Even though sequence variants within the promoter regions of the *GATA4* and *TBX1* were reported to contribute to congenital heart disease by altering their gene expression [10, 29, 30], our results showed the sequence variants existed in both the normal and diseased twins, indicating that the pathogenesis of DORV may not be due to these differences. It is possible that the shared sequence variants showed different penetrance, which may cause the DORV in one of the MZ twins. Notably, sequences alignment in our study covered 91% of the hg19 human reference genome, leaving the rest of the genome not assessed. Therefore, we cannot rule out the possibility that genome sequence differences are involved in DORV of this twin pair.

Epigenetic variation at specific genomic regions has high heritability, and MZ twins typically share similar epigenetic profiles [25]. However, a set of factors including dietary components, physical changes, psychological states and environmental changes could affect epigenomes of the two years and two months old twins after birth [53]. In this study, many DMRs-related genes (within upstream or gene body) are enriched in pathways that contribute to cardiac development. Most importantly, we found that *ZIC3* and *NR2F2*, which are annotated with CHD in OMIM database, were

hypermethylated at the TSS upstream region of the diseased twin compared to the normal heart sample. *ZIC3* is a member of the ZIC family of C2H2-type zinc finger proteins, which functions as a TF in early stages of left-right body axis formation and heart development [53]. *ZIC3* acts in organizer formation by inhibiting the canonical Wnt signaling pathway, and its expression is regulated by determinants of the early neural fate specification and dorsal-ventral (D-V) axis formation, including BMP, FGF, and Nodal signaling pathways [54]. Mutations in *ZIC3* result in heterotaxy or isolated CHD (phenotypes including DORV, ASD and VSD [49, 50]). In addition, the *ZIC3* gene is located in X chromosome, so it may contribute to the pathogenesis of CHD in male and female differently. *NR2F2* was identified to be a member of the steroid thyroid hormone superfamily of nuclear receptors, involving in the regulation of many different genes in development [55, 56]. In human cases and mouse models, *NR2F2* has been crucially implicated in angiogenesis and heart development, and abnormal expression or depletion of *NR2F2* leads to AVSD (atrioventricular septal defect) and VSD (ventricular septal defects) [51]. Consistently, we also found DMRs in BMP and Wnt signaling pathway-related genes, indicating that the regulation of these signaling pathways by *ZIC3* or *NR2F2* may be critical for normal heart development. Using additional normal and clinical DORV samples, we confirmed promoter hypermethylation of *ZIC3* and *NR2F2* in DORV patients and the anti-correlation between their methylation and gene expression. Taken together, aberrant methylation at promoter regions of *ZIC3* and *NR2F2* and their dysregulated gene transcription levels, may contribute to DORV in human heart development. However, the decisive conclusion needs further investigations, since epigenetic changes in blood may not be able to fully reflect the causative basis of the disease due to lack of more DORV cases in twins and difficulty in obtaining heart samples.

DMRs were also found in the upstream of *CITED1*, *GATA2*, *SOX3* and some important epigenetic genes, including *MTA2*, *NSD1*, *MECP2* and *SUV39H1*, indicating that they might also contribute to DORV. The MZ twins shared the similar but not exactly the same environment, especially the postnatal environment. Thus, we suggest that the non-shared environmental and stochastic

**a**

**Table 1. DNA Methylation State of *ZIC3* DMR**

Samples	Hypomethylated/Hypermethylated	Total
Normal	5/0	5
DORV	3/12	15

Fisher's exact test p value: 0.0036

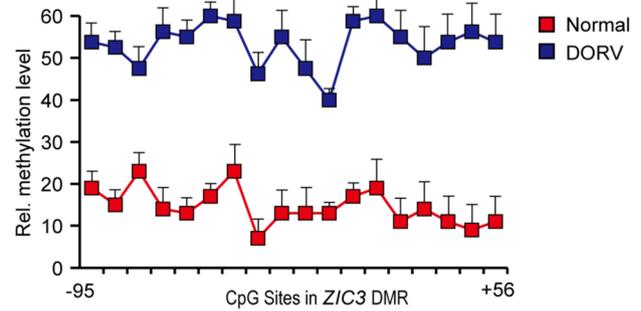
**c**

**Table 2. DNA Methylation State of *NR2F2* DMR**

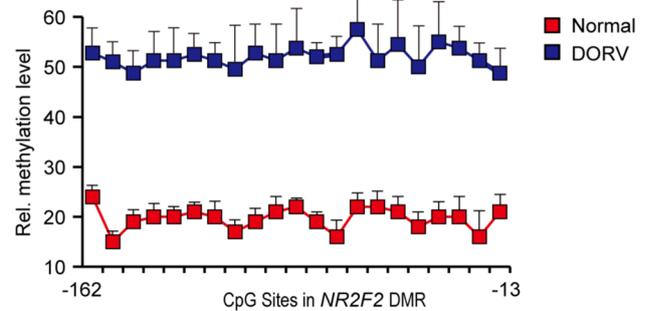
Samples	Hypomethylated/Hypermethylated	Total
Normal	5/0	5
DORV	3/12	15

Fisher's exact test p value: 0.0036

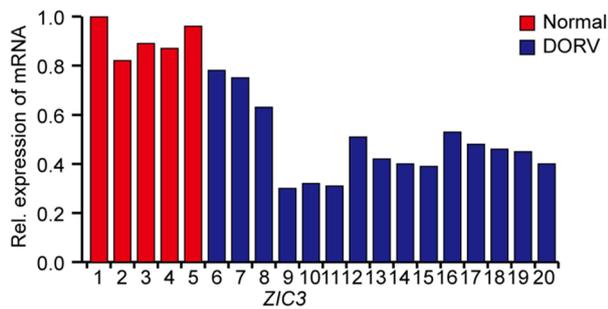
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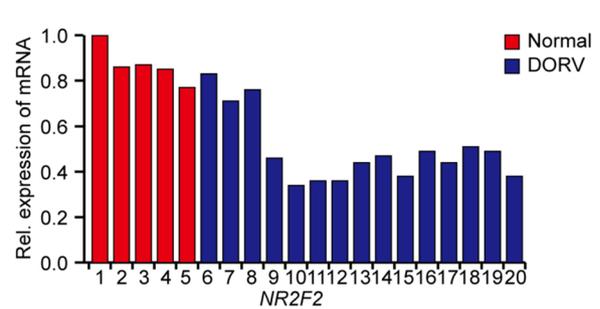
**d**



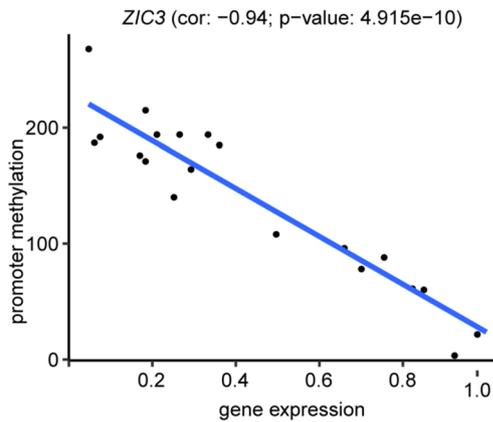
**e**



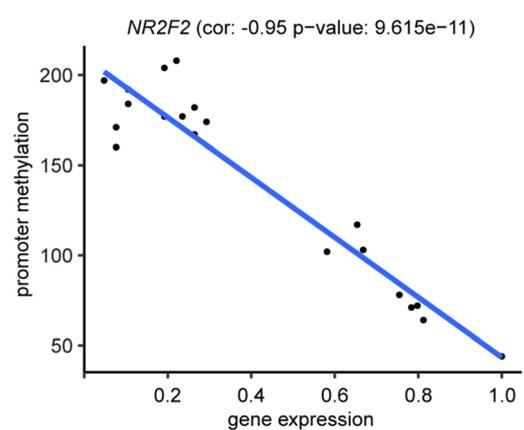
**f**



**g**



**h**



**Fig. 6** (See legend on next page.)

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**Fig. 6** DNA methylation and gene expression detection of *ZIC3* and *NR2F2* from clinical cases. **(a and c)** Statistical summaries about DNA methylation status of DMRs in *ZIC3* and *NR2F2* in 20 clinical samples, consisting of five normal providers and fifteen DORV patients. **(b and d)** Diagrams exhibiting average methylated levels of individual CpG sites in DMRs of *ZIC3* and *NR2F2* from the indicated groups, respectively. **(e and f)** Histograms showing relative gene expression levels of *ZIC3* and *NR2F2* in different groups of specimens. **(g and h)** Scatterplots showing the gene expression levels of *ZIC3* **(g)** and *NR2F2* **(h)** are negatively correlated with their promoter methylation status. Pearson's correlation coefficient and *p*-values were listed above the plot

factors, including physical changes, chemical pollutants, dietary components, temperature changes and other external stresses during pregnancy [6, 57, 58], may contribute to the pathogenesis of DORV through the mediation of epigenetic changes.

## Conclusions

In conclusion, disease-discordant MZ twin pairs are outstanding subjects to study epigenetic mechanisms driving a number of pathologies. Here, using DNA methylation profiling technology to analyze genome-wide DNA methylation, we described differentially methylated regions in a DORV-discordant MZ twin pair. A limitation to our study is that we only obtained one MZ twin pair discordant for DORV, and the present results call for more DORV discordant twins and extensive tests for the generalizability of our findings. Nevertheless, our results provide new insights into the mechanism of DORV, a rare disease that has been less studied by genomic and epigenomic approaches.

## Methods

### Patients and materials

Genomic DNA was extracted from the donated whole blood samples of DORV patients and normal people by using the DNeasy Blood & Tissue Kit (Qiagen, Cat no. 69504). This study was conducted in accordance with the principles of the Declaration of Helsinki and has been reviewed and approved by the Medical Ethics Committee of Fuwai Hospital. Written informed consent was obtained from the twins' parents and mentioned samples' providers.

### Reduced representation bisulfite sequencing (RRBS)

MspI-digested RRBS library was prepared as published [36], one hundred bp paired-end reads were generated from Illumina HiSeq2000 platform (BIOPIC, Peking University, Beijing). Raw reads were trimmed adapters and low quality bases using trim\_galore in RRBS mode. Human genome (hg19) was indexed with bismark\_genome\_preparation (a script from bismark mapping package), and then, all clean reads aligned to indexed human genome using bismark (--bowtie2). To extract the methylation information for individual cytosines, bismark\_methylation\_extractor (-p -cytosine\_report -CX -no\_overlap) in paired-end mode was applied, and the

output CX\_report file was sorted by chromosomes using linux shell commands (awk). The sorted CX\_report files were then used for downstream analysis.

### DNA methylation detection and quantitative RT-PCR

To monitor CpG methylation of screened DMRs in promoters, genomic DNA was treated with sodium bisulfite using EpiTect Bisulfite Kit (Qiagen, USA). The converted DNA was then amplified by PCR with specific primers (*ZIC3*: Forward: 5'-GAGTGATTGATTTTATTAGTTTAAAGGATAT-3'Reverse: 5'-AACCAAAAAACTCCCTAAATACC-3'; *NR2F2*: Forward: 5'-GAAGTAGGAAAGGGTGGG-3' Reverse: 5'-CGAACCCAACTATTATCTAAC-3'), PCR products were purified, ligated into pEasy-T5 vector (Transgene, China) and then transduced into competent *Escherichia.coli*. When bacteria colonies appeared on the plate, at least 20 independent clones were selected and sequenced. The sequenced results were analyzed by BiQ analyzer (Max Plank Institute, Germany). Total RNA was extracted with RNAliquid Kit (Aidlab, China) and mRNA expression levels were detected with one-step RT-PCR kit (Takara, China) on lightcycler (Roche, USA). RT-qPCR primers were listed as follows: *ZIC3*: Forward: 5'-GGCGCTCAGTTTCCTAACTAC-3'Reverse: 5'-CTGCGCATATAACGGAAGAA-3'; *NR2F2*: Forward: 5'-AACCAGCCGACGAGATTTCG-3' Reverse: 5'-CCCGGATGAGGGTTTCGATG-3'.

### DMRs detection

Differentially methylated regions (DMRs) were detected based on a windows swiping method. We used a 100 bp window sliding on the genome at a 50 bp step to find differentially methylated windows (DMWs) between two samples, and the neighboring windows were joined together as a DMR. Only >10X CpG sites were used to calculate DMWs. To test the different average methylations in a window between two samples, Wilcoxon test was applied, and *p*-value < 0.01 was then considered as the DMW. A significant DMW was discarded if less than five CpG sites in the window and average methylation levels between two samples were less than 10%. Finally, adjacent DMWs were joined together as DMRs using BEDtools (intersectBed). DMRs were annotated by BEDtools (intersectBed) and ANNOVAR [59].

### Gene ontology (GO) and pathway enrichment

Annotated DMRs were separated into 3 subsets: gene upstreams (2 kb in front of TSS), gene bodies and transcript factor binding sites. Genes which had DMRs in upstreams and gene bodies were submitted to Database for Enrichr and Annotation, Visualization and Integrated Discovery (DAVID) respectively, GO enrichments used GOTERM\_BP\_FAT database under default parameters, and pathway enrichments used Kyoto Encyclopedia of Genes and Genomes (KEGG) database. DMRs which annotated as transcript factors binding sites by ANNOVAR (using tfbsConsSites database downloaded from UCSC [60]) were considered to influence the TFs function, so we analyzed those TFs using DAVID. GO (biological process) and pathway enrichments were obtained to understand those DMRs' biological meanings.

### Additional files

**Additional file 1: Table S1.** Overview of WGS data. (XLSX 39 kb)

**Additional file 2: Table S2.** D3 specific SNVs and short InDels (XLSX 82 kb)

**Additional file 3: Table S3.** Sequence variations reported related to VSD. (XLSX 30 kb)

**Additional file 4: Figure S1.** Comparison of copy number profiles of 22 pairs of autochromosomes and X chromosome between twin pair. Normalized copy number profiles of D3 and D4. Each point shows a 5 kb windows (all chromosomes) of sequencing reads normalized by GC-content and map-ability using Control-FREEC. (PDF 1756 kb)

**Additional file 5: Table S4.** Analysis of CNVs two samples. (XLSX 46 kb)

**Additional file 6: Figure S2.** D3 specific structure variations (SVs) analysis. Alignments of reads in both D3 (top panel) and D4 (bottom panel) at each break points detected by CREST. The header lines in blue given the detail information of each structure variation (columns meanings: left\_chr, left\_pos, left\_strand, number of left soft-clipped reads, right\_chr, right\_pos, right\_strand, number right soft-clipped reads, SV type, coverage at left\_pos, coverage at right\_pos, assembled length at left\_pos, assembled length at right\_pos, average percent identity at left\_pos, percent of non-unique mapping reads at left\_pos, average percent identity at right\_pos, percent of non-unique mapping reads at right\_pos, start position of consensus mapping to genome, starting chromosome of consensus mapping, position of the genomic mapping of consensus starting position, end position of consensus mapping to genome, ending chromosome of consensus mapping, position of genomic mapping of consensus ending position, and consensus sequences). (PDF 626 kb)

**Additional file 7: Table S5.** Overview of RRBS data. (XLS 26 kb)

**Additional file 8: Figure S3.** Analysis of WGBS data of B cell and heart tissue from the ENCODE project. (A) Scatter plot and Pearson's correlation analysis of DNA methylation of B cell and heart. Pearson's correlation coefficient was listed above the plot. (B) Visualization of the DNA methylation status of B cell and heart in chr1:1-3 M by IGV. (JPG 500 kb)

**Additional file 9: Figure S4.** Comparison of systemic changes of methylome between two samples. (A) Cumulative depth distribution of RRBS data. The x-axis represents the depth of cytosine, and the y-axis represents the fraction of cytosine  $\leq$  depth. (B) Methylation levels distribution in two samples of three different kinds of cytosine (CG, CHG, CHH). The x-axis is the methylation level; y-axis shows the log<sub>2</sub> counts of the cytosine under a methylated level. (C) CHH methylation profile in the gene body, upstream and downstream. (D) CHG methylation profile in the gene body, upstream and downstream. (PDF 891 kb)

**Additional file 10: Table S6.** DMRs between two samples. (XLSX 580 kb)

**Additional file 11: Table S7.** GO and KEGG analysis of DMRs located in upstream region. (XLSX 43 kb)

**Additional file 12: Table S8.** GO and KEGG analysis of DMRs located in gene body. (XLSX 99 kb)

**Additional file 13: Table S9.** GO and KEGG analysis of DMRs located in TF binding sites. (XLSX 80 kb)

**Additional file 14: Figure S5.** Aberrant methylation in the upstream regions of *CITED1*. Visualizing the methylation levels of DMRs near *CITED1* with UCSC genome browser. Methylated levels in the twins are showed in blue (D3) and red (D4). Transcription factor binding sites are also showed in zooming-in panels, which indicated by black bars with names marked in front. Arrows give TSSs and transcriptional orientation. Transcription factor binding sites, Pol II ChIP-seq and TBP ChIP-seq data from ENCODE. (PDF 910 kb)

**Additional file 15: Figure S6.** Aberrant methylation in the upstream regions of *GATA2*. Visualizing the methylation levels of DMRs near *GATA2* with UCSC genome browser. Methylated levels in the twins are showed in blue (D3) and red (D4). An arrow gives TSS and transcriptional orientation. Transcription factor binding sites, Pol II ChIP-seq and TBP ChIP-seq data from ENCODE. (PDF 767 kb)

**Additional file 16: Figure S7.** Aberrant methylation in the upstream regions of *SOX3*. Visualizing the methylation levels of DMRs near *SOX3* with UCSC genome browser. Methylated levels in the twins are showed in blue (D3) and red (D4). Transcription factor binding sites are also showed in zooming-in panels, which indicated by black bars with names marked in front. An arrow gives TSS and transcriptional orientation. Transcription factor binding sites, Pol II ChIP-seq and TBP ChIP-seq data from ENCODE. (PDF 590 kb)

**Additional file 17: Figure S8.** Aberrant methylation in the upstream regions of *NSD1*. Visualizing the methylation levels of DMRs near *NSD1* with UCSC genome browser. Methylated levels in the twins are showed in blue (D3) and red (D4). Transcription factor binding sites are also showed in zooming-in panels, which indicated by black bars with names marked in front. An arrow gives TSS and transcriptional orientation. Transcription factor binding sites, Pol II ChIP-seq and TBP ChIP-seq data from ENCODE. (PDF 781 kb)

**Additional file 18: Figure S9.** Aberrant methylation in the upstream regions of *MTA2*. Visualizing the methylation levels of DMRs near *MTA2* with UCSC genome browser. Methylated levels in the twins are showed in blue (D3) and red (D4). Transcription factor binding sites are also showed in zooming-in panels, which indicated by black bars with names marked in front. An arrow gives TSS and transcriptional orientation. Transcription factor binding sites, Pol II ChIP-seq and TBP ChIP-seq data from ENCODE. (PDF 633 kb)

**Additional file 19: Figure S10.** Aberrant methylation in the upstream regions of *MECP2*. Visualizing the methylation levels of DMRs near *MECP2* with UCSC genome browser. Methylated levels in the twins are showed in blue (D3) and red (D4). Transcription factor binding sites are also showed in zooming-in panels, which indicated by black bars with names marked in front. Arrows give TSSs and transcriptional orientation. Transcription factor binding sites, Pol II ChIP-seq and TBP ChIP-seq data from ENCODE. (PDF 969 kb)

**Additional file 20: Figure S11.** Aberrant methylation in the upstream regions of *SUV39H1*. Visualizing the methylation levels of DMRs near *SUV39H1* with UCSC genome browser. Methylated levels in the twins are showed in blue (D3) and red (D4). Transcription factor binding sites are also showed in zooming-in panels, which indicated by black bars with names marked in front. An arrow gives TSS and transcriptional orientation. Transcription factor binding sites, Pol II ChIP-seq and TBP ChIP-seq data from ENCODE. (PDF 748 kb)

**Additional file 21: Table S10.** Expression profiling data of embryo and adult heart. (XLSX 9 kb)

**Additional file 22: Figure S12.** DNA methylation detection of *ZIC3* from clinical samples. Bisulfite sequencing tested DNA methylation status of DMRs in *ZIC3* in 20 clinical samples, five normal providers (1–5) and fifteen DORV patients (6–20). Methylated and unmethylated CpG sites are indicated as respective black and white circles. (PDF 5226 kb)

**Additional file 23: Figure S13.** DNA methylation detection of *NR2F2* from clinical samples. Bisulfite sequencing detected DNA methylation status of DMRs in *NR2F2* in 20 clinical samples, five normal providers (1–5) and fifteen DORV patients (6–20). Methylated and unmethylated CpG sites are indicated as black and white circles, respectively. (PDF 5463 kb)

### Abbreviations

ASD: Atrial septal defect; CHD: Congenital heart disease; *CITED1*: Cbp/p300 interacting transactivator with Glu/Asp rich carboxy-terminal domain 1; CNVs: Copy number variations; DAVID: Database for Annotation, Visualization and Integrated Discovery; DMRs: Differentially methylated regions; DMWs: Differentially Methylated Windows; DORV: Double outlet right ventricle; *GATA2*: GATA-binding protein 2; *GATA4*: GATA-binding factor 4; HGMD: Human Genetic Mutation Database; HNF1: Hepatocyte nuclear factor 1; InDels: Insertions/deletions; IRF2: Interferon regulatory factor 2; KEGG: Kyoto Encyclopedia of Genes and Genomes; MAPK: Mitogen activated protein kinase; *MECP2*: Methyl CpG binding protein 2; *MTA2*: Metastasis associated 1 family member 2; MZ: Monozygotic; *NR2F2*: Nuclear receptor subfamily 2 group F member 2; *NSD1*: Nuclear receptor binding SET domain protein 1; OMIM: Online Mendelian Inheritance in Man; P300: Histone acetyltransferase p300; Pol II: RNA polymerase II; RRBS: Reduced representation bisulfite sequencing; SNVs: Single nucleotide variations; *SOX3*: SRY-box 3; *SUV39H1*: Suppressor of variegation 3–9 homolog 1; T1D: Type 1 diabetes; TBP: TATA-box binding protein; *TBX1*: T-box transcription factor 1; TFs: Transcription factors; TGF: Transforming growth factor; TSS: Transcription start sites; VEGF: Vascular endothelial growth factor; VSD: Ventricular septal defect; *ZIC3*: Zic family member 3

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### Availability of data and materials

The datasets used and/or analysed during the current study available from the corresponding author on reasonable request.

### Authors' contributions

GLL and TL designed and performed molecular experiments, CZ contributed to bioinformatics analysis, they contributed equally to this work; RL helped with collections of clinical blood samples, CL, LZ, YTG, XKH, LS, LH and LJZ contributed to data analysis; WT, CL and YN conceived the project and designed experiments; TL, GLL, CZ, CL and WT wrote the manuscript. All authors read and approved the final version of the manuscript.

### Ethics approval and consent to participate

This study was conducted in accordance with the principles of the Declaration of Helsinki and has been reviewed and approved by the Medical Ethics Committee of Fuwai Hospital (Approval no. 229). We confirm the informed written consent was obtained from all participants.

### Consent for publication

For investigations involving clinical subjects, informed written consent has been obtained from the participants involved. The participants consented to publish all of the sequencing data.

### Competing interests

The authors declare that they have no competing interests.

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### References

- Fahed AC, Gelb BD, Seidman J, Seidman CE. Genetics of congenital heart disease: the glass half empty. *Circ Res*. 2013;112(4):707–20.
- McMahon CJ, Breathnach C, Betts DR, Sharkey FH, Grealley MT. De novo interstitial deletion 13q33.3q34 in a male patient with double outlet right ventricle, microcephaly, dysmorphic craniofacial findings, and motor and developmental delay. *Am J Med Genet A*. 2015;167(5):1134–41.
- Hartge DR, Niemeyer L, Axt-Fliedner R, Krapp M, Gembruch U, Germer U, Weichert J. Prenatal detection and postnatal management of double outlet right ventricle (DORV) in 21 singleton pregnancies. *J Matern Fetal Neonatal Med*. 2012;25(1):58–63.
- Obler D, Juraszek A, Smoot LB, Natowicz MR. Double outlet right ventricle: aetiologies and associations. *J Med Genet*. 2008;45(8):481–97.
- Ordovas JM, Smith CE. Epigenetics and cardiovascular disease. *Nat Rev Cardiol*. 2010;7(9):510.
- Vecoli C, Pulignani S, Foffa I, Grazia Andreassi M. Congenital heart disease: the crossroads of genetics, epigenetics and environment. *Curr Genomics*. 2014;15(5):390–9.
- Bruneau BG. Signaling and transcriptional networks in heart development and regeneration. *Cold Spring Harb Perspect Biol*. 2013;5(3):a008292.
- Hatcher CJ, Basson CT. Specification of the cardiac conduction system by transcription factors. *Circ Res*. 2009;105(7):620–30.
- Kathiriyala IS, Nora EP, Bruneau BG. Investigating the transcriptional control of cardiovascular development. *Circ Res*. 2015;116(4):700–14.
- Stefanovic S, Christoffels VM. GATA-dependent transcriptional and epigenetic control of cardiac lineage specification and differentiation. *Cell Mol Life Sci*. 2015;72(20):3871–81.
- Liu L, Jin G, Zhou X. Modeling the relationship of epigenetic modifications to transcription factor binding. *Nucleic Acids Res*. 2015;43(8):3873–85.
- Feil R, Fraga MF. Epigenetics and the environment: emerging patterns and implications. *Nat Rev Genet*. 2012;13(2):97.
- Handy DE, Castro R, Loscalzo J. Epigenetic modifications: basic mechanisms and role in cardiovascular disease. *Circulation*. 2011;123(19):2145–56.
- Szyf M. The early life social environment and DNA methylation: DNA methylation mediating the long-term impact of social environments early in life. *Epigenetics*. 2011;6(8):971–8.
- Smith ZD, Meissner A. DNA methylation: roles in mammalian development. *Nat Rev Genet*. 2013;14(3):204.
- Hodges E, Molano A, Dos Santos CO, Thekkat P, Song Q, Uren PJ, Park J, Butler J, Rafii S, McCombie WR. Directional DNA methylation changes and complex intermediate states accompany lineage specificity in the adult hematopoietic compartment. *Mol Cell*. 2011;44(1):17–28.
- Brunner AL, Johnson DS, Kim SW, Valouev A, Reddy TE, Neff N, Anton E, Medina C, Nguyen L, Chiao E. Distinct DNA methylation patterns characterize differentiated human embryonic stem cells and developing human fetal liver. *Genome Res*. 2009;19(6):1044–56.
- Kanherkar RR, Bhatia-Dey N, Csoka AB. Epigenetics across the human lifespan. *Frontiers in cell and developmental biology*. 2014;2:49.
- Yuan W, Xia Y, Bell CG, Yet I, Ferreira T, Ward KJ, Gao F, Loomis AK, Hyde CL, Wu H. An integrated epigenomic analysis for type 2 diabetes susceptibility loci in monozygotic twins. *Nat Commun*. 2014;5:5719.
- Wong C, Meaburn EL, Ronald A, Price T, Jeffries AR, Schalkwyk L, Plomin R, Mill J. Methyloomic analysis of monozygotic twins discordant for autism spectrum disorder and related behavioural traits. *Mol Psychiatry*. 2014;19(4):495.
- Arora M, Reichenberg A, Willfors C, Austin C, Gennings C, Berggren S, Lichtenstein P, Anckarsäter H, Tammimies K, Bölte S. Fetal and postnatal metal dysregulation in autism. *Nat Commun*. 2017;8:15493.
- Caramori ML, Kim Y, Moore JH, Rich SS, Mychaleckyj JC, Kikyo N, Mauer M. Gene expression differences in skin fibroblasts in identical twins discordant for type 1 diabetes. *Diabetes*. 2012;61(3):739–44.
- Castillo-Fernandez JE, Spector TD, Bell JT. Epigenetics of discordant monozygotic twins: implications for disease. *Genome Med*. 2014;6(7):60.

24. Bell JT, Saffery R. The value of twins in epigenetic epidemiology. *Int J Epidemiol.* 2012;41(1):140–50.
25. Bell JT, Spector TD. A twin approach to unraveling epigenetics. *Trends Genet.* 2011;27(3):116–25.
26. Papadopoulos GK, Wijmenga C, Koning F. Interplay between genetics and the environment in the development of celiac disease: perspectives for a healthy life. *J Clin Invest.* 2001;108(9):1261–6.
27. Li H, Handsaker B, Wysoker A, Fennell T, Ruan J, Homer N, Marth G, Abecasis G, Durbin R. The sequence alignment/map format and SAMtools. *Bioinformatics.* 2009;25(16):2078–9.
28. Koboldt DC, Chen K, Wylie T, Larson DE, McLellan MD, Mardis ER, Weinstock GM, Wilson RK, Ding L. VarScan: variant detection in massively parallel sequencing of individual and pooled samples. *Bioinformatics.* 2009;25(17):2283–5.
29. Tomita-Mitchell A, Maslen C, Morris C, Garg V, Goldmuntz E. GATA4 sequence variants in patients with congenital heart disease. *J Med Genet.* 2007;44(12):779–83.
30. Wang H, Chen D, Ma L, Meng H, Liu Y, Xie W, Pang S, Yan B. Genetic analysis of the TBX1 gene promoter in ventricular septal defects. *Mol Cell Biochem.* 2012;370(1–2):53–8.
31. Zhang F, Gu W, Hurler ME, Lupski JR. Copy number variation in human health, disease, and evolution. *Annu Rev Genomics Hum Genet.* 2009;10:451–81.
32. Boeva V, Popova T, Bleakley K, Chiche P, Cappo J, Schleiermacher G, Janoueix-Lerosey I, Delattre O, Barillot E. Control-FREEC: a tool for assessing copy number and allelic content using next-generation sequencing data. *Bioinformatics.* 2011;28(3):423–5.
33. Abyzov A, Urban AE, Snyder M, Gerstein M. CNVnator: an approach to discover, genotype, and characterize typical and atypical CNVs from family and population genome sequencing. *Genome Res.* 2011;21(6):974–84.
34. Oda M, Yamagiwa A, Yamamoto S, Nakayama T, Tsumura A, Sasaki H, Nakao K, Li E, Okano M. DNA methylation regulates long-range gene silencing of an X-linked homeobox gene cluster in a lineage-specific manner. *Genes Dev.* 2006;20(24):3382–94.
35. Jaenisch R, Bird A. Epigenetic regulation of gene expression: how the genome integrates intrinsic and environmental signals. *Nat Genet.* 2003;33:245.
36. Gu H, Smith ZD, Bock C, Boyle P, Gnirke A, Meissner A. Preparation of reduced representation bisulfite sequencing libraries for genome-scale DNA methylation profiling. *Nat Protoc.* 2011;6(4):468.
37. Kanehisa M, Furumichi M, Tanabe M, Sato Y, Morishima K. KEGG: new perspectives on genomes, pathways, diseases and drugs. *Nucleic Acids Res.* 2016;45(D1):D353–61.
38. Huang DW, Sherman BT, Tan Q, Kir J, Liu D, Bryant D, Guo Y, Stephens R, Baseler MW, Lane HC. DAVID bioinformatics resources: expanded annotation database and novel algorithms to better extract biology from large gene lists. *Nucleic Acids Res.* 2007;35(suppl\_2):W169–75.
39. Kuleshov MV, Jones MR, Rouillard AD, Fernandez NF, Duan Q, Wang Z, Koplev S, Jenkins SL, Jagodnik KM, Lachmann A. Enrichr: a comprehensive gene set enrichment analysis web server 2016 update. *Nucleic Acids Res.* 2016;44(W1):W90–7.
40. Zhang Y, Rath N, Hannehalli S, Wang Z, Cappola T, Kimura S, Atochina-Vasserman E, Lu MM, Beers MF, Morrissey EE. GATA and Nkx factors synergistically regulate tissue-specific gene expression and development in vivo. *Development.* 2007;134(1):189–98.
41. Wang Y. Mitogen-activated protein kinases in heart development and diseases. *Circulation.* 2007;116(12):1413–23.
42. Rose BA, Force T, Wang Y. Mitogen-activated protein kinase signaling in the heart: angels versus demons in a heart-breaking tale. *Physiol Rev.* 2010;90(4):1507–46.
43. Madonna R, De Caterina R. VEGF receptor switching in heart development and disease. *Cardiovasc Res.* 2009;84(1):4–6.
44. Dor Y, Camenisch TD, Itin A, Fishman GI, McDonald JA, Carmeliet P, Keshet E. A novel role for VEGF in endocardial cushion formation and its potential contribution to congenital heart defects. *Development.* 2001;128(9):1531–8.
45. Sridurongrit S, Larsson J, Schwartz R, Ruiz-Lozano P, Kaartinen V. Signaling via the Tgf- $\beta$  type I receptor Alk5 in heart development. *Dev Biol.* 2008;322(1):208–18.
46. Bamforth SD, Bragança J, Farthing CR, Schneider JE, Broadbent C, Michell AC, Clarke K, Neubauer S, Norris D, Brown NA. Cited2 controls left-right patterning and heart development through a nodal-Pitx2c pathway. *Nat Genet.* 2004;36(11):1189.
47. Connelly JJ, Wang T, Cox JE, Haynes C, Wang L, Shah SH, Crosslin DR, Hale AB, Nelson S, Crossman DC. GATA2 is associated with familial early-onset coronary artery disease. *PLoS Genet.* 2006;2(8):e139.
48. Paul MH, Harvey RP, Wegner M, Sock E. Cardiac outflow tract development relies on the complex function of Sox4 and Sox11 in multiple cell types. *Cell Mol Life Sci.* 2014;71(15):2931–45.
49. Ware SM, Peng J, Zhu L, Fernbach S, Colicos S, Casey B, Towbin J, Belmont JW. Identification and functional analysis of ZIC3 mutations in heterotaxy and related congenital heart defects. *Am J Hum Genet.* 2004;74(1):93–105.
50. Cowan J, Tariq M, Ware SM. Genetic and functional analyses of ZIC3 variants in congenital heart disease. *Hum Mutat.* 2014;35(1):66–75.
51. Al Turki S, Manickaraj AK, Mercer CL, Gerety SS, Hitz M-P, Lindsay S, D'Alessandro LC, Swaminathan GJ, Benthham J, Arndt A-K. Rare variants in NR2F2 cause congenital heart defects in humans. *Am J Hum Genet.* 2014;94(4):574–85.
52. Chen X, Kuja-Halkola R, Rahmani I, Arpegård J, Viktorin A, Karlsson R, Hägg S, Svensson P, Pedersen NL, Magnusson PK. Dominant genetic variation and missing heritability for human complex traits: insights from twin versus genome-wide common SNP models. *Am J Hum Genet.* 2015;97(5):708–14.
53. Fraga MF, Ballestar E, Paz MF, Ropero S, Setien F, Ballestar ML, Heine-Suñer D, Cigudosa JC, Urioste M, Benitez J. Epigenetic differences arise during the lifetime of monozygotic twins. *Proc Natl Acad Sci U S A.* 2005;102(30):10604–9.
54. Fujimi TJ, Hatayama M, Aruga J. Xenopus Zic3 controls notochord and organizer development through suppression of the Wnt/ $\beta$ -catenin signaling pathway. *Dev Biol.* 2012;361(2):220–31.
55. Mendoza-Villarreal RE, Robert NM, Martin LJ, Brousseau C, Tremblay JJ. The nuclear receptor NR2F2 activates star expression and steroidogenesis in mouse MA-10 and MLTC-1 Leydig cells. *Biol Reprod.* 2014;91(1).
56. Hubert MA, Sherrill SL, Bachurski CJ, Handwerger S. Involvement of transcription factor NR2F2 in human trophoblast differentiation. *PLoS One.* 2010;5(2):e9417.
57. Cortessis VK, Thomas DC, Levine AJ, Breton CV, Mack TM, Siegmund KD, Haile RW, Laird PW. Environmental epigenetics: prospects for studying epigenetic mediation of exposure–response relationships. *Hum Genet.* 2012;131(10):1565–89.
58. Hogenson TL. Epigenetics as the underlying mechanism for monozygotic twin discordance. *Medical Epigenetics.* 2013;1(1):3–18.
59. Quinlan AR, Hall IM. BEDTools: a flexible suite of utilities for comparing genomic features. *Bioinformatics.* 2010;26(6):841–2.
60. Karolchik D, Hinrichs AS, Kent WJ. The UCSC genome browser. *Current protocols in bioinformatics* 2012, 40(1):1.4. 1–1.4. 33.

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