### ORIGINAL ARTICLE



## A genome-wide comparison between selected and unselected Valle del Belice sheep reveals differences in population structure and footprints of recent selection

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### **Abstract**

About three decades of breeding and selection in the Valle del Belice sheep are expected to have left several genomic footprints related to milk production traits. In this study, we have assembled a dataset with 451 individuals of the Valle del Belice sheep breed: 184 animals that underwent directional selection for milk production and 267 unselected animals, genotyped for 40,660 single-nucleotide polymorphisms (SNPs). Three different statistical approaches, both within (iHS and ROH) and between (Rsb) groups, were used to identify genomic regions potentially under selection. Population structure analyses separated all individuals according to their belonging to the two groups. A total of four genomic regions on two chromosomes were jointly identified by at least two statistical approaches. Several candidate genes for milk production were identified, corroborating the polygenic nature of this trait and which may provide clues to potential new selection targets. We also found candidate genes for growth and reproductive traits. Overall, the identified genes may explain the effect of selection to improve the performances related to milk production traits in the breed. Further studies using high-density array data, would be particularly relevant to refine and validate these results.

### KEYWORDS

candidate genes, Ovis Aries, population genomics, selection signatures, SNP markers

### 1 | INTRODUCTION

Valle del Belice is a sheep breed reared in Sicily for milk production. The breeding history of this breed is relatively recent (Portolano, 1987). In the 1990s, the data collected on production and morphological traits allowed the

development of Valle del Belice breed standard. In 1997, the breed was given official recognition. Since the beginning of the 21st century, the Valle del Belice breed has been subjected to selection, and great efforts have been made by local farmers to keep its breeding sustainable, mainly by increasing milk production through better management

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and selection. Nowadays, it is one of the most economically important dairy sheep breeds in Southern Italy, with about 200,000 animals. Three decades of breeding and selection in Valle del Belice sheep are expected to have left several genomic footprints related to milk production traits.

From the end of the 1990s until today, the genetic material of this sheep has been collected and stored by the University of Palermo. This provided the opportunity to map genomic regions affected by selection pressure in Valle del Belice sheep through the analysis of genomic differences between selected (more recently sampled) and unselected animals.

Advances in genomic methodologies have enabled the development and combination of methods to explore the effects of selection in the genome of livestock species (e.g. Avila et al., 2018; Brito et al., 2017; Fariello et al., 2014). Most of them rely on linkage disequilibrium, site frequency spectrum, reduced local variability and population differentiation (Qanbari & Simianer, 2014). Each of these methods benefits from different sources of information on genome variation and is sensitive to different categories of selection signatures. For instance, the iHS test has advantages in exploring selective sweeps with variants at moderate frequencies (Sabeti et al., 2007), whereas Rsb is better suited for detecting recent selective sweeps that resulted in near or complete fixation of an allele in a population (Tang et al., 2007). The selection also leads to reduced genetic diversity in some regions of the genome, which results in stretches of consecutive homozygous genotypes, known as runs of homozygosity (ROH) islands (Mastrangelo et al., 2017).

In sheep, several studies have been carried out using the above-mentioned methods to identify the genomic regions under selection (e.g. Ahbara et al., 2019; Eydivandi et al., 2021; Kijas et al., 2012), even within genetically close populations (e.g. Cesarani et al., 2019; Mastrangelo et al., 2019). However, changes in the genomic architecture over time due to within-breed selection processes are rarely studied (Hulsegge et al., 2022), especially in sheep.

In this study, we used the Illumina OvineSNP50 BeadChip genotype data and the comparison between two groups of Valle del Belice ewes formed, respectively, by individuals that underwent directional selection (recent sampling) and unselected animals (old sampling), with the aim to identify genomic regions potentially linked to the selection process.

### 2 MATERIALS AND METHODS

Animal Care and Use Committee approval was not needed as data were obtained from pre-existing databases.

### 2.1 | Animals and genotyping

We have assembled a dataset with 451 individuals of the Valle del Belice sheep breed: 267 old samples (VDB-old, collected before the 2000s) and 184 new samples (VDB-new, collected between 2018 and 2020). The Department SAAF, University of Palermo, has preserved the genetic material of VDB-old. As regards recent samples, genomic DNA was extracted from blood using the commercial Illustra blood genomic Prep Mini Spin kit (GE Healthcare).

All animals were genotyped for 54,241 single-nucleotide polymorphisms (SNPs) using the Illumina OvineSNP50K array. Chromosomal coordinates for each SNP were obtained from the Oar\_v4.0 ovine (*Ovis aries*) genome sequence assembly. Only SNPs located on autosomes were considered. After filtering for minor allele frequency (maf 0.05), missing genotype call rate (geno 0.01) and missingness per individual (mind 0.1), a final dataset consisting of 40,660 SNPs was obtained. All animals had high-quality genotyping and were included in the analysis.

## 2.2 | Population structure

To investigate the genetic relationships among individuals and between groups, multidimensional scaling (MDS) analysis based on the matrix of identity-by-state pairwise distances was performed using PLINK 1.7 (Purcell et al., 2007). Population structure has been inspected using the maximum likelihood clustering approach implemented in the ADMIXTURE software v1.3.0 (Alexander et al., 2009), with *K* values ranging from 2 to 4.

### 2.3 | Identifying selection signatures

In this study, we used two statistical approaches designed to quantify the excess of haplotype homozygosity within (iHS) or among groups (Rsb) and the analysis of consecutive regions of homozygosity (ROH islands).

### 2.3.1 iHS and Rsb approaches

The two EHH-based metrics were computed within 1.5-Mb sliding windows with 50-kb overlapping step using the *rehh* package v. 3.2.2 in R (Gautier & Vitalis, 2012). Haplotypes were reconstructed from the SNP data using fastPHASE v. 1.4 (Scheet & Stephens, 2006).

For each SNP, iHS and Rsb tests are constructed to have an approximately standard Gaussian distribution (Tang et al., 2007; Voight et al., 2006). The scores, calculated for each SNP, were transformed into *p*-values using the *rehh* 

package (Gautier & Vitalis, 2012). Candidate regions were then defined by the windows containing at least three neighbouring SNPs with a-log10(p-value)>=2.5. We have chosen to focus on clusters of neighbouring SNPs because it has been demonstrated that it is more powerful to look for windows of consecutive SNPs that contain numerous extreme scores rather than treating each SNP separately (Voight et al., 2006).

## 2.3.2 | Runs of homozygosity islands

Runs of homozygosity were investigated using PLINK 1.7 (Purcell et al., 2007). The minimum length that constituted the ROH was set to 1 Mb. The following criteria were also used: (i) one missing and one possible heterozygous genotype were allowed in the ROH; (ii) the minimum number of SNPs that constituted the ROH was set to 30; (iii) the minimum SNP density per ROH was set to one SNP every 100 kb; (iv) the maximum gap allowed between consecutive homozygous SNPs was 1000 kb. The percentage of SNP within an ROH was calculated by counting the number of times each SNP was in an ROH and by dividing that number by the number of animals in each group, thus obtaining homozygosity estimates per locus. To identify ROH islands, the top 0.2% SNPs were selected. Finally, the inbreeding coefficient (F) based on ROH  $(F_{ROH})$  for each animal was also estimated as follows:

$$F_{\text{ROH}} = L_{\text{ROH}} / L_{\text{aut}}$$

where  $L_{\rm ROH}$  is the total length of all ROHs in the genome of an individual and  $L_{\rm aut}$  is the specified length of the autosomal genome covered by SNPs on the chip array (2452.06 Mb).

### 2.4 Gene annotation

Annotated genes within the identified genomic regions were obtained from Genome Data Viewer provided by the National Center for Biotechnology Information (NCBI) using the ovine assembly OAR\_v4.0. Gene Ontology (GO) and the enrichment analysis of annotated genes identified by at least two approaches (Table 1) were conducted using the open-source Database for Annotation, Visualization, and Integrated Discovery ver. 2021 package (https://david-d.ncifcrf.gov), imposing a *p*-value <0.05. The associated QTLs were investigated using the animal QTL database (QTLdb; https://www.animalgenome.org/cgi-bin/QTLdb/index). Finally, we conducted a comprehensive literature search to investigate the biological function and the phenotypes that are known to be affected by each annotated gene.

### 3 | RESULTS

## 3.1 | Population structure and inbreeding

Multidimensional scaling analysis revealed a separation between the two investigated groups along the first dimension (PC1 with 12.34% of the variance; Figure 1). In addition, the VDB-new group formed two clusters with unequal sizes. Conversely, VDB-old individuals did not form a cluster but were scattered. This distribution pattern was confirmed by the results of the Admixture analysis observed at K=2 in which VDB-old individuals are already distinguishable from their selected counterparts The increase of K at 3 and 4 highlighted the two subgroups in VDB-new sampling (Figure S1), also revealed by MDS. The ROH-based inbreeding coefficient was lower in the

**TABLE 1** Genomic regions identified by two statistical approaches in the Valle del Belice sheep.

| Test     | OAR | Star bp     | End bp      | Genes  |
|----------|-----|-------------|-------------|--|
| iHS, ROH | 4   | 99,200,128  | 103,490,698 | NUP205, SLC13A4, FAM180A, MTPN, LUZP6, CHRM2, PTN, DGKI, CREB3L2, AKR1D1, TRIM24, SVOPL, ATP6V0A4, TMEM213, KIIA1549, ZC3HAV1L, ZC3HAV1, TTC26, UBN2, KLRG2, CLEC2L, HIPK2, TBXAS1, PARP12, KDM7A, SLC37A3 |
| iHS, ROH | 4   | 104,579,997 | 104,883,987 | AGK, KIAA1147, WEE2, SSBP1, PRSS37   |
| Rsb, iHS | 4   | 104,950,000 | 106,450,000 | MGAM, MGAM2, EPHB6, TRPV6, C4H7orf34, KEL, GSTK1, CASP2, CLCN1, FAM131B, ZYX, EPHA1  |
| iHS, ROH | 11  | 20,360,396  | 21,976,316  | TAOK1, ABHD15, TP53I13, GIT1, ANKRD13B, CORO6, SSH2, EFCAB5, NSRP1, SLC6A4, BLMH, TMIGD1, CPD, GOSR1, TUSC5, BHLHA9, ABR, TIMM22, NXN, RNMTL1, GLOD4, GEMIN4, FAM57A, VPS53, FAM101B, RPH3AL               |

Abbreviation: OAR, Ovis aries chromosome number.

FIGURE 1 Genetic relationship defined with multidimensional scaling analysis between unselected (blue) and selected (red) group in Valle del Belice sheep breed. [Colour figure can be viewed at wileyonlinelibrary.com]

VDB-new group ( $F_{ROH} = 0.062 \pm 0.055$ ) than in the VDB-old group ( $F_{ROH} = 0.097 \pm 0.064$ ).

# 3.2 | Identifying selection signatures between groups using Rsb

We applied the Rsb test to detect potential selective sweeps fixed (or nearly fixed) in the VDB-new but which remain segregating in the VDB-old (or vice versa; Figure 2). In total, 115 outlier SNPs were revealed (Table S1). The approach defined a total of three candidate regions, spanning 45 known protein coding genes.

## 3.3 | Identifying selection signatures within the VDB-new group

## 3.3.1 | iHS approach

The VDB-new group showed a total of 1577 outlier SNPs, represented by the Manhattan plot in Figure 3. These outlier markers defined a total of 23 candidate genomic regions encompassing 511 known genes (Table S2). The highest number of regions identified by iHs were located on the first four chromosomes. The results also showed five strong iHS signals, defined as regions with a high number of consecutive outliers (>=10): one on OAR03 (174,300,000–181,300,000 bp), three on OAR04

(84,550,000–88,550,000 bp; 90,650,000–96,100,000 bp and 99,200,000–110,650,000 bp) and one on OAR11 (19,050, 000–23,750,000 bp; Table S2).

## 3.3.2 | Runs of homozygosity approach

A total of four genomic regions that frequently appeared within ROH were identified. Table S3 provides the chromosome, the start and end positions of ROH islands found in the VDB-new group. These regions ranged from 4.30 Mb (on OAR04) to 0.03 Mb in length (on OAR04). We identified a total of 57 known genes within the ROH islands.

# 3.4 | Congruence among selection signals

A total of four genomic regions were jointly identified by at least two statistical approaches (Table 1). Two adjacent regions on OAR04 were jointly identified by two within population approaches (iHS and ROH). The first region containing 26 genes, was ~4.3 Mb in size (at position: 99,200,128 bp-103,490,690 bp) while the second was a ~300 kb region (at position: 104,579,997–104,883,987 bp) harbouring only five genes. Another region on OAR04 (104,950,000–106,450,000 bp) containing 12 genes was identified by Rsb and iHS. It is worthy of note that the regions on OAR04 also showed the strongest signals in iHS analysis with a total of 44 SNPs above the significance threshold. Finally, iHS and ROH registered another common selection signal on OAR11 (20,360,396–21,297,316 bp) containing 26 genes.

## 3.5 | Gene identification and functional enrichment analysis

To better understand the biological implications of the selection signals, enrichment investigations were performed for annotated genes that were identified by at least two approaches. No significantly enriched annotation functions (Benjamini-corrected p-value <0.05) were observed. The search on the sheep QTLdb revealed 22 QTLs belonging to different traits (Table S4). In particular, we identified QTL associated with milk production and growth traits.

### 4 DISCUSSION

Valle del Belìce is the most reared dairy sheep in Sicily. This breed has undergone selection during the last 30 years. Such selective pressure is expected to cause

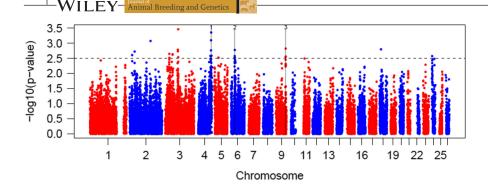
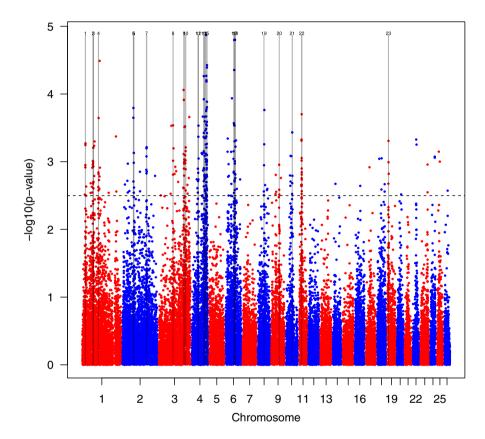


FIGURE 2 Manhattan plots of *Rsb* test in the comparison between unselected and selected groups in Valle del Belice sheep breed. [Colour figure can be viewed at wileyonlinelibrary.com]



**FIGURE 3** Manhattan plot of the genome-wide *iHS* analysis for selected group. [Colour figure can be viewed at wileyonlinelibrary.com]

changes in the genetic structure and diversity of this population. Accordingly, both aspects were recognizable in our population structure results, with VDB-new occupying a distinct space from VDB-old in MDS, having different genomic pattern in ADMIXTURE, and a different ROHbased inbreeding coefficient. Regarding this latter aspect, we found a lower F<sub>ROH</sub> value for VDB-new compared to the unselected population, which is an interesting result considering that selection often results in an inevitable increase in inbreeding. This can be explained by the widespread mating between close relatives, a typical feature of the old Sicilian farming system (Mastrangelo et al., 2014). Therefore, the lowest  $F_{ROH}$  value in VDB-new indicates that the breed has benefited from proper mating management. Likewise, the small group of VDB-new individuals revealed by MDS and ADMIXTURE is likely the result of higher levels of relatedness in this group compared to the

whole VDB-new sample. The genetic divergences among groups of the same population but undergoing different selection pressures have been already reported in cattle (Cardoso et al., 2018; Hulsegge et al., 2022). Presumably, differences in the genetic structure between groups could be driven by the combined action of selection and genetic drift (Bertolini et al., 2020).

The main aim of the present study was to investigate selection signatures linked to the production traits in Valle del Belice sheep. This was performed by comparing the genomes of a group of animals subjected to a directional selection process with an unselected population, using three statistical approaches that have been successfully applied in other studies on various livestock species (e.g. Brito et al., 2017; Mastrangelo et al., 2023; Moscarelli et al., 2021; Nolte et al., 2019). Genome scans comparing breeds under artificial selection with their unselected

founder population have been previously applied in cattle (e.g. Cardoso et al., 2018; Hulsegge et al., 2022; Seo et al., 2022) and could provide valuable insight into the genes associated with the traits that have been under artificial selection. The main drawback of such strategy is the likelihood that genetic drift can lead to divergence between selected and control populations for reasons related to randomness rather than specific genes playing a role in the variability of selected traits. We believe that the population size in the present study was sufficiently large to prevent genetic drift from overriding the effect of selection for the identified loci in the VDB-new population. However, since Valle del Belìce sheep can be considered a recent population resulting from crossbreeding practices, some assumptions might be violated due to population expansion, subdivision and bottleneck; these factors, although the candidate genes were identified using different statistical methods, could lead to the identification of false positive signals.

In the present study, we found a few number of selective sweeps with the Rsb test compared to iHS (3 vs. 23, respectively) which is in line with selective pressure on beneficial alleles that is still ongoing in the VDB-new in which most of the variants under selection are still present with intermediate frequency. It is worth noting that the iHS statistic achieves its maximal power when selected alleles segregate at intermediate frequencies in the population (Zhao et al., 2015), while Rsb can detect selected alleles that have risen to near-fixation or a point of fixation in a specific population but remain polymorphic in the other population (Tang et al., 2007).

No genomic regions were jointly identified by the three statistic methods, since each approach tends to detect different signals (Liu et al., 2013), and most of the shared regions have been identified between complementary approaches (Table 1). In fact, three genomic regions detected by iHS were also located in ROH, lending further support that these regions are likely true candidates. Many studies on livestock species have shown a positive correlation between the frequency of ROH and iHS (Gautason et al., 2021; Liu et al., 2021; Mastrangelo et al., 2020; Nolte et al., 2019).

Due to the large number of genes included in the outlier windows, we chose to focus on two types of candidate regions to discuss the biological implication of our findings with regard to genes whose functions have been characterized: (i) the five candidate regions with more than 10 SNPs exceeding the significance threshold identified by iHS. This is because selective sweeps detected by iHS tend to produce clusters of extreme scores across the sweep region, while under a neutral model, extreme scores are scattered more uniformly (Voight et al., 2006) and (ii) the candidate regions jointly detected by the two methods (Table 1). The rationale is that selection signals supported across different methodologies can be interpreted as reliable signals (Saravanan et al., 2020).

We reviewed the literature to obtain a list of genes known to be associated with milk production traits included in the aforementioned candidate regions.

Three out of the five relevant candidate regions detected by iHS are located on OAR4 (Table S2). The most relevant region on this chromosome is located at position 99,200,000-110,650,000 bp with 44 SNPs exceeding the significance threshold (22% of the total number of SNPs in this region). This large region included the three signatures of selection identified on OAR04 combining the results between approaches (Table 1). The SNP with the highest p-value in this region (rs414908437,  $-\log 10(p\text{-value}) = 4.87$ , position: 103,490,698 bp) is located within SLC37A3 gene. Importantly, this SNP is located at the end of the first of the two ROHs detected on OAR4 (Table S3). SLC37A3 belongs to the SLC37 gene family, an almost unexplored group of transmembrane sugar transporters (Bartoloni & Antonarakis, 2004). The gene SLC37A1 is highly expressed in the mammary gland (Kemper et al., 2015; Raven et al., 2016). Previous studies found the SLC37A1 gene associated with several milk production traits in cattle including milk yield, fat and protein percentages (Kemper et al., 2015; Pausch et al., 2017; Raven et al., 2016). Furthermore, Sanchez et al. (2019) reported SLC37A1 associated with milk's cheese-making properties and milk mineral content in Montbéliarde cows. Another gene of interest is KDM7A, which is only 152 kb downstream of the rs414908437 SNP and is a key regulator of DGAT2 gene (Kim et al., 2021). The latter is a member of the diacylglycerol acyltransferases (DGAT), a vital group of enzymes in catalysing triacylglycerol biosynthesis. DGAT genes have been identified as functional candidate genes affecting milk production traits, especially for fat content in milk (Liu et al., 2020). The outlier window on OAR11 spans a 4.7-Mb region (from 19,050,000 to 23,750,000 bp) with more than 22% of the SNPs having p-values exceeding the significance threshold. The highest signal in this region spans from 20,360,396 to 21,680,960 bp. Within this window, there is a shared region with a ROH encompassing TAOK1, a gene modulating IgG and IgM concentration in colostrum and serum (Lin et al., 2022). Furthermore, among the cluster of outliers in this region (seven SNPs), two highly significant SNPs (rs417806498 and rs428702588) are located in SSH2, a gene that encodes a protein tyrosine phosphatase which plays a key role in the regulation of actin filaments, and that is linked to intra-muscular fat in sheep (Daetwyler et al., 2012) and height at withers in cattle (Vanvanhossou et al., 2020). This is in line with the fact that Valle del Belice sheep

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was secondarily selected for growth traits which led to the identification of candidate genes that are rather associated with such trait. The peak area on chromosome 11, at position 21,680,960 bp with a  $-\log 10$  (p-value = 3.7), is located only ~8 kb downstream of FAM57A gene. There is no clear trade-off between this gene and milk production traits although a previous study reported that FAM57A is among the genes that are related to 305 milk yield in Guzerá cattle (Paiva et al., 2020). FAM57A is rather thought to play a crucial role in spermatogenesis (Wang et al., 2016) and is among the differentially expressed genes when comparing high- and low-quality ejaculates in Australian sheep (Hodge et al., 2021). Hence, it seems likely that the selection process in the VDB breed has incidentally impacted some male reproductive traits. In line with this hypothesis, on the another candidate region on OAR4, the area bounded by the two most significant SNPs (rs401685703, -log10(pvalue)=4.26, position: 87,097,602 bp and rs398805194,  $-\log 10(p\text{-value}) = 3.92$ , position: 87,153,327 bp) encompasses two genes coding for ring finger proteins, RNF133 and RNF148, two evolutionarily conserved testis-specific E3 ubiquitin-protein ligases. At least one of these genes (RNF133) plays a critical role in sperm function during spermatogenesis in mice (Nozawa et al., 2022).

Although we have mainly focused attention on the common candidate regions identified by at least two approaches, it is important to reiterate that each method has specific features implying that non-overlapping regions of selection signatures across different methods should be treated as complementary information to better understand the different patterns of variation in a population (Santos et al., 2021). In this regard, the Rsb approach identified a region on OAR06 with well-known candidate genes. This test is suitable for detecting signatures of recent selection (Bahbahani et al., 2015; Epstein et al., 2016; Oleksyk et al., 2010), such as those present in the Valle del Belice breed. Within this region, we mapped important genes (ABCG2, PKD2, SPP1, MEPE, IBSP, LAP3, MED28, FAM184B, NCAPG, LCORL) previously reported within a QTL related to milk production traits in cattle (e.g. Olsen et al., 2008; Zhang et al., 1998) and that overlapped with a candidate genomic window for milk traits identified in a previous study in Valle del Belice sheep (Mohammadi et al., 2022). However, limited overlap was observed in the candidate genomic regions identified in the present study. This could be explained by at least two potential factors. Firstly, potential artefacts due to population stratification or cryptic relatedness could lead to spurious associations in trait-associated genetics, especially in the field of polygenic analysis (Novembre & Barton, 2018). For instance, the polygenic selection signals observed for the height GWAS meta-analysis in humans are now considered to

be partly driven by residual population structure (Berg et al., 2019; Sohail et al., 2019). Second, the selection signals detected in the present study are likely to be associated, in addition to milk production, with other traits. This is exemplified by the selection signatures on chromosomes 4 and 11 where the selection signal peaks fall within (or are close to) genes associated with growth and reproduction.

#### CONCLUSIONS 5

About three decades of artificial selection have led to a significant change in the population structure of Valle del Belice sheep. Our findings demonstrate that changes in genetic structure and diversity have occurred in the group of animals subjected to directional selection, compared with the group of old unselected animals. There were no overlapped regions jointly identified by the three statistic methods, since each approach tends to detect different signals. We found a congruence among the EHH-based methods (iHS and Rsb), but also betweeen iHS and ROH approaches. A total of four genomic regions were jointly identified by at least two statistical approaches, most of which overlapped known candidate genes. We highlighted several interesting sweeps underlying candidate genes associated with milk production, which may provide clues to potential new selection targets. Our results also show that selection in the Valle del Belice breed led to the targeting of genes associated with growth and reproductive traits. Further studies using higher-density array data, would be particularly relevant to refine and validate these candidate regions.

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#### CONFLICT OF INTEREST STATEMENT

The authors declare no conflict of interest.

### DATA AVAILABILITY STATEMENT

The data that support the findings of this study are available from the corresponding author upon reasonable request.

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