#### **DATABASES**

# PhenCode: Connecting ENCODE Data With Mutations and Phenotype

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PhenCode (Phenotypes for ENCODE; www.bx.psu.edu/phencode) is a collaborative, exploratory project to help understand phenotypes of human mutations in the context of sequence and functional data from genome projects. Currently, it connects human phenotype and clinical data in various locus-specific databases (LSDBs) with data on genome sequences, evolutionary history, and function from the ENCODE project and other resources in the UCSC Genome Browser. Initially, we focused on a few selected LSDBs covering genes encoding alpha- and beta-globins (HBA, HBB), phenylalanine hydroxylase (PAH), blood group antigens (various genes), androgen receptor (AR), cystic fibrosis transmembrane conductance regulator (CFTR), and Bruton's tyrosine kinase (BTK), but we plan to include additional loci of clinical importance, ultimately genomewide. We have also imported variant data and associated OMIM links from Swiss-Prot. Users can find interesting mutations in the UCSC Genome Browser (in a new Locus Variants track) and follow links back to the LSDBs for more detailed information. Alternatively, they can start with queries on mutations or phenotypes at an LSDB and then display the results at the Genome Browser to view complementary information such as functional data (e.g., chromatin modifications and protein binding from the ENCODE consortium), evolutionary constraint, regulatory potential, and/or any other tracks they choose. We present several examples illustrating the power of these connections for exploring phenotypes associated with functional elements, and for identifying genomic data that could help to explain clinical phenotypes. Hum Mutat 0, 1–9, 2007. Published 2007 Wiley-Liss, Inc.

KEY WORDS: ENCODE; mutations; phenotype; UCSC Genome Browser

#### INTRODUCTION

Genome browsers, such as those at the University of California, Santa Cruz (UCSC) [Kent et al., 2002] and Ensembl [Hubbard et al., 2005], provide convenient, centralized access to a wealth of genotype data, including not only sequences but also computational and experimental results in areas ranging from evolutionary history to functional studies. In particular, the ENCODE consortium [ENCODE Project Consortium, 2004], supported by the National Human Genome Research Institute, aims to identify all of the functional elements in the human genome. Results from the first phase of that project (ENCODE Project Consortium, unpublished results), covering 30 Mb of human DNA, are already in the browsers.

In contrast, detailed data on naturally-occurring human mutations and the phenotypes they cause, while obviously critical Received 14 June 2006; accepted revised manuscript 18 December 2006.

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from a health perspective, tend to be scattered among literature articles and/or locus-specific databases (LSDBs) dedicated to a gene or disease [Cotton et al., 1998]. These databases, while in many cases offering excellent in-depth coverage of clinical issues relating to observed mutations in their particular loci, generally do not provide an easy way to compare these data with the kinds of genotypic and functional data available at the browsers, or with similar phenotypes associated with mutations at other loci.

The PhenCode project (Phenotypes for ENCODE; www.bx.psu. edu/phencode) aims to remedy this situation by connecting these complementary data sources so users can easily navigate between them and compare their contents. This work describes the project to connect LSDBs to the UCSC Genome Browser, efforts to collect information on protein-altering variants genome-wide, and examples of the benefits of integrating the information on mutations with the functional data from ENCODE to achieve new insights into disease processes.

#### **WEBSITES**

Key websites and databases mentioned in this article are listed in Table 1.

#### **METHODS**

PhenCode is not a new database of mutations. Rather it consists of new connections between the LSDBs and the UCSC Genome Browser. The LSDB data is analyzed by a series of scripts, and converted into several tables in the UCSC MySQL databases. The main table is in a variant of the browser extensible data (BED) format. This allows quick drawing of the regions in the main display, and filtering of what is drawn. A set of entity relationship (ER) tables stores most of the attributes that are displayed on the details page. Special cases are made for outside links, to allow more functionality. Using the ER-style tables allows flexibility in what is stored for each mutation and is easily adapted to changes in this data. The current schema can be viewed by clicking the "View table schema" link on the details page. It can also be viewed on the UCSC Table Browser, and a detailed example of doing this is provided on the frequently asked questions (FAQ) page for PhenCode. All of these tables are reloaded regularly from the LSDB sources to incorporate updates from the LSDB curators. We have also added a small amount to the UCSC Browser code to accommodate the unique features of this data.

When adding a new LSDB, the data must be mapped onto chromosome coordinates and put into a format that can be loaded into the UCSC tables. The LSDBs are encouraged to allow links from UCSC back to the original data, and to add UCSC custom tracks as an output option to their query interfaces. The links back to the individual LSDB help users to find it easily, and the LSDB can then provide more complex querying capacity and/or more detailed data. If the LSDB provides the capacity to send query results to the Genome Browser as custom tracks, then users can combine the querying ability of the LSDB with the Browser's wide range of data.

The task of loading the LSDB data into the UCSC tables can be challenging because of variations among the LSDBs in the fields, coordinate systems, and nomenclature used, but that variability is handled by altering the conversion scripts as needed. Each LSDB records fields that are interesting for that locus. Some fields, such as nucleotide changes, amino acid changes, and phenotype, are common to nearly all of the databases, while other fields are specific to a particular database, such as "gender raised as" (ARdb), and "stability" (HbVar). For maximum utility, the common fields must be identified and pooled together in the UCSC tables (even if the LSDBs use different names for them), while preserving the flexibility to also have locus-specific fields.

Because the Genome Browser presents all information in the coordinates of a genome assembly, it is critical to convert the mutations' positions from the individual LSDB's numbering system into these genomic coordinates. Most of the LSDBs use a coordinate system that is based on either a gene or a reference sequence from GenBank. However, the numbering of the bases varies. Position "1" may be the A of the ATG, the base following the G, the transcription start site, or the first base in the GenBank file. Also, for those using coding sequence numbering, intron positions can be referred to by their+/-distance from the nearest base in an exon (the Human Genome Variation Society [HGVS] standard way), or as a direct count into the intron. Alternative splicing can also complicate this, since the splice variant must be identified. Since the reference sequences used by the LSDBs are not always exactly the same as the chromosome sequence, we use BLAT [Kent, 2002] to map the coordinates. This handles small

TABLE 1. Web Sites

Database	Website address		
ARdb	http://www.androgendb.mcgill.ca		
BGMUT	http://www.ncbi.nlm.nih.gov/projects/mhc/xslcgi.fcgi?cmd = bgmut/home		
CFMDB	http://www.genet.sickkids.on.ca/cftr		
ENCODE	http://www.genome.gov/10005107/		
Ensembl	http://www.ensembl.org		
GenPhen	http://globin.bx.psu.edu/genphen		
HbVar	http://globin.bx.psu.edu/hbvar		
HGVbase	http://hgvbase.cgb.ki.se		
HGVS	http://www.hgvs.org		
HmutDB	http://www.ebi.ac.uk/mutations/central		
IDbases	http://bioinf.uta.fi/base_root		
Mammalian Phenotype Ontology	http://www.informatics.jax.org/searches/MP_form.shtml		
OMIM	http://www.ncbi.nlm.nih.gov/omim		
PAHdb	http://www.pahdb.mcgill.ca/		
PhenCode	http://www.bx.psu.edu/phencode		
SRS	http://srs.ebi.ac.uk		
TRANSFAC	http://www.biobase.de		
UCSC Genome Browser	http://genome.ucsc.edu		
WayStation	http://www.centralmutations.org		

insertions/deletions that would cause errors if we just used a simple offset from the start point. Running BLAT on the sequence as a whole is much faster and simpler than trying to run it on each mutation separately. Most LSDBs do not provide the surrounding sequence for each mutation.

Naming systems for the mutations also vary. The HGVS has developed nomenclature standards (www.hgvs.org/mutnomen) [den Dunnen and Antonarakis, 2001, 2002] for the simple mutations like substitutions and indels, but the more complex ones, such as fusion genes, are still being worked on, and these recommendations could change as more real cases are described. Meanwhile, each research/clinical community has its own traditional naming scheme: some of these are based on the nucleotide or protein change, some on the hospital where the first case was found, others on a shorthand notation that often requires knowledge of the locus to really understand. Even those that attempt to use the HGVS standards vary slightly depending on when they began, as the standards have changed over the years. We endeavor to translate the traditional name(s) for each mutation into the HGVS standard, but still maintain the others as aliases, so that users can choose the type of name they want displayed.

Last, there is a need for standardization in describing phenotypes. Mouse and rat databases have made effective use of the Mammalian Phenotype (MP) Ontology (www.informatics.jax. org/searches/MP\_form.shtml), but this has not been used extensively for human mutations. We record the common terms but encourage curators to also provide standardized terms. Without such an ontology, situations where the same phenotype is produced by mutations in different loci become less apparent, since different terminology may be used.

The critical issues are the reference sequence, numbering system, and mutation description format. Once we have resolved these issues for a particular LSDB by careful examination of the data and consultation with its curators, we write an automated extraction script to convert the downloaded data files into a format that can be loaded into the UCSC track tables. Sample code for making these conversions is available from the PhenCode FAQ page, although the main script is usually modified for each new database. In the best case scenario this process may take only an hour. This main script calls other utility routines to do tasks that are common among all the conversions. For example, once the HGVS-style mutation name is extracted from the raw data (either directly or computed, depending on what is available at the LSDB), a utility routine then uses that to obtain chromosome coordinates for the mutation. In addition to writing the script, we also run the LSDB's reference sequence through BLAT (using the correct splice variant), and store the results for later access by the script. If some introns do not match, we augment the script with special code to handle them. The script and BLAT results embody all of the database-specific nuances necessary to import the data from a particular LSDB; once they are set up, the script can be rerun easily at any time to update the UCSC track with the latest version of the data from the LSDB curators. Currently these updates are initiated manually as needed, but in the future we plan to run them via an automated scheduler.

## RESULTS Connecting Information on Disease Variants With the UCSC Genome Browser

The PhenCode project connects LSDBs as data sources so users can easily navigate between them and compare their contents.

Working closely with the LSDB staff, we collect and assemble information about the mutations into a new track at the UCSC Genome Browser called "Locus Variants," listed in the "Phenotype and Disease Associations" section. Where possible, each mutation recorded in this track provides a link back to the corresponding entry in the LSDB, which remains responsible for maintaining and curating the underlying data. In this way, users can see all of the mutations together in one place, aligned with conservation and experimental data, yet still return to the LSDB for details on phenotype. And conversely, the LSDB can offer its users the option to view their query results in the context of other tracks at the Genome Browser, Furthermore, summary attributes stored with each mutation allow users to perform basic phenotype queries across loci (e.g., all mutations that cause anemia, regardless of gene), via the UCSC Table Browser interface [Karolchik et al., 2004]. Last, we ask LSDB curators to add to Open Regulatory Annotation (ORegAnno) [Montgomery et al., 2006] a list of regulatory regions within their loci, which is assembled into a companion track called "ORegAnno" (listed in the "Expression and Regulation" section) to help guide users when viewing the mutations.

In addition to incorporating data from LSDBs, we have also imported variant data and associated OMIM links from Swiss-Prot [Bairoch and Apweiler, 2000]. This does not have as much detail as many of the LSDBs, but has the advantage of genomewide coverage. It only includes mutations that produce protein variants, and thus omits other types such as regulatory mutations. Just as with the entries from LSDBs, users can follow links back to Swiss-Prot for more information.

The databases currently contributing to the Locus Variants track are listed in Table 2, along with the variant counts and status of links to the source. This information is routinely updated in a table located in the FAQs at the PhenCode website (www.bx.psu.edu/phencode).

## Example 1: Finding Specific Information on Mutations Starting at the Genome Browser

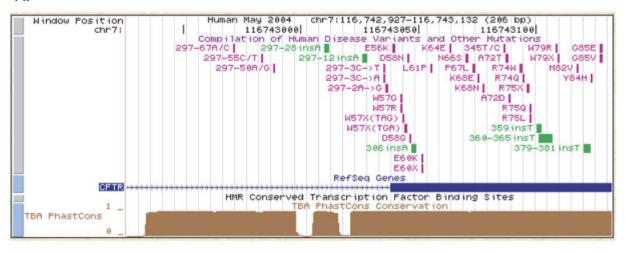
Opening the Locus Variants track at the CFTR gene shows many variants (Fig. 1A). These were obtained from CFMDB (www.genet.sickkids.on.ca/cftr), which is a frequently updated, comprehensive database of CFTR variants reported in the literature and exchanged between researchers in the Cystic Fibrosis Genetic Analysis Consortium. The CFMDB currently contains 1,448 sequence variants, most of which were detected in cystic fibrosis (CF) patients and are presumed to be disease-causing. Entries include the specific nucleotide change, its predicted consequence to the transcript and/or protein, a brief

TABLE 2. Locus-Specific Databases and Other Data Sources for the Locus Variants Track

Database	Number of variants	Number of track items	Links to source			
ARdb	329	329	No			
<b>BGMUT</b>	630	1605	Yes			
BTKbase	508	512	Yes			
CFMDB	1,400	1,400	Yes			
HbVar	1,220	1,531	Yes			
PAHdb	508	513	Yes			
SRD5A2	42	42	No			
Swiss-Prot	22,577	22,454 (hg18)	Yes			
Totals	27,212	28,382				

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A.



# B. Compilation of Human Disease Variants and Other Mutations (CFTR:c.165-28\_165-27insA) HGVS name: CFTR:c.165-28\_165-27insA Position: chr7:116743011-116743012 Band: 7q31.2 Genomic Size: 2 View DNA for this feature strand: + source: LSDB; Cystic Fibrosis Mutation Database location: intron type: insertion

Common name: 297-28insA External links: CFMDB - 36

Type of mutation: Splicing

RNA nucleotide change:

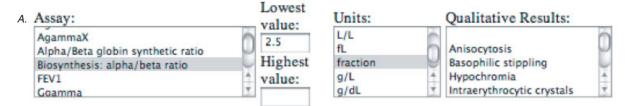
insertion of A after 297-28 Disease association:

likely to be phenotype-associ

С.			
Mutation	Details	for	297-28insA

Nucleotide Change	insertion of A after 297-28
Exon	intron 2
Consequence	mRNA splicing defect?
Original Report	This nucleotide with an insertion in intron 2 of the CFTR gene was identified by direct sequencing of exon 3. This mutation may affect splicing by aberrant lariat forming of pre-mRNA. Alternatively this insertion is just a rare (neutral) variant. CFTR-,RNA of this patient will be studied subsequently. This insertion creates an additional MseI restriction site in the exon 3 PCR product and has not been found in 50 unrelated normal individuals. The patient is of Dutch origin and another CFTR mutation has not yet been identified.
Contributors	Scheffer H, Dijkstra D-J 1993-11-29

FIGURE 1. Interesting mutations identified on the Locus Variants track can lead to insights into phenotype. **A:** UCSC Genome Browser display centered on exon 3 of the *CFTR* gene, showing a cluster of noncoding mutations in a highly conserved region of intron 2. Purple = substitution; Green = insertion. **B:** Details page for mutation c.165-28 insA, including a link to the disease-specific mutation database CFMDB. The nomenclature used on this page follows the recommendation of HGVS that base "1" corresponds to the "A" of the first codon ATG. The common names (shown on panels A and C) reflect the traditional mutation nomenclature for *CFTR*, which begins with base "1" as the start of the 5'UTR. **C:** Mutation details at the Cystic Fibrosis Mutation Database. [Color figure can be viewed in the online issue, which is available at www.interscience.wiley.com]



#### B. Genotype

date of testing	age at testing	age units	gene	allele	heterozygous/homozygous	comments	links
-	5	-	-	hg16.chr11:g.5265109_5304896del39788	=	-	HbVar ID 1058

#### Laboratory Findings

date of assay	age at assay	age units	assay	value	unit	qualitative results	comments
		-	Hb	9.8	g/dL	16	-
-	-	-	MCH	19.8	PB	#	-
-	-	-	MCV	64.5	fL		-
	un .	-	Biosynthesis: alpha/beta ratio	2.8	fraction		-
	-	-	Hb_A2	3.2	%	H.	-
	-	-	Hb_F	5.0	%		-

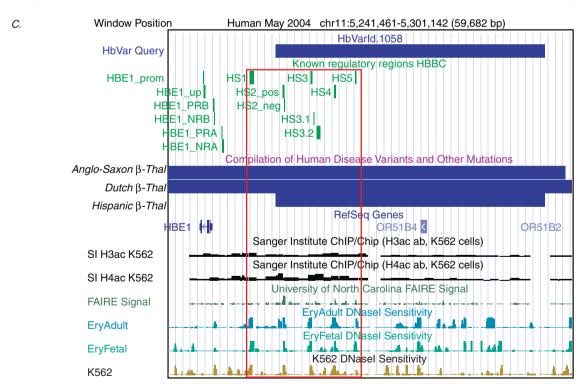


FIGURE 2. Phenotypes discovered at an LSDB can be related to mechanisms using other tracks at the UCSC Genome Browser. A: GenPhen query form. B: GenPhen details page. C: Genome Browser display showing the thalassemia deletion in comparison with ENCODE results. The locus control region is boxed in red. Long blue rectangles show the extent of the deletions, and tracks below them show RefSeq gene annotations followed by tracks from the ENCODE Project Consortium (unpublished results) displaying features associated with gene regulatory regions. The custom track of known regulatory regions in the HBB complex is from www.bx.psu.edu/~ross/dataset/ReglRegHBBhg17CusTrk.txt [King et al., 2005]. [Color figure can be viewed in the online issue, which is available at www.interscience.wiley.com]

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report of the original discovery of the mutation including brief clinical and molecular data, names of the original contributors and their institutional affiliations, any recent updates, and a reference to the original paper or personal communication describing the mutation, including an automatic PubMed search for the mutation by name.

The Genome Browser enables the user to browse for interesting mutations. For example, examining the Locus Variants track immediately upstream of CFTR exon 3 reveals a cluster of noncoding mutations (Fig. 1A). Comparison with the Conservation track shows that these intronic mutations are in a highly constrained region, as measured by the PhastCons score [Siepel et al., 2005]. Thus these mutations could be altering a function that is under intense purifying selection in mammals, perhaps a splicing enhancer, which could lead to the pathological phenotype. To investigate this further, the user clicks on one of the mutation icons in the Genome Browser window to go to a details page containing some information about the mutation (Fig. 1B). This page includes a link directly to the CFMDB entry for a more complete description and corresponding references (Fig. 1C). The description at CFMDB states that this particular variant could affect splicing or it may be a neutral variant.

#### Example 2: Using GenPhenTo Find Candidate Mutations for a Thalassemia Patient, Then Viewing Them in Register With ENCODE Functional Data at the Genome Browser

A user can start with information on mutations or patients in LSDBs and go to the Genome Browser for information that may help in understanding the phenotype. Consider a patient with anemia whose blood tests reveal an excess synthesis of alphaglobin compared to beta-globin, which is characteristic of beta-thalassemia. Suppose you are interested in the regulatory mutations that cause this, especially deletions, and in particular, you would like to see how they correspond with the experimental data on function coming from the ENCODE project. This can be accomplished by combining the query capabilities of GenPhen (http://globin.bx.psu.edu/genphen) with the Genome Browser's ability to display ENCODE data. GenPhen is a prototype database

of human hemoglobinopathy genotypes and phenotypes that records anonymized information from individual patients, including laboratory findings and clinical presentation. We begin by going to the GenPhen query form (Fig. 2A) to search for patients with a high alpha/beta ratio (greater than 2.5). This query finds six patients, one of whom has the mutation known as the "Hispanic deletion." The details page for this patient (Fig. 2B) shows that he/ she is anemic and has the diagnostic biosynthetic chain imbalance. Following the link to the corresponding mutation entry in the hemoglobin variant database (HbVar) [Hardison et al., 2002; Patrinos et al., 20041 leads to a link to the UCSC Genome Browser, with the current mutation displayed as a user track (Fig. 2C). Examination alongside several tracks of functional data (ENCODE Project Consortium, unpublished results) shows that the deleted interval overlaps DNA segments with hallmarks of gene regulatory regions, including DNase hypersensitive sites (DNaseI Sensitivity), nucleosome-depleted regions (FAIRE Signal), and histone modifications (Sanger Institute ChIP/Chip). These correspond to known cis-regulatory regions in the locus control region (LCR) [reviewed in Li et al., 2002] indicated in another custom track. These results suggest that the loss of critical LCR regions accounts for the low beta-globin production in the patient carrying the Hispanic deletion. Indeed, mapping [Driscoll et al., 1989] and analyzing [Forrester et al., 1990] this deletion provided major contributions to our understanding of the LCR [Grosveld et al., 1987; Tuan et al., 1989].

#### **Example 3: Leveraging Swiss-Prot Annotations**

Currently almost all LSDBs focus on rare mutations in single genes that cause severe disease phenotypes. However, many diseases with a genetic component involve multiple genes and less severe phenotypes, and in some cases the "disease" allele of any particular gene is relatively common. If there is evidence associating a particular region of the genome with the disease, it can be fruitful to look for SNPs in coding regions for possible candidates. In this case generally an LSDB is not available, but there may be useful mutation annotations derived from Swiss-Prot.

The APOA cluster lies within several quantitative trait loci (QTLs) for blood pressure, body weight, and rheumatoid arthritis

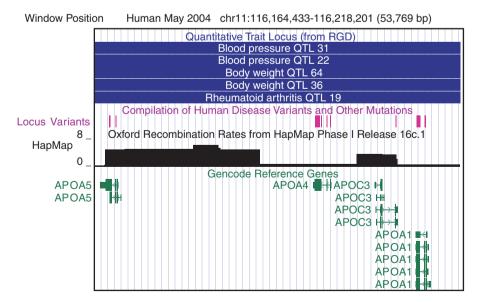
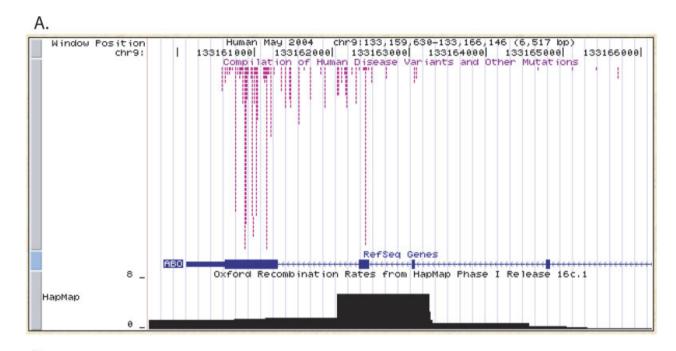


FIGURE 3. Mutations, quantitative trait loci, and recombination frequency in the APOA cluster. The default display in the UCSC Genome Browser excludes variants from Swiss-Prot, so in order to see these, users will need to uncheck the "Exclude" box for Swiss-Prot on the track settings page for Locus Variants. [Color figure can be viewed in the online issue, which is available at www.interscience.wiley.com]

identified in the rat (Fig. 3). The Locus Variants track shows that there are many nonsynonymous mutations in the cluster. Following the links back to Swiss-Prot shows that the APOA5 gene has extensive literature regarding lipid regulation that could be related to cardiovascular disease [Pennacchio et al., 2002; Vrablik et al., 2003; Kao et al., 2003]. However, association

studies for cardiovascular disease have had low power to ascribe function to individual genes due to the extensive linkage disequilibrium across the four genes in this locus [reviewed in Lai et al., 2005]. The Genome Browser view shows a region of elevated recombination rate between the APOA5 gene and the other APO genes in the locus (corroborated by Olivier et al.



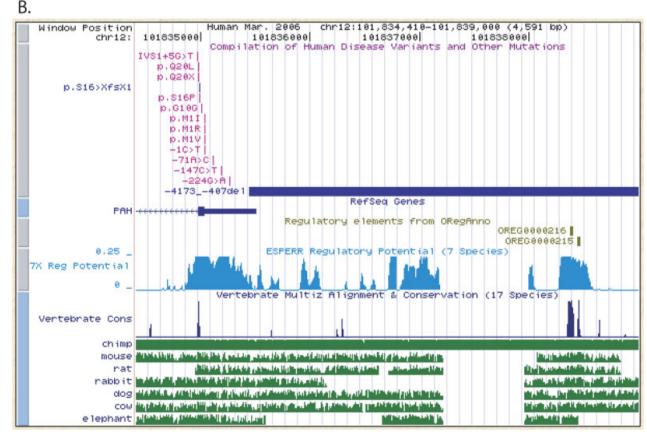


FIGURE 4. Examples of insights into phenotype gained by examining information from LSDBs along with functional information in the UCSC Genome Browser. On the Locus Variants track, purple = substitutions, blue = deletions. **A:** *ABO* recombination example. **B:** *PAH* deletion example. [Color figure can be viewed in the online issue, which is available at www.interscience.wiley.com]

[2004]). The ability of these two parts of the locus to recombine allows the disentanglement of the APOA5 gene from the rest of the locus when searching for causative elements for the QTLs.

### Example 4: The Second Phase: Extending to the Rest of the Genome

Phase 2 of the ENCODE project will extend the detailed biochemical analyses to full genome coverage. Thus, virtually all loci will be represented, and it will be important to incorporate information from all LSDBs and any available genome-wide sources, such as OMIM. The power of looking at data from LSDBs in combination with information already available throughout the human genome is illustrated in this section.

The Blood Group Antigen Gene Mutation Database (BGMUT) compiles information on variation in blood group antigens [Blumenfeld and Patnaik, 2004]. Sometimes "unresolved paternity issues" arise when a child has a different ABO phenotype from either parent. For instance, both parents may be blood group O, resulting from loss of function of the ABO gene product. However, one parent could be a compound heterozygote, and a meiotic recombination between the two homologs could restore function (e.g., giving blood group A) in one of the recombination products. The Genome Browser view reveals a hotspot for recombination (Fig. 4A) that helps to explain the appearance of unexpected blood group phenotypes.

A deficiency in phenylalanine hydroxylase, encoded by PAH, can lead to phenylketonuria or other problems with phenylalanine metabolism. Mutations in PAH and their resultant phenotypes are recorded in PAHdb [Scriver et al., 2003]. Many of these cause amino acid substitutions, but some are deletions. Examination of the Locus Variants track for the PAH locus in the Genome Browser (Fig. 4B) shows that one such deletion removes a segment of 5' flanking DNA, including a highly conserved noncoding region (Conservation track) that is annotated in the ORegAnno track as a regulatory region. Information in PAHdb shows that this region is a liver-specific enhancer of PAH expression.

#### **DISCUSSION**

A number of projects related to PhenCode are also underway. The HGVS has initiated the WayStation (www.centralmutations.org) that will serve as a central distribution point for submission of new mutations into affiliated LSDBs. The Society also is working on a central composite database to collect and store LSDB data. Coordination of efforts will provide future connections between the WayStation data and/or central repository and the Genome Browser. As is true for most LSDB-related projects, limited funding remains a fundamental problem that slows realization of the potential of this field [Patrinos and Brookes, 2005].

OMIM [Hamosh et al., 2002] provides extensive phenotype data, but it fills a different role than PhenCode. It provides users with rich, detailed information in a prose form. However, it does not use a controlled vocabulary or uniform base numbering, which impedes automated analysis. HmutDb [Lehväslaiho, 2000] is a subset of SRS [Zdobnov et al., 2002] that incorporates phenotype data, and a prototype is currently available. It provides a reference sequence for each entry but not standardized chromosome coordinates. HGVbase [Fredman et al., 2002] is planning to add phenotype data. None of these resources currently provide connections to the Genome Browser (to our knowledge). Future developments of PhenCode and these other resources should strive for coordination to optimize the utility of their information.

PhenCode provides a seamless, bidirectional connection between LSDBs and ENCODE data at the UCSC Genome Browser, which allows users to easily explore phenotypes associated with functional elements and look for genomic data that could explain clinical phenotypes, thus helping to fulfill the promise of the Human Genome Project to improve human health. Close comparison of the tracks shown in the examples provides additional insights and suggests more experiments. Thus, Phen-Code not only is helpful to clinicians for diagnostics, it also serves biomedical researchers by integrating multiple types of information and facilitating the generation of testable hypotheses to improve our understanding of both the functions of genomic DNA and the mechanisms by which it achieves those functions. Other rich data sources, such as genomewide gene expression profiles under many different conditions, are currently available for integration with the genotype and phenotype information described here. Genomewide data on sites occupied by nuclear proteins are being published, and it is reasonable to expect many more in the near future. These and other types of data provide new opportunities to better explain phenotypes. Although the challenges of formalizing descriptions of phenotypes and fully integrating disparate data types are daunting, progress in addressing the challenges will likely provide exciting new insights into genetic functions.

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