

### Clusters of adaptive evolution in the human genome

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Considerable work has been devoted to identifying regions of the human genome that have been subjected to recent positive selection. Although detailed follow-up studies of putatively selected regions are critical for a deeper understanding of human evolutionary history, such studies have received comparably less attention. Recently, we have shown that ALMS1 has been the target of recent positive selection acting on standing variation in Eurasian populations. Here, we describe a careful follow-up analysis of genetic variation across the ALMS1 region, which unexpectedly revealed a cluster of substrates of positive selection. Specifically, through the analysis of SNP data from the HapMap and Human Genome Diversity Project-Centre d'Etude du Polymorphisme Humain samples as well sequence data from the region, we find compelling evidence for three independent and distinct signals of recent positive selection across this 3 Mb region surrounding ALMS1. Moreover, we analyzed the HapMap data to identify other putative clusters of independent selective events and conservatively discovered 19 additional clusters of adaptive evolution. This work has important implications for the interpretation of genome-scans for positive selection in humans and more broadly contributes to a better understanding of how recent positive selection has shaped genetic variation across the human genome.

Keywords: clustered adaptive events

#### **INTRODUCTION**

Interest in identifying regions of the human genome that have been subjected to recent positive selection has grown considerably since the availability of whole genome SNP and sequence data, resulting in large lists of candidate selection genes (Akey, 2009). Very little follow-up, however, has been conducted to explore the patterns of genetic variation at these loci in more detail and in geographically diverse populations. Recently, we described a detailed analysis of the evolutionary history of *ALMS1* variation, which has a strong signature of selection from standing variation in European and Asian populations (Scheinfeldt et al., 2009). Here, we focus on a detailed analysis of a 3-Mb region encompassing *ALMS1* that possesses patterns of variation consistent with the action of three independent selective events in human history.

In addition, we also evaluated whether the chromosome 2 cluster of positive selection was unique or if there were additional clusters of selection in the human genome. Our analysis of SNP data from the HapMap Phase II samples (International HapMap Consortium, 2005; Sabeti et al., 2007) indicates that there are indeed additional clusters of selective, and that these regions are unlikely to have arisen under a model of neutral evolution. Furthermore, several of the clusters we identified contain previously known candidate genes for selection; however, these regions have been interpreted as a single signature of selection across linked loci and possible independent selective events were not considered. Our work suggests that signatures of selection identified in genome-wide scans of selection are more complex than previously assumed, and a subset are comprised of multiple and independent selective targets. Thus, follow-up studies of genes and regions identified in genome-wide scans for positive selection are critical to foster a deeper understanding of the mechanistic basis of recent human evolutionary history.

### **MATERIALS AND METHODS**

#### SAMPLES

We sequenced approximately 6 kb of ALMS1, approximately 4 kb of GCS1, and approximately 2kb of sequence in the regions between ALMS1 and SEC15L2 and between ALMS1 and GCS1 in DNA samples from 91 individuals representing 6 human populations and 4 non-human primates that were obtained from the Coriell Institute for Medical Research Cell Repositories (Camden, NJ, USA). Coriell repository numbers for these samples are as follows: CEPH (n = 21: NA06990, NA07019, NA07348-9, NA10830-1, NA10842-5, NA10848, NA10850-4, NA10857-8, NA10860-1, NA17201), Han Chinese of L.A. (n = 21: NA17733-NA17749, NA17752–56), Middle East (*n* = 10: NA17041–50), Pygmy (*n* = 10: NA10469–73, NA10492–96), South Africa (*n* = 9: NA17341–49), South America (*n* = 10: NA17301–10), and South East Asia (n = 10: NA17081–90), gorilla (*Gorilla gorilla*; AG05251), bonobo (Pan paniscus; AG05253), chimpanzee (Pan troglodytes; AG06939), and orangutan (Pongo pygmaeus; AG12256). We acquired SEC15L2 sequence from Seattle SNPs<sup>1</sup>. Genotype data from 210 unrelated individuals were obtained from the HapMap project (Release 22 NCBI Build 36; International HapMap Consortium, 2005), and genotype data from 947 unrelated individuals were obtained from the Human Genome Diversity Project-Centre

<sup>&</sup>lt;sup>1</sup>http://pga.gs.washington.edu/

d'Etude du Polymorphisme Humain (HGDP–CEPH) Diversity Project (Li et al., 2008).

#### **DNA SEQUENCING**

We designed sequencing primers from published human sequence  $(NM\_015120)$  with primer3<sup>2</sup> for coding and non-coding regions of *ALMS1* and *GCS1* (primer sequences are available upon request). We used standard PCR-based sequencing reactions using Applied Biosystem's Big Dye sequencing protocol on an ABI 3130 × l. Sequence data was assembled using Phred/Phrap (Ewing and Green, 1998; Ewing et al., 1998), and the alignments were inspected for accuracy with Consed (Gordon et al., 1998, 2001). Polymorphisms were identified with PolyPhred 4.0 (Bhangale et al., 2006). All polymorphic sites were manually verified and confirmed by sequencing the opposite strand.

#### NEUTRALITY TESTS AND COALESCENT SIMULATIONS

We calculated three standard neutrality tests of the site frequency spectrum: Tajima's D (Tajima, 1989), Fu and Li's F test (Fu and Li, 1993), and Fay and Wu's H test (Fay and Wu, 2000). We used the non-human primate sequence to determine the ancestral allele for Fay and Wu's H test. Initially, we determined statistical significance for each statistic from 10<sup>4</sup> coalescent simulations conditional on the number of segregating sites and sample size, assuming a standard neutral model with no recombination using the program ms (Hudson, 2002). In addition, we also performed 10<sup>4</sup> coalescent simulations for additional demographic models: (1) with recombination and conditional on the number of segregating sites and sample size (2) with recombination and conditional on the observed  $\theta_W$  and sample size (3) simulations using previously inferred demographic parameters (Schaffner et al., 2005) that incorporate known features of human history such as population structure, bottlenecks, and expansions, along with recombination. An example command line argument of this more complex demographic model is:./ms 122 1 -s 4 -r 0.004 4000 -c 1.6 500 -I 3 38 42 42 -en 0.0005 1 0.24 -en 0.000875 2 0.077 -en 0.001 3 0.077 -en 0.001 2 0.0125 -en 0.001125 2 0.077 -ej 0.005 3 2 -en 0.00475 3 0.00373 -en 0.004875 3 0.077 -en 0.0085 2 0.00294 -en 0.008625 2 0.077 -ej 0.00875 2 1 -en 0.0075 1 0.03125 -en 0.007625 1 0.24 -en 0.0425 1 0.12.

To evaluate the probability of observing clusters of population specific  $F_{ST}$  as high or higher than those found in the 2p13 region under a neutral model in each of the HapMap samples, we performed 2 × 10<sup>4</sup> coalescent simulations with the program ms (Hudson, 2002) using previously inferred demographic parameters (Schaffner et al., 2005). To mimic the ascertainment of these regions based on a high population specific  $F_{ST}$  (see main text), we only accepted simulations in which the population specific  $F_{ST}$  for at least one of the simulated African, European, or Asian samples for one or more SNPs was equal to or exceeded a value of 0.56, and we then counted how many of these simulations contained one or more population specific  $F_{ST}$  values that were equal to or exceeded a value of 0.45 in the other two samples. Note, this is very conservative as the observed maximum population specific  $F_{ST}$  values in the chromosome 2p13 region are 0.74, 0.68, and 0.92 in the CEU, ASN, and YRI samples, respectively. The lower stringency thresholds were chosen for computational efficiency (i.e., to increase the number of accepted replicates) and to be applicable to all of the regions described in **Table 2**, some of which had slightly lower maximum population specific  $F_{ST}$  values compared to the chromosome 2p13 region. The ms command line argument for the model used in these simulations is:

./ms 122 1 -t 2000 -r 1000 5000000 -c 1.6 500 -I 3 38 42 42 -en 0.0005 1 0.24 -en 0.000875 2 0.077 -en 0.001 3 0.077 -en 0.001 2 0.0125 -en 0.001125 2 0.077 -ej 0.005 3 2 -en 0.00475 3 0.00373 -en 0.004875 3 0.077 -en 0.0085 2 0.00294 -en 0.008625 2 0.077 -ej 0.00875 2 1 -en 0.0075 1 0.03125 -en 0.007625 1 0.24 -en 0.0425 1 0.12.

#### **HGDP-CEPH ANALYSIS**

We used SNP data from the HGDP–CEPH samples (Li et al., 2008) and CONTML from the Phylip package (Felsenstein, 1989, 2005) to construct phylogenies rooted with chimpanzee data (UCSC). We coded each SNP within the three genes (*SEC15L2, ALMS1, GCS1*) as allele frequencies within each continental group and used the default (gene frequency) mode of CONTML to construct phylogenetic trees.

#### **GENOME-WIDE SCAN FOR ADDITIONAL CLUSTERS OF SELECTION**

We used the HapMap Phase II data (International HapMap Consortium, 2005) to search for additional putative clusters of adaptive evolution. Briefly, we segmented the autosomal data into nonoverlapping 100 kb bins, calculated population specific  $F_{ST}$  for each sample (Shriver et al., 2004), and then asked how many nonoverlapping 5 Mb regions in the genome included bins with all three population specific  $F_{ST}$  values (CEU, ASN, YRI) greater than or equal to that of the 2p13 regions (98.7th percentile).

In addition, we also analyzed gene density and average recombination rates per 5 Mb window. To accomplish this, we used the UCSC Genome Browser database (Rosenbloom et al., 2010) to compile a list of genes in each 5 Mb regions, and we used the HapMap recombination rates averaged over all samples for each 5 Mb region. We then performed a Mann–Whitney test to compare the gene density and recombination rate in the 20 regions of clustered and independent selective events with the rest of the autosomal genome.

#### RESULTS

We used SNP data from the HapMap (International HapMap Consortium, 2005) and HGDP–CEPH samples (Li et al., 2008), sequence data from the SeattleSNPs<sup>3</sup> project, and novel sequence data generated for this project to explore patterns of genetic variation at 2p13.3–2p13.1. Specifically, we studied population structure and levels of genetic variation, performed several standard tests of neutrality, and constructed phylogenies of the three regions in a worldwide sample. Our analysis identified three distinct signals of positive selection separated by two regions that exhibit no deviations from neutral expectations. Finally, we identified additional putative selective clusters of independent selective

<sup>&</sup>lt;sup>2</sup>http://frodo.wi.mit.edu/cgi-bin/primer3/primer3\_www.cgi

<sup>&</sup>lt;sup>3</sup>http://pga.gs.washington.edu/

events through genome-wide analyses of the HapMap Phase II data.

#### PATTERNS OF *F*<sub>ST</sub> AND HETEROZYGOSITY REVEAL THREE DISTINCT REGIONS AT 2P13.3–2P13.1

Our previous analysis of population structure at ALMS1 revealed extreme levels of F<sub>ST</sub> between African and non-African HapMap samples (Scheinfeldt et al., 2009). Here, we expand this analysis to include a 3-Mb region encompassing ALMS1. We analyzed SNP data from HapMap Phase II data among the following HapMap samples: Yoruba (YRI) individuals from Ibadan, Nigeria (n = 60), CEPH (CEU) individuals with ancestry from northern and western Europe (n = 60), Japanese (JPT) individuals from Tokyo, Japan (n = 45), and Han Chinese (CHB) individuals from Beijing, China (n = 45). In all of the analyses, we combined the JPT and CHB individuals into a single Asian sample (ASN). As displayed in **Figure 1**, there are three peaks of high  $F_{ST}$  in the region. The first peak (which encompasses SEC15L2) differentiates African and non-African HapMap samples, and displays extremely low heterozygosity in the ASN samples, consistent with a classic selective sweep. The second peak (which encompasses ALMS1) also differentiates African and non-African HapMap samples; however, there is only a modest decrease in heterozygosity, consistent with a model of selection acting on standing variation. And lastly, the third peak (which contains 19 refseq genes centered around *GCS1*) differentiates the CEU samples. Each of the peaks is separated by recombination hotspots suggesting individual evolutionary histories for each of the three peaks. For ease of presentation, we will refer to each of these peaks as region 1, 2, and 3 for the *SEC15L2*, *ALMS1*, and *GCS1* peaks respectively below.

# NEUTRALITY TESTS SUPPORT A MODEL OF THREE INDEPENDENT SELECTIVE EVENTS

Using sequence data from regions 1, 2, and 3 we performed three tests of positive selection on the genes central to each region (*SEC15L2, ALMS1, GCS1*): Tajima's *D* (Tajima, 1989), Fu and Li's *D* (Fu and Li, 1993), and Fay and Wu's *H* (Fay and Wu, 2000; **Table 1**). Standard site frequency spectrum statistics support a model of positive selection for *SEC15L2* in the Asian American Seattle SNPs samples (Tajima's *D*, Fu and Li's *D*, and Fay and Wu's *H* tests, p < 0.008). Similarly, standard site frequency spectrum statistics support a model of positive selection at *GCS1* in the



Table 1	Summary	statistics of	neutrality te	st statistics.
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Gene	Sample	nª	S <sup>b</sup>	ηs <sup>c</sup>	$\pi^d$	θw <sup>e</sup>	Tajima's D	Fu and Li's D	Fay and Wu's <i>H</i>
SEC15L2	African American	42	99	35	3.76	4.97	-0.86	-0.99	-5.36
	European American	42	47	9	2.49	2.36	0.23	0.37	-10.31
	Hispanic American	40	52	13	2.06	2.64	-0.78	-0.06	-11.50
	Asian American	44	27	26	0.30	1.34	-2.62*†	-5.49* <sup>§†</sup>	-12.95* <sup>§†</sup>
ALMS1	CEPH	40	19	3	10.39	7.39	1.34	0.57	-2
	Han	42	9	3	3.32	3.46	-0.12	-0.54	-0.96
	Middle East	20	15	2	9.41	6.99	1.28	0.84	-2.53
	Pygmy	20	18	6	7.15	8.39	-0.55	-0.19	-1.24
	South African	18	23	8	10.91	11.06	-0.05	-0.21	2.4
	South American	20	19	2	12.88	8.86	1.72	1.01	2.78
	Southeast Asian	20	7	3	2.03	3.26	-1.24	0.05	-0.39
GCS1	CEPH	40	4	1	1.36	2.32	-1.03 <sup>§</sup>	-2.12*†	-1.88*
	Han	42	3	1	1.18	1.72	-0.68	-0.36	-1.14
	Middle East	20	5	2	1.71	3.48	-1.55	-2.01*†	-1.35
	Pygmy	20	7	1	3.23	4.87	-1.16	-1.16	-1.63
	South African	18	4	3	1.91	2.87	-1.05	0.23	-1.17
	South American	20	4	0	2.89	2.78	0.11	-0.76	-0.05
	Southeast Asian	20	6	0	2.78	4.18	-1.11	-1.51	-0.55

<sup>a</sup>Number of chromosomes.

<sup>b</sup>Number of segregating sites.

°Number of singletons.

<sup>*d*</sup>Nucleotide diversity per base pair  $\times$  10<sup>-4</sup>.

 $^{e}\theta_{W}$  per base pair  $\times$  10<sup>-4</sup>.

p < 0.05 in simulations with recombination and conditional on the number of segregating sites.

 ${}^{s}p < 0.05$  in simulations with recombination and conditional on the observed  $\theta_{W}$ .

 $^{t}p < 0.05$  in simulations using previously inferred demographic parameters (Schaffner et al., 2005).

Values that remain significant after Bonferroni correction are highlighted in bold.

CEPH (Fu and Li's *D*, and Fay and Wu's *H* tests, p < 0.05) and to a lesser extent in the Middle Eastern samples (Fu and Li's *D* test, p < 0.05). While previous work demonstrates no deviation from neutral expectations at *ALMS1*, additional analyses support a model of positive selection from standing variation on *ALMS1* (Scheinfeldt et al., 2009). Furthermore, analysis of the sequence located between regions 1 and 2 as well as the sequence located between regions 2 and 3 show no significant deviations from neutral expectations.

#### DISTINCT PATTERNS OF WORLDWIDE VARIATION AT EACH PEAK

The geographic distribution of genetic variation across the *SEC15L2*, *ALMS1*, and *GCS1* regions shows considerable heterogeneity. As shown in **Figures 2–4**, the East Asian samples show the most dramatic changes in *SEC15L2* and *ALMS1* derived allele frequencies compared with other non-African samples. However, as we previously noted (Scheinfeldt et al., 2009), the geographic pattern of variation for *ALMS1* in the American samples is peculiar and consistent with recent selection in East Asia roughly 15 kya, while the pattern of variation at *SEC15L2* is more consistent with an older time of selection as both the American and Asian samples demonstrate high derived allele frequencies. The worldwide pattern of allele frequency variation at *GCS1* is more difficult to reconcile with a simple model of selection in European samples, but is clearly distinct from the pattern at *SEC15L2* and *ALMS1*.

To better quantify patterns of variation shown in the allele frequency maps, we performed a phylogenetic analysis of HGDP allele frequency data. Specifically, we used CONTML (Felsenstein, 1989, 2005) to construct phylogenies for each of the three genes using SNP data from the HGDP-CEPH samples (Li et al., 2008). As shown in Figure 5, the continental groups cluster differently in each phylogeny. The SEC15L2 tree displays East Asia and America clustering together at the farthest distance from the chimpanzee outgroup. The ALMS1 tree shows East Asia and Oceania clustering together at the farthest distance from the chimpanzee outgroup. Finally, the GCS1 tree shows Europe and the Middle East clustering together at the farthest distance from the chimpanzee outgroup. The phylogenetic pattern is consistent with the neutrality test results implicating East Asia as the central location of selection for SEC15L2 and ALMS1 and Europe as the central location of selection for GCS1.

## GENOME-WIDE SCAN IDENTIFIES ADDITIONAL CLUSTERS OF POSITIVE SELECTION

We next tested whether the patterns of genetic variation at 2p13.3–2p13.1 were unique or if other regions of the genome exhibited similar evidence for clustering of independent selective events. Using the population specific  $F_{\rm ST}$  thresholds (98.7th percentile) of the 2p13.3–2p13.1 region, we asked how many other 5 Mb regions of the HapMap Phase II data (International HapMap





Consortium, 2005) possess highly differentiated population specific  $F_{ST}$  values for all three samples. Our scan (**Table 2**) identified 19 additional regions that met these criteria, suggesting that additional clusters of independent substrates of positive selection exist in the human genome. As expected, gene density is significantly higher (p = 0.024, Mann–Whitney test) in windows that exhibit evidence of independent signals of selection, which likely reflects the greater mutational target size of gene dense windows for selection to act on. Moreover, we tested whether the recombination rate was different between windows with and without evidence of clustered signals of selection and found no significant difference (p = 0.338; Mann–Whitney test). This result is consistent with the observation that although there is considerable heterogeneity of fine-scale recombination rates in humans, rates over Mb intervals are much more uniform (Meyers et al., 2005).



FIGURE 4 | Distribution of GCS1 alleles in 52 populations. Haplogroup frequencies are indicated with pie charts. The ancestral allele is shown in white, and the derived allele is shown in black.



chimpanzee as the outgroup. The length of the scale bar corresponds to 1% of sites differing between haplotypes.

Table 2   Summary of additional candidate regions for ada	ptive
hotspots.	

Chr	Start (Mb)	Stop (Mb)	Notable candidates for positive selection in region
1	35	40 <sup>1,2,3,4,5</sup>	
1	50	55 <sup>1,2,4,6</sup>	
1	170	175 <sup>1,2,3,4</sup>	
2	70	75 <sup>1,2,3,4,5,6</sup>	ALMS1 <sup>1,2,4</sup>
2	95	100 <sup>1,2,3</sup>	ZAP70 <sup>2</sup>
2	105	110 <sup>1,2,3,4,5,6</sup>	EDAR <sup>1,5</sup> ; SULT1C2 <sup>3</sup>
3	190	195 <sup>1,2,4,6</sup>	
5	30	35 <sup>1,6</sup>	SLC45A2 <sup>1,5</sup> ; MATP <sup>6</sup>
6	125	130 <sup>1,2,3,4,6</sup>	
7	105	110 <sup>1,2,3,4</sup>	
7	110	115 <sup>1,2,3,4</sup>	FOXP2 <sup>7,8</sup>
9	90	95 <sup>2,4</sup>	
10	30	35 <sup>1,2,4</sup>	
11	60	65 <sup>1,2,3,4,6</sup>	VPS37C <sup>6</sup>
14	55	60 <sup>1,2</sup>	RTN1 <sup>2</sup>
15	40	45 <sup>1,2,3,6</sup>	
15	60	65 <sup>1,2,3,4,5,6</sup>	HERC <sup>5</sup>
17	50	55 <sup>1,2,4,5</sup>	RAD51C <sup>2</sup>
17	60	65 <sup>1,2,3,4,5,6</sup>	
20	20	25 <sup>1,2,6</sup>	XRN2 <sup>2</sup>

<sup>1</sup>Identified in Kimura et al. (2007). PLoS ONE 14, e286.

<sup>2</sup>Identified in Wang et al. (2006). PNAS 103, 135–140.

<sup>3</sup>Identified in International HapMap Consortium (2005). Nature 449, 851-861.

<sup>4</sup>Identified in Tang et al. (2007). PLoS Biol. 5, e171.

<sup>5</sup>Identified in Sabeti et al. (2007). Nature 449, 913–919.

<sup>6</sup>Identified in Williamson et al. (2007). PLoS Genet. 3, e90.

<sup>7</sup>Discussed in Enard et al. (2002). Nature 418, 869–872.

<sup>8</sup>Discussed in Zhang et al. (2002). Genetics 162, 1825–1835.

To more rigorously evaluate the evidence that clustering of population specific  $F_{ST}$  in each HapMap sample is unusual under neutrality, we performed additional coalescent simulations (using the calibrated model of human demography from Schaffner et al., 2005) that takes into account the way in which these regions were ascertained. Specifically, we initially identified the chromosome 2p13.3-2p13.1 region by observing a high population specific  $F_{ST}$  value in the ASN sample and then asked if population specific  $F_{ST}$  values in the other two HapMap samples were unusually large. Thus, to recapitulate this process we used a rejection sampling algorithm to generate simulated regions that were 5 Mb in length (with recombination), and only accepted regions where one sample possessed a large population specific  $F_{ST}$  (see Materials and Methods). Next, we estimated the proportion of accepted replicates that had large population specific FST values in all samples. In practice, we used thresholds that were less stringent than that observed in the empirical data (see Materials and Methods) for computational efficiency. Out of  $2 \times 10^4$  simulations, 5,846 were accepted and even at this reduced level of stringency none exhibited large population specific F<sub>ST</sub> values in all three samples, resulting in a conservative p-value of <0.0002. Thus, the observation of finding clusters of highly differentiated

population specific  $F_{ST}$  values in each sample is very unusual under neutrality.

#### DISCUSSION

What emerges from this analysis is a striking incidence of multiple, independent, and regionally restricted signals of positive selection in a 3-MB region on chromosome 2. Interestingly, we also identified 19 additional regions that possess similar patterns of genetic variation (Table 2) and thus may represent additional clusters of independent selective events. Included in this list are regions containing EDAR (see also Figure 6), SLC45A2, and FOXP2, all previously reported as strong candidates for recent positive selection (Enard et al., 2002; Zhang et al., 2002; Carlson et al., 2005; Kelley et al., 2006; Kimura et al., 2007; Sabeti et al., 2007). These previous analyses presented the candidates as single signals of positive selection; however, our analysis suggests that there were multiple events contributing to the signals identified through genome-wide scans for selection. For example, as displayed in Figure 6, all three HapMap samples display peaks in  $F_{ST}$  that are coincident with EDAR; however, the ASN and YRI samples each exhibit additional peaks upstream and downstream of EDAR, and these signals are separated by recombination hotspots. Thus, while previous discussion of the region has focused on EDAR (Kimura et al., 2007; Sabeti et al., 2007), our analysis indicates that this 5 Mb region contains additional substrates of positive selection.

It is interesting to consider why adaptive genetic variation might be clustered in some regions of the human genome. One hypothesis is that these regions simply possessed multiple adaptive mutations that selection was free to independently act on because of the local recombinational landscape. This idea is consistent with the observation that gene density is significantly higher in the 20 regions shown in **Table 2**, and for at least two of these regions (**Figures 1** and **6**) recombination hotspots occur between the three distinct patterns of population differentiation.

A second, non-mutually exclusive hypothesis is that clusters of independent adaptive alleles could be responding to the same selective pressure. To explore this idea, we investigated biological relationships among the genes in the 2p13.3–2p13.1 region. Interestingly, SNPs from both ALMS1 (rs7598660) and GCS1 (rs6758593) have previously been implicated in human association studies of insulin levels (Saxena et al., 2007; Scheinfeldt et al., 2009) and Type I diabetes (Wellcome Trust Case Control Consortium, 2007), respectively. Additionally, in mice SEC15L2 is present in a module of genes with strain-specific gene expression indicative of a role in liver metabolism (Keller et al., 2008). It is intriguing that all three loci have putative roles in metabolic phenotypes, and it is possible that a single selective pressure underlies the independent response to selection observed at these three loci; however, additional work is necessary to elucidate the exact function of these proteins and characterize the ways in which functional variation in the region affects phenotypic variation.

Moreover, it is important to note that even with a uniformly distributed advantageous mutation rate across the genome, clustering of independent selective events may occur depending on many parameters such as the time selective alleles arose, the mode of selection, and the timeframe over which a signature of selection persists. In this manuscript, we simply focused on how unusual



clusters of independent selective events are under neutrality. In the future, it would also be of interest to evaluate how often clustering occurs in models incorporating selection, and what

particular parameter values lead to clustering of independent

selective events. Our data clearly supports a model of non-neutral evolution at the chromosome 2p13 locus, as well as the additional 19 regions that exhibit patterns of variation similar to or more extreme than this region. However, some caution is warranted in the interpretation of multiple independent selective events because the dynamics of selection acting in the milieu of a complex demographic process could conceivably generate unexpected and difficult to predict patterns of genetic variation within and between populations. Although additional theoretical and simulation studies on the interaction of selection and demography over a range of selective models and demographic processes is important, the simplest explanation for the data presented in this paper is independent selective events in these 20 regions. Indeed, the observation of recombination hotspots coincident with changes in patterns of population differentiation (see **Figures 1** and **6**) and the incompatibility of highly differentiation clusters of population specific  $F_{ST}$  values in each HapMap samples under neutrality strongly suggests multiple and independent selective events.

In summary, while many recent scans of positive selection have resulted in extensive lists of candidate regions (Kelley et al., 2006; Voight et al., 2006; Wang et al., 2006; Zhang et al., 2006; Kimura et al., 2007; Sabeti et al., 2007; Tang et al., 2007), very little follow-up analysis has been reported. Here, we have focused on a region of chromosome 2p13 that contains three independent substrates of recent positive selection, and we have shown that additional clusters of independent selective events likely exist in the human genome. Our results demonstrate the importance of careful follow-up work to genome-wide scans for selection and offers a novel perspective on the organization of adaptive genetic variation in humans.

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