# A genome-wide scan study identifies a single nucleotide substitution in *ASIP* associated with white versus non-white coat-colour variation in sheep (*Ovis aries*)

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In sheep, coat colour (and pattern) is one of the important traits of great biological, economic and social importance. However, the genetics of sheep coat colour has not yet been fully clarified. We conducted a genome-wide association study of sheep coat colours by genotyping 47 303 single-nucleotide polymorphisms (SNPs) in the Finnsheep population in Finland. We identified 35 SNPs associated with all the coat colours studied, which cover genomic regions encompassing three known pigmentation genes (*TYRP1*, *ASIP* and *MITF*) in sheep. Eighteen of these associations were confirmed in further tests between white versus non-white individuals, but none of the 35 associations were significant in the analysis of only non-white colours. Across the tests, the s66432.1 in *ASIP* showed significant association ( $P=4.2 \times 10^{-11}$  for all the colours;  $P=2.3 \times 10^{-11}$  for white versus non-white colours) with the variation in coat colours and strong linkage disequilibrium with other significant variants surrounding the *ASIP* gene. The signals detected around the *ASIP* gene were explained by differences in white versus non-white alleles. Further, a genome scan for selection for white coat pigmentation identified a strong and striking selection signal spanning *ASIP*. Our study identified the main candidate gene for the coat colour variation between white and non-white as *ASIP*, an autosomal gene that has been directly implicated in the pathway regulating melanogenesis. Together with *ASIP*, the two other newly identified genes (*TYRP1* and *MITF*) in the Finnsheep, bordering associated SNPs, represent a new resource for enriching sheep coat-colour genetics and breeding.

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# INTRODUCTION

The physical basis of variation in coat colour (and pattern) of domestic sheep (Ovis aries) is the ratio and amount of melanin (either eumelanin or pheomelanin) pigments produced in the cells of the wool follicles and transported into hair, skin and wool (see the review by Cockett et al. (2001) and Deng et al. (2009)). Domestication has changed the morphology as well as genetics associated with variations in coat pigmentation in sheep (Kijas et al., 2012). The standard wild-type coat colour in sheep is generally a dark body with a pale belly (Sponenberg, 1997), which is relatively rare in domestic sheep. Coat colour is a key breed characteristic and economically important production trait in sheep, unlike in their wild mouflon (Ovis aries orientalis) ancestors where the lack of artificial selection for coat colour allows variants to arise and segregate (Norris and Whan, 2008). After a long-term strong artificial selection for white fibres, the phenotype of white coat colour has accumulated into a high frequency in some sheep breeds and shows a pattern of autosomal dominant inheritance (Adalsteinsson, 1970; Li et al., 2011). Sheep coat colour was considered to be a independent single locus trait and varies substantially within and across populations, from the lightest white (for example, the Royal White sheep in the United States) to the darkest brown (the Brown Mountain sheep in Switzerland) and black (for example, the Black Welsh Mountain sheep). Earlier research on sheep colour genetics progressed slowly because most ewes produce 1–2 lambs a year and classic segregation analyses were therefore not effective or concordant (Davenport, 1905; Warwick *et al.*, 1957; Adalsteinsson, 1970). Recently, application of newly developed molecular methods allowed new insights into sheep colour genetics and indicated variation at a number of main candidate genes on different chromosomes (for example, *agouti signalling protein* (*ASIP*) on *O. aries* chromosome 13 (OAR13); the candidate genes identified to date are detailed in Supplementary Table S1) implicated in sheep coat colour. The candidate genes are involved, for example, in regulating melanogenesis, coding for melanogenic enzymes, and mediating melanocyte development and migration during embryogenesis (Jackson, 1994; Slominski *et al.*, 2004; Costin and Hearing, 2007).

The Finnsheep is an ancient, short-tailed breed, with ancestries in the most original type of sheep that first immigrated into and spread from the Near-Eastern domestication centre to Europe (Chessa *et al.*, 2009). Long-term geographic and genetic isolation has left the population of Finnsheep in Finland with genetic characteristics such as a relatively limited effective population size (Ne = ca. 120; Li *et al.*, 2009), which is less than that for most modern sheep breeds (Ne > 300; Kijas *et al.*, 2012). In general, the crossbreeding has been

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used in the Finnsheep, and, thus, currently <15000 ewes and 1000 breeding rams are left in Finland (Li et al., 2009). Finnsheep have been farmed, regularly phenotyped (for example, the litter size and coat colour) and the pedigrees have been recorded. The Finnsheep population in Finland shared several features (for example, high level and wider intervals of linkage disequilibrium (LD)) in common with genetically isolated populations, making them a useful genetic resource for studies aimed at improved understanding of the genetic basis underlying complex traits, particularly for mapping recessive genes for the traits (see the reviews by Peltonen et al. (2000) and Kristiansson et al. (2008)). Strikingly, substantial substructure was detected among the Finnsheep of different colours based on microsatellite and genome-wide single-nucleotide polymorphism (SNP) analyses (for example, Tapio et al., 2003; Li et al., 2011), which may increase the chance of producing a false-negative result (type II error) in genome-wide association studies (GWAS). Nevertheless, this genetically heterogeneous population offers a unique opportunity to detect the genetic hitchhiking effect (or selection sweeps) of a favourable gene within a population (for example, Li and Merilä, 2010).

The Finnsheep breed is of multiple colours and patterns ('coat colour pattern' defines how the coat colour is distributed or concentrated on the body), which mainly include white (*ca.* 65%; see Figure 1a), grey (*ca.* 5%; the grey is the mixture of white and black hair; see Figure 1b), black (*ca.* 20%) and brown (*ca.* 9%; Puntila,

1997; Puntila et al., 1999; see Figure 1a). The coat colours and patterns (or spotting) in the Finnsheep are comparable with those in the Icelandic sheep, where three loci (the basic colour gene B, the pattern gene A and the spotting locus S) are involved in the dominant and recessively coloured coat phenotypes (for example, Adalsteinsson, 1970; Reinieri et al., 2008), while little has been understood about the molecular genetic cause of coat colour variation in the Finnsheep. In the meantime, the list of candidate genes associated with coat colour and skin pigmentation in other domestic animals and humans has been supplemented with additional inputs such as FGF5, TP53BP1, SLC24A4, OCA2 and HERC2 by using the GWAS (for example, Sulem et al., 2007; Han et al., 2008; Cadieu et al., 2009). These findings have enabled not only an increasingly detailed genetic dissection of the pigmentation and colour phenotypes but also the realization that the phenotypes could be much more complex than previously imagined and controlled by a gene network rather than single genes. Identifying the genetic determinants of coat colour in sheep is critical for improving the efficiency of artificial selection for the desired coat colour (or pattern) as well as for understanding different evolutionary dynamics (for example, directional selection and genetic drift) in shaping the phenotypic variation in farm and wild animals (see for example, Johnston et al., 2011; Gratten et al., 2012).

To date, all investigations for genes associated with sheep coat colours have used linkage (for example, Våge *et al.*, 2003; Beraldi *et al.*, 2006) and candidate gene analytic methods (for example, Loehr

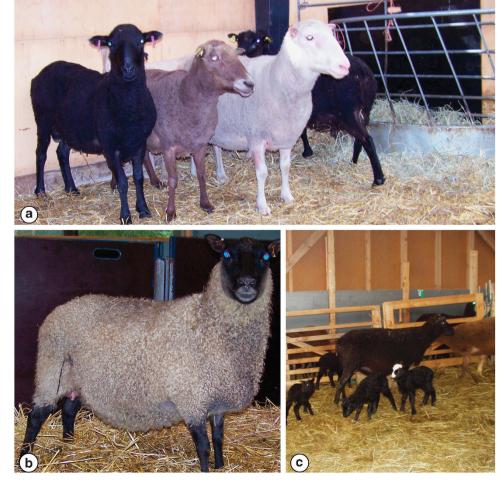


Figure 1 Coat colour and pattern polymorphism in the Finnsheep. Black (a, left), brown (a, middle), white (a, right), grey (b) and black/white spotted (c).

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*et al.*, 2008; Norris and Whan, 2008; Gratten *et al.*, 2010). Whereas linkage analysis is a useful tool for identifying rare genetic variants with relatively large phenotypic effects that follow Mendelian laws of inheritance, GWAS is the method of choice for detecting common genetic variants associated with phenotypic variation (for example, Kayser *et al.*, 2008), and a higher resolution can be achieved. We performed a GWAS in the Finnsheep in Finland, an isolated sheep population, using data on 47 303 SNPs created as part of the Sheep Hapmap project, coordinated by the International Sheep Genomics Consortium (ISGC; http://www.sheephapmap.org/hapmap.php). By performing a genome-wide selection test, we also wanted to characterize the patterns of genomic variation that artificial selection for coat colour has imparted on the genome of sheep.

# MATERIALS AND METHODS

# Animals and coat colour

We collected blood samples from 99 adult Finnsheep of different coat colours or patterns. The samples were from different flocks in order to cover as complete lineage of the Finnsheep as possible. Only the animals with detailed pedigree records and in typical coat colours of the Finnsheep have been sampled. Information on coat colour of the samples was documented and the samples were grouped into five categories of typical colours and patterns (white, grey, brown, black and black/white spotted;  $n_{white} = 54$ ,  $n_{grey} = 14$ ,  $n_{black} = 14$ ,  $n_{black/white spotted} = 1$ ; 45 males and 54 females; see Figure 1).

## DNA extraction, genotyping and quality control

We extracted the sheep genomic DNA from the whole blood using standard methods with the Puregene Blood Kit (Qiagen Nordic, Helsinki, Finland). As coordinated by the ISGC, the ovine SNP50K BeadChip genotyping of the DNA samples were carried out via the Illumina technology (Illumina, San Diego, CA, USA). Details on creation of the ovine beadchip and genotyping procedures are available in the ovine SNP50 HapMap data set (http:// www.sheephapmap.org/hapmap.php), Kijas *et al.* (2009) and Miller *et al.* (2011).

Markers were excluded based on assay abnormalities annotated by Illumina, segregation inconsistencies documented by ISGC or MAF=0. Additional standard quality control steps have been also performed. These included: exclusion of SNPs with high rates of missing alleles, with different missing genotype rates between sheep in different colours ( $\Delta P = P1-P2 > 5\%$ ; P1 and P2 are the missing genotype rates of sheep in two different colours, respectively) or the significance value from a test of Hardy–Weinberg equilibrium <0.0001. We further excluded the SNP markers with either chromosome or base-pair position within a chromosome, or both unknown; thus, 47303 SNPs were kept in the subsequent analysis.

All individuals genotyped have the call rate >98% (that is, the fraction of the number of SNPs with a genotype call per sample over the total number of SNPs on the Beadchip) with an overall value (that is, the value of call rates averaged by the total number of individuals) of 99.99%. We examined the individuals which are in discrepancy between their reported sex and the sex inferred from the X chromosome, being indicative of sample mix-ups. Further, we identify individuals closely related at the level of half-sibs or closer (for example, parent-offspring or full-sibs) and sample duplications (Li et al., 2011) using the identity-by-descent option of the PLINK programme. No case was found in the examinations of discordant gender and sample duplication. Based on results of the relatedness analysis above, one individual from each of the closely related pairs was excluded in the analysis. In the case that a single individual was involved in the indicated relatedness with several other individuals, this individual was excluded. Finally, a set of 91 samples  $(n_{\text{white}} = 50, n_{\text{grey}} = 13, n_{\text{brown}} = 14, n_{\text{black}} = 13, n_{\text{black/whitespotted}} = 1)$ was available for the analyses.

## Assessment of population stratification

We used the genomic-control (GC) method (Devlin and Roeder, 1999), which was based on a Bayesian outlier model, to adjust for population stratification in the sample. In an earlier study (for example, Li *et al.*, 2011), three subpopulations corresponding roughly to the different coat colours (grey, white and black and brown) were identified in the total of 99 Finnsheep based on the full panel of SNP markers ( $n = 49\,034$ ). A global  $F_{\rm ST} = 5.4\%$  (P < 0.05) is diagnostic of differentiation between the three coat-colour subpopulations (for example, Li *et al.*, 2011).

To account for the possibility of spurious associations caused by population stratification, the significant P-values of the following association analyses were corrected using the GC parameter,  $\lambda_{GC}$  (for example, Bacanu *et al.*, 2002). Evidence of systematic biases (see Results;  $\lambda_{GC} = 2.323$ ) was indicated in the initial analyses without adjustment for any variables. For the 47 303 SNPs in the GWAS, the distribution of observed P-values with those expected under the global null hypothesis (that is, no association between the tested SNPs and coat colours) was compared using the Q-Q plot (quantile-quantile plot). The PLINK software (Purcell et al., 2007) was applied in the approach. The GC method of correcting for population stratification is generally used within single populations. The Finnsheep studied here is a single population, but given the strong and significant population sub-structuring within the Finnsheep population in this study, we implemented the analyses again with the EIGENSTRAT method (Price et al., 2006) and the adjusted top four principal components (PCs) of genetic variation as implemented in EIGEN-SOFT (Patterson et al., 2006). This gave similar results as that with the adjustments with the GC method.

## Association, segregation model and LD analyses

For the genome-wide association (GWA) analysis of coat colour we regressed an ordinal coding for the coat colours (white = 1, grey = 2, brown = 3, black = 4 and black/white spotted = 5; for the different sheep coat colours, see Figure 1) on an ordinal coding for genotypes (0, 1 or 2 copies of the minor allele of a SNP) for SNPs individually using a linear model in the PLINK software (Purcell *et al.*, 2007). The significant *P*-values for association from the linear regression analysis were corrected for known population structure by adjusting for the first four components. An empirical *P*-value less than the stringent level of 0.01 was set for the genome-wide significance. The threshold value (nominal  $P < 2.11 \times 10^{-7} = 0.01/47303$ ; see the RESULTS) was determined by applying the Bonferroni correction accounting for multiple hypotheses testing. The Manhattan plot of  $-\log_{10}$ (observed *P*-value) from GWAS analysis was produced using the ggplot2 (Wickham, 2009) in the *R* package.

It was early evidenced that determinants of sheep coat colour may act along two phenotypic axes: white coat versus non-white coat colour. For example, alleles at the *ASIP* gene were found primarily to determine presence or absence of white coat colour (Norris and Whan, 2008). Hence, we implemented additional analyses among individuals without white coat colour and compared those with white coat coloured individuals to evaluate whether there were loci at one or both of the phenotypic axes. The ordinal coding for coat colour was regressed on counts of minor alleles after excluding whitecoated individuals and logistic regression was used to test the association between the ordinal genotype coding and binary white-coated phenotypes (white versus non-white coat colour; refer to the method in the study by Han *et al.* (2008) for details). The analyses were conducted in a categorical way with white versus non-white.

In addition, we used the  $\chi^2$  tests for goodness-of-fit to assess the dominant or recessive model of gene action as follows (Mather, 1963),

$$\chi^2 = \frac{\left(a_1 - za_2\right)^2}{zn}$$

where *z* is the expected ratio of phenotypic segregation, the observed numbers of phenotypes are  $a_1$  and  $a_2$  and *n* is the total number of observations. If the  $\chi^2$  value is <0.05, the data were not deemed to agree with the proposed segregation ratio (also refer to the study by Lambrides *et al.* (2004)). A cohort (Li *et al.*, 2011) containing parents (P1, white, genotype AG; P2, white, genotype AG) and 12 F1 offspring (white = 8 individuals (AA = 3, AG = 5); non-white = 4 individuals (GG = 4)) was included in the test.

We calculated the LD coefficients  $(r^2)$  between individual significant SNPs with  $P < 2.11 \times 10^{-7}$  and estimated the frequencies of the four possible two-SNP haplotypes. Further, we used the four-gamete rule (for example, Wang *et al.*, 2002) to identify haplotype blocks. In the four-gamete rule approach, a

recombination event is deemed to have occurred if all the four haplotypes showed a frequency of  $\ge 0.01$ . Haplotype blocks were then constituted of consecutive SNPs where only three gametes were detected. LD metrics between SNPs were from the Sheep HapMap, displayed using Haploview (v4.2) and SNAP. LD blocks were defined using the same method for defining human haploblocks used in HapMap release 27 (also refer to the studies by Gabriel *et al.* (2002) and Myers *et al.* (2007)).

## Detection of selection signals

To assess the effect of genetic selection for white (versus non-white) coat colour on the genome-wide SNPs, we used a robust Bayesian test (Beaumont and Balding, 2004) as implemented in the programme LOSITAN (http:// popgen.eu/soft/lositan/). In the programme, we applied 100 000 simulated loci, giving an expected neutral distribution of  $F_{ST}$  values and an estimate at the 0.05 significance for each SNP. Each simulation included 50 individuals per population, 2 populations, 47 303 loci and an expected  $F_{ST}$  value of 5.92%. This method detected SNPs under selection by examining the genome-wide distributions of  $F_{ST}$  values higher (positive selection) or lower (balancing selection) than expected and the significance level (P-values; Beaumont and Balding, 2004). Both 'neutral mean  $F_{ST}$ ' and 'force mean  $F_{ST}$ ' options were employed as suggested by Antao et al. (2008). In the outlier selection tests, we did the tests between the two groups of individuals (white versus non-white). We further used a five-SNP sliding window to calculate the average significance P-values across each chromosome to detect specific genomic regions putatively under strong and recent selective sweeps. The average P-values for the consecutive five SNPs were coded at a critical level of 0.05, for example if the average *P*-values for consecutive five SNPs were < 0.05, they were coded as categorical variable 1; otherwise they were coded as 0. Following this procedure, the SNP windows with significant P-values <0.05 were identified. Adjacent signatures were considered as 'genomic regions' if they included 10 consecutive windows with significant average P-values (P < 0.05).

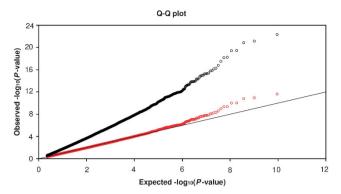
## **Bioinformatics**

As the sheep genome annotation is not yet complete (Dalrymple, 2007; Becker *et al.*, 2010), the gene annotation of the mapped interval was inferred from the corresponding human and bovine Reference Sequence (RefsSeq), both of which were converted from the UMD3 bovine genome assembly (http://www.bovinegenome.org). All the positions correspond to the Real Sheep Genomes Oar v3.1 (http://www.livestockgenomics.csiro.au/sheep/oar3.1.php). The corresponding human and bovine chromosomal segment was obtained by BLASTN searches of the ovine SNP flanking sequences on the human and bovine genome through the Real Sheep Genome Oar v3.1. In this analysis, we defined the 'targeted gene region' as being ~ 500 kb around the significant SNP (significant SNP ± 500 kb; for example, Scherag *et al.*, 2010; Hu *et al.*, 2011), and the targeted genes were searched for using a 1-Mb sliding window. Only previously reported candidate genes located in these regions and registered in the HapMap (human) and the Bovine HapMap databases were incorporated into the analysis.

# RESULTS

# Population stratification

In the initial GWAS analysis without adjusting for PCs of genetic variation, the distribution of the observed *P*-values shows evidence for systematic bias (Figure 2). The value of  $\lambda_{GC}$  is 2.323 ( $\lambda_{GC} = 2.323$ ). The systematic bias most likely resulted from confounding by the latent sub-structuring within the population (Li *et al.*, 2011). After adjusting for the first four PCs of genetic variance, the majority of the residual confounding resulting from population stratification ( $\lambda_{GC} = 1.04$  for the adjusted analyses) was removed. Further analysis by adjusting 10 PCs gave a similar  $\lambda_{GC}$  value. Therefore, all of the association results reported below are based on the analyses adjusted for the first four PCs of genetic variance.



**Figure 2** Quantile–quantile plot (Q–Q plot). Quantile–quantile plot of the  $-\log_{10}(P$ -value) from an analysis of the GWAS that did not adjust for principal components of genetic variation (black dots) and an analysis that adjusted for the four principal components (red dots).

# Association study and syntenic mapping

The thresholds of genome-wide significance at empirical levels of 5 and 1% after Bonferroni adjustment were  $1.057 \times 10^{-6}$  and  $2.11 \times 10^{-7}$ , respectively. An empirical significance level of 1% (nominal  $P < 2.11 \times 10^{-7} = 0.01/47303$ ; see Table 1) was set in order to minimize the effect of relatively small sample size. We identified significant (genome-wide  $P < 2.11 \times 10^{-7}$ ) 35 SNPs associated with the variation among all the coat colours studied. Manhattan plot of  $-\log_{10}$  (*P*-value) across the genome after the GC correction is shown in Figure 3. Of the 35 SNPs, 18 showed very significant evidence for association with coat colour when comparing the Finnsheep with white coat colour versus without (Table 1), and 25 were located in or adjacent to the five sheep coat colour-associated genes (ASIP, TYRP1, KIT, MC1R and MITF) reported previously (Table 1). In particular, our GWAS revealed multiple significant associations on chromosomes 13 (n=12), 19 (n=5) and 2 (n=4) at short intervals (<6 Mb for the associations on OAR13 and OAR19; < ca. 9 Mb for three associations on OAR2).

Syntenic mapping for the previously reported candidate genes in sheep genomic resources revealed that the significant  $(P < 2.11 \times 10^{-7})$ association for coat colour were located close to three previously known candidate genes (TYRP1, ASIP and MITF; see Supplementary Figure S1) for coat colours. All the three genes are within the intervals of the significant SNPs identified as predicated in the Real Sheep Genome Oar v3.1. The most significant SNP associations were on chromosome 19; the strongest signals were attained at OAR19\_33531771.1 and s00651.1 bordered by MITF ( $P = 6.9 \times 10^{-12}$ at 33 531 717 bp and  $P = 2.7 \times 10^{-11}$  at 38 015 761 bp; see Table 1), when the analysis was done for coat colour from white to black/white spotted (that is, all the colours). These 2, and another 16, SNPs were consistently indicated as being significantly associated with coat colour in the following white versus non-white analysis. The SNP s66432.1 in ASIP showed the strongest signal of association with the coat variation between white and non-white. Genotype frequencies of the significant SNP s66432.1 in the Finnsheep population investigated were shown in a contingency table (Supplementary Table S2). However, we did not find significant associations with coat colour from grey to black/white spotted (that is, non-white colours). The combined P-value at the identified SNPs across the three analyses varied from  $1.08 \times 10^{-12}$ to  $6.01 \times 10^{-23}$  (Table 1), with  $P = 7.95 \times 10^{-22}$  at the SNP OAR19\_33531771.1 and  $P = 4.05 \times 10^{-21}$  at the SNP s00651.1. However, notably, the significant SNPs identified were often located near

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# Table 1 Results of 35 SNPs that were associated with coat colours at genome-wide significant levels

SNP	OAR	Position (bp)	Nearby genes	Allele	MAF	Coat colour (white to black/white spotted)		Non-white coat colour (grey to black/white spotted)			White versus non-white colour			
						β	s.e.	P-value	β	s.e.	P-value	β	s.e.	P-value
OAR1_220730563.1	1	220730563	_	G/A	0.30	0.91	0.15	3.6E-08	0.55	0.17	0.002	0.32	0.08	4.8E-05
OAR2_57868140.1	2	57868140	TYRP1	A/C	0.15	1.25	0.22	1.2E-07	0.68	0.22	0.004	0.47	0.11	3.1E –05
OAR2_81901905.1	2	81901905	TYRP1	G/A	0.30	0.89	0.15	6.9E-08	-0.05	0.20	0.81	0.44	0.07	1.4E-08
OAR2_82641471_X.1	2	82641471	TYRP1	G/A	0.23	0.97	0.15	1.8E-09	0.20	0.17	0.23	0.43	0.07	1.4E-08
OAR2_90199699.1	2	90199699	TYRP1	A/G	0.46	0.92	0.12	3.8E-11	-0.43	0.20	0.04	0.357	0.06	1.9E –07
OAR3_170695071.1	3	170695071	MGF	G/A	0.31	0.88	0.15	5.5E-08	0.66	0.13	5.9E-06	0.20	0.08	0.013
OAR4_54711699.1	4	54711699		G/A	0.23	1.08	0.18	3.2E – 08	0.54	0.20	0.01	0.42	0.09	8.2E –06
OAR5_52221425.1	5	52221425	_	G/A	0.22	-1.00	0.17	2.3E –08	-0.09	0.64	0.89	-0.50	0.07	1.3E –09
OAR5_52271035.1	5	52271035	_	A/T	0.22	-1.00	0.17	2.3E –08	-0.09	0.64	0.89	-0.50	0.07	1.3E –09
OAR6_28701112.1	6	28701112	KIT	G/A	0.48	0.82	0.14	7.1E-08	-0.39	0.18	0.033	0.35	0.07	7.9E –07
	6	93607156	KIT	G/A	0.35	0.96	0.14	7.7E-10	0.05	0.21	0.83	0.52	0.06	9.4E-14
OAR6_128879011.1	6	128879011	KIT	A/G	0.16	1.19	0.19	7.4E-09	0.51	0.2	0.01	0.41	0.10	5.3E –05
OAR8 56628502.1	8	56628502	_	G/A	0.14	1.22	0.22	1.8E –07	0.60	0.21	0.006	0.38	0.11	0.001
OAR8 72809883.1	8	72809883		G/A	0.18	1.07	0.19	1.5E –07	0.62	0.18	0.001	0.31	0.10	0.002
s28942.1	13	66523604	ASIP	A/G	0.23	-0.91	0.15	2.4E-08	0.93	0.88	0.30	-0.47	0.7	4.7E-10
s29398.1	13	66544810	ASIP	G/A	0.32	-0.92	0.13	8.3E-10	-0.10	0.39	0.79	-0.46	0.06	1.2E –09
s28243.1	13	67466397	ASIP	A/G	0.34	-0.93	0.14	4.1E-09	-0.58	0.29	0.05	-0.42	0.07	1.1E –08
s31905.1	13	67503648	ASIP	G/A	0.50	-0.91	0.13	1.9E-10	-0.72	0.14	7.1E-06	-0.33	0.07	3.1E –06
s27858.1	13	67677851	ASIP	A/G	0.46	-0.77	0.13	1.2E –07	-0.05	0.23	0.82	-0.36	0.06	1.1E –07
OAR13 67687804.1	13	67687804	ASIP	A/G	0.46	-0.77	0.13	1.2E –07	-0.05	0.23	0.82	-0.36	0.06	1.1E –07
s66432.1	13	67952785	ASIP	A/G	0.41	1.01	0.16	4.2E – 11	-0.57	0.13	0.021	0.52	0.07	2.3E – 11
s13874.1	13	68624708	ASIP	C/A	0.39	-0.92	0.15	3.8E –08	-0.61	0.25	0.02	-0.40	0.08	3.1E –07
s74265.1	13	68814293	ASIP	C/A	0.38	-0.91	0.16	7.0E-08	-0.61	0.25	0.02	-0.40	0.07	5.6E –07
OAR13_70277908.1	13	70277908	ASIP	G/A	0.30	-0.85	0.15	1.1E –07	-0.11	0.34	0.76	-0.42	0.07	9.1E –09
OAR13_70823533.1	13	70823533	ASIP	G/A	0.09	1.56	0.27	1.1E –07	0.42	0.26	0.12	0.57	0.13	4.6E –05
s31687.1	13	72433327	ASIP	G/A	0.42	0.79	0.14	1.3E –07	-0.33	0.17	0.06	0.35	0.07	5.9E –07
s29148.1	14	12525704	MC1R	G/A	0.22	1.00	0.16	1.3E –08	0.45	0.16	0.01	0.37	0.08	9.5E –06
OAR19 33278780.1	19	33278780	MITF	G/A	0.22	1.07	0.15	2.0E-10	0.35	0.17	0.04	0.44	0.07	4.7E –08
OAR19_33531772.1	19	33531772	MITF	A/G	0.15	1.34	0.17	6.9E-12	0.51	0.18	6.4 E-04	0.46	0.09	1.8E-07
OAR19_34466886_X.1	19	34466887	MITF	C/A	0.25	0.95	0.16	3.2E – 08	0.02	0.20	0.93	0.43	0.08	1.1E –07
OAR19_36976172.1	19	36976172	MITF	G/A	0.27	0.92	0.15	8.6E-09	0.52	0.5	0.001	0.27	0.08	4.8E-04
s00651.1	19	38015761	MITE	G/A	0.30	1.02	0.14	2.7E – 11	0.52	0.15	0.001	0.37	0.07	1.5E –07
s70819.1	20	34499977	_	G/A	0.46	0.79	0.14	1.1E –07	0.28	0.21	0.20	0.42	0.06	4.7E-10
OARX 79152365.1	27	79152365	_	G/A	0.38	0.72	0.12	2.0E-08	-0.44	0.13	0.002	0.28	0.06	5.0E –06
DU364592_286.1	27	79173304	_	A/G	0.42	0.73		1.2E – 08	-0.21	0.16	0.20	0.34	0.05	1.5E –08

β is the regression parameter; The sample size analysed in the subsets of 'coat colour', 'non-white coat colour' and 'white versus non-white colour' are 91, 41 and 50 versus 41.

(but not in) the genes. An additional careful inspection of genes flanking the significant SNPs and database searches of presumed function in humans and sheep did not detect any novel candidate genes that were associated with coat colour or other pigmentationrelated traits.

We further inspected the SNP effects by looking at the coefficient of determination. The peak SNPs flanking the identified candidate genes explained on average ca. 31% of the phenotypic variance (from 20.3 to 37.1%). This is much higher than for the significant SNPs associated with hair colour and skin pigmentation in humans (for example, Han et al., 2008; Nan et al., 2009). We inspected genotypes of the most significant SNP s66432.1 in ASIP and found that 96% (48/50) of the Finnsheep is homozygous (A/A) in the white Finnsheep, but frequency of the homozygote (A/A) is extremely low (2%, 1/50) in the non-white Finnsheep. For the dominant or recessive model of the SNP s66432.1 in ASIP, the segregation of the F1 population gave a very good fit to a 3:1 ratio of white versus non-white ( $\chi^2 = 0.44$ ; P = 0.40-0.55), indicating a dominant effect of allele A to allele G. We also inspected genotypes of the peak SNPs neighbouring the three identified genes and found that most white Finnsheep were homozygous for the SNPs s29398.1 (G/G; 45/50, 90%) and s31905.1 (G/G; 46/50, 92%), whereas proportions of the two homozygotes were only 17.1% (7/41) for s29398.1 and 14.6% (6/41) for s31905.1 in the non-white Finnsheep.

## SNPs and genes under selection

In the analysis of global  $F_{ST}$  for 47 303 SNPs at the genome-wide level, we detected the highest selection signal on OAR13 (Figure 4) between white and non-white individuals. The highest-ranked SNP (s66432.1;  $F_{\rm ST} = 0.731$ ), which showed a single and strong selection signal, was located at the position 67.95 Mb within the ASIP gene. In sheep, the duplicated ASIP allele (s) was (were) found to account for the white and black sheep (for example, Norris and Whan, 2008; Fontanesi et al., 2011), and ASIP displayed strong evidence for positive selection in a quite recent study across a worldwide collection of breeds (Kijas et al., 2012).

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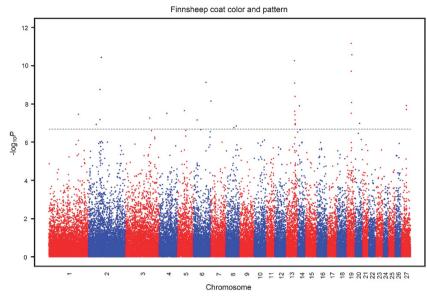


Figure 3 GWA scan for the coat colours and patterns of sheep. Negative  $log_{10}$  *P*-values by principal component analysis are shown for SNPs that passed quality control. The dashed line is the genome-wise significance threshold ( $P = 2.11 \times 10^{-7}$ ).

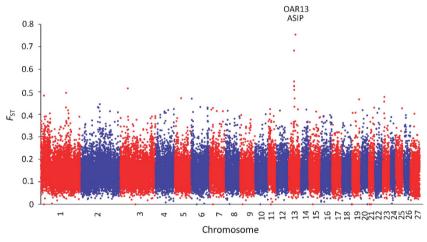


Figure 4 Selection signals in the genome of the Finnsheep. Animals in white coat colour were compared with animals in non-white coat colour (that is grey, brown, black and black/white spotted). Pairwsie  $F_{ST}$  was calculated between the two groups of Finnsheep individuals for all 47 303 SNPs. A strong selection signal was observed on the chromosome 13 above the *ASIP* gene.

A total of four genomic regions containing  $\geq 9$  consecutive significant average values <0.05 were identified to be under positive selection using the five-SNP sliding-window analysis (Table 2), whereas no region was observed with balancing selection. Signals of positive selection were identified spanning *KIT*, *MITF*, *ASIP* and *TYRP1*. The content of the genetically differentiated genomic regions will enrich the genes under directional selection, for example for the white coat colour given their roles in coat pigmentation in sheep.

# Linkage disequilibrium

Pairwise tests of LD were performed with upstream and downstream regions neighbouring the significant SNPs included. There are 12 significant SNPs ( $4.2 \times 10^{-11} < P < 1.3 \times 10^{-7}$ ) mapping to the 5.9-Mb interval at OAR13. Three discrete haplotype blocks were identified in the 5.9-Mb peak of association (see Supplementary Figure S2). *ASIP* lies within one of the associated LD blocks that

Table 2 Regions under selection in the genome of the Finnsheep in a comparison of animals in white versus non-white coat

Region	OAR	Position (Mb)	Peak SNP (P-value)	Significant SNPs (P < 0.05)	Candidate genes
1	2	85.32-85.85	0.045	9	TYRP1
2	6	76.24–76.85	0.039	10	KIT
3	13	67.05–67.99	0.004	15	ASIP
4	19	33.00–33.89	0.021	11	MITF

Abbreviation: SNP, single-nucleotide plymorphism.

contains seven significant SNPs (s28243.1, s31905.1, s27858.1, OAR13\_67687804.1, s13874.1, s66432.1 and s74265.1). Only two SNPs (s66432.1 and s12884.1) located in the inferred genomic region of *ASIP* (67.40–68.81 Mb; see Supplementary Figure S2) were

genotyped in this study. Nevertheless, the significant SNPs in the various LD blocks did not show any strong LD with the two SNPs in *ASIP*. The estimated *P*-values of s12884.1 did not reach genome-wide significance ( $P > 10^{-4}$ , data not shown) when analysis was implemented across all coat colours and patterns, while marginally significant *P*-values ( $1.1 \times 10^{-5}$  and  $3.7 \times 10^{-6}$ , respectively; data not shown) were recorded in the non-white and white versus non-white analyses.

At OAR19, five significant SNPs  $(6.9 \times 10^{-12} < P < 3.2 \times 10^{-8})$ span 4.8 Mb, with two SNPs (OAR19 33531772.1 and s00651.1) showing the most extreme significant values (Table 1). Out of the five significant SNPs, two (OAR19\_33278780.1 and OAR19\_33531772.1) are located in one LD block, which is  $\sim$  790 kb and includes *MITF* in the genomic region of 33.14–3.19 Mb (see Supplementary Figure S2). Another LD block was of  $\sim$  680 kb, but there was no significant SNP within or around it (see Supplementary Figure S2). Another region showing significant association with sheep coat colour is on chromosome 2 (OAR2). The three significant SNPs  $(3.8 \times 10^{-11})$  $< P < 1.2 \times 10^{-7}$ ) were located within a 12.14-Mb wide region. We identified four LD blocks, and none of the three significant SNPs occurred in them. The candidate gene TYRP1, covering a genomic region of ca. 20 kb from 85.49 to 85.51 Mb, is separated from the LD blocks (see Supplementary Figure S2). Unfortunately, no SNP within the candidate genes MITF and TYRP1 was genotyped in the study.

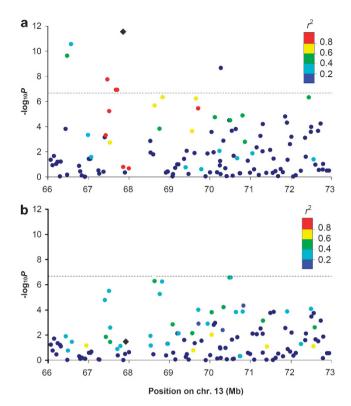
The s66432.1 SNP in the *ASIP* gene was highly associated with white versus non-white coat colour, but relatively weakly associated with other coat colour variations in the pooled analysis of all the colours (see Table 1). This SNP explained 2.3% of residual variation in coat colour from grey to black/white spotted (non-white coat colour), after controlling for the first four PCs. The index s66432.1 SNP is in significant LD ( $r^2 = 0.321-0.814$ ) with six other variants near the *ASIP* gene in the analysis of white versus non-white (Figure 5). We did not detect any significant LD when the analysis was limited to the non-white (from grey to black/white spotted) samples (Figure 5).

# DISCUSSION

Pigmentation in domestic animals like sheep (including the wild population of Soay sheep) has been long considered to be tightly regulated by genetic variations in homologous genes identified in humans and model species (for example, Klungland et al., 2000; Andersson, 2001; Cockett et al., 2001; Sturm, 2006; Gratten et al., 2012). However, candidate gene approaches that are designed according to a priori hypotheses cannot evaluate the effect of the gene in the whole-genome context, nor can they identify other genes contributing to the phenotype. In addition, very few candidate genes with common genetic variants accounting for the variation in coat colour of sheep have been identified in earlier investigations. Therefore, by employing a hypothesis-free approach we conducted a GWAS and selection test of coat colours and patterns in an isolated sheep population, the Finnsheep breed in Finland. We identified a few new variants (see Table 1) associated with variation in coat colour among the Finnsheep individuals, and in particular one variant (s66432.1) in the ASIP gene that accounts for most of the sheep coatcolour variation between white and non-white forms.

## Candidate genes associated with sheep coat colours

By carrying out a GWAS in a Finnsheep cohort, we identified up to 35 SNPs that are associated with variation among all the sheep coat colours at the genome-wide significance levels. Additionally, we detected genomic regions close to three previously identified



**Figure 5** Regional plots of the 15 identified SNPs covering the ASIP in the analysis of (a): white versus non-white and (b): only the non-white Finnsheep. Genotyped SNPs passed quality control measures in GWAS plotted with the *P*-values (as  $-\log_{10}(P\text{-value}))$  as a function of genomic position. The two SNPs genotyped in ASIP are represented by a diamond. Colour of the remaining SNP (circles) indicated LD with the two SNPs according to a scale from  $r^2 = 0$  to  $r^2 = 1$  based on pairwise  $r^2$  values.

pigmentation candidate genes (*TYRP1*, *ASIP* and *MITF*), and all three genes are involved in the classical pathways of melanogenesis. The three genomic regions explain *ca*. 22.1% of the residual variation in coat colour after correcting for the top four PCs of genetic variation, and the most substantial contribution (12.5%) was from the significant variants in and near the *ASIP* gene. The hypothesis-free study conducted reported significant SNPs in the candidate genes that could be predicted using a candidate gene approach, but additional SNPs outside the candidate genes were detected as well. These three genes were also found to be under strong selection pressure in a genome-wide selection test among sheep breeds of different coat colours (for example, Kijas *et al.*, 2012). Thus, it seems likely that along with the variation in coat colours, the allele frequency distribution of variants identified was probably driven by positive selection at certain candidate genes or genomic regions.

## ASIP as a candidate gene for white versus non-white

The *ASIP* gene encodes a secreted protein that affects the quality of hair pigmentation and has been shown to have a central role in neuroendocrine functions of melanocortin action (for example, Norris and Whan 2008). Previous studies have also identified the *ASIP* protein as a competitive antagonist of the melanocyte-associated melanocortin receptor (*MC1R*) gene, which inhibits the binding of melanocyte stimulating hormone ( $\alpha$ -*MSH*) and subsequent induction of eumelanin synthesis (Lu *et al.*, 1994; Parsons *et al.*, 1999). Increased expression of *MITF* and its activation by phosphorylation stimulate

the transcription of tyrosinase-related protein 1 (TYRP1). We detected significant LD between the variant s66432.1 and surrounding SNPs in the analysis of white versus non-white samples (Figure 5). This suggests that the signals detected on OAR13 might be due to the functional variant in the ASIP gene, which could be verified by further transcript and protein investigation. As we employed stringent significance thresholds for statistical significance, we were only able to detect common variants with large effects. However, some variants with relatively smaller effects are completely masked in the presence of others, and these variants remain to be identified. This might explain why we failed to detect genome-wide significance at the other SNP (s12884.1) in ASIP, which shows slightly lower significant values than the threshold. In addition, due to the small sample size used for the study, there is good reason to believe that a proportion of such lowfrequency variants (for example, Speliotes et al., 2010) and short insertion-deletion polymorphisms (for example, Norris and Whan, 2008) were not captured. Other genes and variants could be identified if the sample size studied could be larger and the density of the Beadchip designed could be higher, as several other GWAS of skin or hair colour phenotype in human (for example, Nan et al., 2008, 2009).

The contribution of ASIP to sheep coat colour was investigated via classic genetics from the early 1920s. The dominant white/tan (AWt) allele of ASIP was found to account for the white-wool phenotype in modern domestic sheep, whereas the most recessive allele, non-Agouti (A<sup>a</sup>), explained uniformly eumelanic (black/brown) wool (Adalsteinsson, 1970). The badgerface (A<sup>b</sup>) allele of ASIP results in a pale dorsal pheomelanic and darker ventral eumelanic pattern; the allele is recessive to AWt and dominant to Aa. The ASIP gene has been well characterized in mice and humans (for example, Wilson et al., 1995; Klungland et al., 2000), and its Bos taurus cattle homologues were identified as the genomics of B. taurus developed (for example, see the review by Lauvergne et al. (1989)). Several recognized natural patterns and many novel mutations in the ASIP gene, such as SNPs, insertion-deletion and tandem gene duplication, have been identified in mammals (for example, cattle (Dreger, 2008), dogs (Kerns et al., 2004), horses (Rieder et al., 2001), pigs (Mao et al., 2001), macaques (Nakayama et al., 2010), alpacas (Feeley et al., 2011) and rabbit (Fontanesi et al., 2010)). These include both spontaneous and induced mutations. In domestic sheep breeds, it was recently reported that a duplication of the ASIP gene that affects its expression accounts for white and black sheep (Norris and Whan, 2008). Mutations in ASIP have also been shown to be responsible for the wild-/self-type coat pattern polymorphism in Soay sheep (Gratten et al., 2010). Also, the duplicated copy allele (s) in ASIP gene was found to be associated with grey coat colour (Fontanesi et al., 2011), which could explain the observation that coat-colour variation from grey to black/white spotted (non-white coat colour) was marginally explained by SNPs in and close to the ASIP gene. In addition, recessive genetic variants at the ASIP were found to be associated with reduced lifetime fitness in a wild population of Soay sheep (Gratten et al., 2012). The most likely explanation for the significant signal at s66432.1 SNP could be that mutation in the ASIP gene affects pigmentation by interfering in the  $\alpha MSH-MC1R$  interaction, which, in turn, results in a pigment-type switch from eumelanins to pheomelanins. Nevertheless, until now, without the benefit of sheep whole-genomic data, elucidation of the molecular mechanisms of the ASIP gene regulating coat colour in domestic sheep would need additional efforts. Given that some colour and pattern alleles are known to be penetrant (for example, Eizirik et al., 2010), it would be also interesting to assess the dominant and recessive models of gene actions (for example, dominant and recessive epistasis; complementary or duplicate gene action) among the significant SNPs. However, due to the limited inheritance data among the individuals (for example, individuals from F2 and further generations) in this study (see Li *et al.*, 2011), further genetic segregation investigations on the significant SNPs identified here are necessary for understanding the inheritance of the coat colour and pattern in sheep.

# Selection signals at ASIP and the limitations

We detected the strongest selection signal in ASIP (Figure 4), a gene involved in melanocyte development across multiple mammals including sheep (see the reviews by Klungland et al. (2000) and Andersson and Georges (2004)). Earlier studies suggest that ASIP gene was targeted by man's breeding desire for favourable and consistent coat pigmentation (that is, white) in the Finnsheep (see for example, Tapio et al., 2003; Li et al., 2011). A genome-wide selection test using global  $F_{ST}$  revealed four genomic regions with evidence for positive selection (Table 2), three of which containing the KIT, ASIP and MITF candidate genes were also detected in a previous genome-wide scan for selection signal across a worldwide collection of 74 sheep populations (Kijas et al., 2012). However, it is difficult to clarify the complex links between effect of genetic selection and the phenotypic consequence (see also Kijas et al., 2012), although convincing signals were detected at the SNP s66432.1 where selection demonstrated to have taken place driven by a developed breeding objective.

In the Finnsheep population, our study revealed strong divergent selection pressures at the *ASIP* gene in different coat colours. The ubiquity of white wool in domestic sheep could be a result of the universal human preference (see also Fang *et al.*, 2009). One recent illustrative example of human preference for specific coat colour in domestic animals includes white colour in horses (Rosengren Pielberg *et al.*, 2008). Utilization of the *ASIP* gene identified here will facilitate the marker-assisted breeding for specific coat colours in sheep.

While our approaches to identify relevant genetic variants under selection are effective, there are limitations in them. Firstly, our SNP data include only a fraction of the coding portion of the sheep genome, and higher density discovery and analysis would enable further genomic approaches to relevant genetic variation under selection. Moreover, the FST-outlier approach is restricted by a few underlying assumptions regarding to the demographic and mutational models (for example, genetic drift and island model), which might not exactly reflect the true demographic history of the Finnsheep population investigated in this study. Thus, application of multiple neutrality tests, which were based on different assumptions and parameter estimation, is a practical approach to confirm the candidate status of particular loci. Only loci identified as outliers by multiple methods are considered for subsequent validation investigations (see for example, Li et al., 2010). Finally, future approaches using sets of SNPs in target candidate genes, as opposed to genome scans, may be more fruitful in identifying loci associated with specific selection and adaptation scenarios (see the reviews by Slate et al. (2010) and Staplev et al. (2010)).

It is important to also note that the sample size was relatively small in this study. However, the results of the qualitative trait GWAS demonstrated that the sample size used was sufficient to detect a major genetic effect such as that manifested at the *ASIP* locus. As reported in earlier studies of population isolates (for example, Peltonen *et al.*, 2000; Hill *et al.*, 2010), the high levels of LD in the isolated Finnsheep population are a reflection of low effective population size, which enables detection of association with smaller sample sizes. However, in the analysis of only non-white colours that include less than half of the animals, the power of the test could be relatively low, and thus contributes partly to the lack of significant associations (see for example, Han et al., 2008; Hill et al., 2010). We also noticed that the sample size is different among the subpopulations of different coat colours, particularly only a single black/white spotted sheep. Nevertheless, given the similarly small proportion of black/white spotted sheep in the total Finnsheep breed (<1%; Puntila, 1997; Puntila et al., 1999), we think it should make more sense to include the single black/white spotted sheep in the analysis than to remove it. Another potential limitation exists in the fact that historically the development and application of genome-wide SNP tools in sheep has been later than those in other major livestock like cattle and swine. As a result this has limited the ability or possibility to identify or characterize novel target genes for specific traits of interest, including the coat colour and patterns investigated in this study. For example, due to the low-resolution syntenic maps of sheep genes to human and cattle, we cannot map SNPs near or in any genes and cannot locate a variant in the functional region (intron and exon) of a candidate gene.

## Future directions and conclusions

In addition to providing new insights into the genetics and regulation of sheep coat colours and patterns, the study also raised several questions for future investigations. Sequencing of the candidate genes, ASIP in particular, in all the sheep used for the GWAS analysis would be an interesting study in the near future. This could reveal other possible causative mutation(s) behind the coat colour in the Finnsheep. As reported by Norris and Whan (2008), it could be also beneficial to genotype the duplicated ASIP alleles from the duplication 5' breakpoint. Moreover, for the SNPs not mapped to known genes, it would be interesting to clarify if they are in the vicinity of other functional elements (for example, enhancers). In addition, SNP genotyping with dense array, gene fine mapping approaches and larger sample size with similar individuals for different colours and patterns will be necessarily needed to further characterize genetic variants at or near the identified genes and to support further investigations for the genes with smaller effect that were not identified in this study. As in a GWAS some true associations might be weakly associated with the phenotype studied, replication studies (or at least one additional replicated study) in a large scale is very necessary for confirming the earlier results, otherwise some of the true associations may be missed (for example, Hunter et al., 2007; Nan et al., 2009). Thus, further large-scale replicated investigations of the strong SNP associations and of the genomic regions containing TYRP1, MITF and ASIP genes in other independent cohorts or populations are necessary for confirmation and strengthening the credibility of our findings.

To the best of our knowledge, this study is the first GWAS on a pigmentation phenotype, an economically and ecologically (for example, the coat pattern is associated with reduced lifetime fitness in a wild population of sheep; Gratten *et al.*, 2012) important trait in sheep. We provide strong evidence from a multi-stage study for *TYRP1*, *MITF* and *ASIP* genes being associated with sheep coat colours and patterns, and in particular identify a common genetic variant in *ASIP* accounting for coat-colour variation in white versus non-white. The associations near and within the *ASIP* gene and the known role of *ASIP* in melanogenesis together suggest an intriguing new insight into sheep coat pigmentation. This study therefore contributes to a long-term collective effort to identify valuable genes and mutations from the sheep genetic resources for future genetic breeding. Our study provides a novel entry point for developing genetic testing for sheep coat colours and patterns in animal breeding.

programmes. Last but not the least, the study has also yielded new insights into the evolution of complex phenotypic traits under artificial and/or natural selection in other domestic and wild animals.

## DATA ARCHIVING

Data deposited in the Dryad repository: doi:10.5061/dryad.fb6qg.

# CONFLICT OF INTEREST

The authors declare no conflict of interest.

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