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Complementary DNA Sequencing: Expressed Sequence Tags and Human Genome Project

Mark D. Adams, Jenny M. Kelley, Jeannine D. Gocayne, Mark Dubnick, MIHAEL H. POLYMEROPOULOS, HONG XIAO, CARL R. MERRIL, ANDREW WU, BJORN OLDE, RUBEN F. MORENO, ANTHONY R. KERLAVAGE, W. Richard McCombie, J. Craig Venter*

Automated partial DNA sequencing was conducted on more than 600 randomly selected human brain complementary DNA (cDNA) clones to generate expressed sequence tags (ESTs). ESTs have applications in the discovery of new human genes, mapping of the human genome, and identification of coding regions in genomic sequences. Of the sequences generated, 337 represent new genes, including 48 with significant similarity to genes from other organisms, such as a yeast RNA polymerase II subunit; Drosophila kinesin, Notch, and Enhancer of split; and a murine tyrosine kinase receptor. Forty-six ESTs were mapped to chromosomes after amplification by the polymerase chain reaction. This fast approach to cDNA characterization will facilitate the tagging of most human genes in a few years at a fraction of the cost of complete genomic sequencing, provide new genetic markers, and serve as a resource in diverse biological research fields.

HE HUMAN GENOME IS ESTIMATED TO CONSIST OF 50,000to 100,000 genes, up to 30,000 of which may be expressed in the brain (1). However, GenBank lists the sequence of only a few thousand human genes and <200 human brain messenger RNAs (mRNAs) (2). Once dedicated human chromosome

M. D. Adams, J. M. Kelley, J. D. Gocayne, M. Dubnick, A. Wu, B. Olde, R. F. Moreno, A. R. Kerlavage, W. R. McCombie, and J. C. Venter are in the Section of Receptor Biochemistry and Molecular Biology, National Institute of Neurological Disorders and Stroke, National Institutes of Health, Bethesda, MD 20892. M. H. Polymeropoulos, H. Xiao, and C. R. Merril are in the Laboratory of Biochemical Genetics, National Institute of Mental Health, Neuroscience Center at St. Elizabeth's Hospital, Washington, DC 20032.

sequencing begins in 5 years, it is expected that 12 to 15 years will be required to complete the sequence of the genome (3). It is therefore likely that the majority of human genes will remain unknown for at least the next decade. The merits of sequencing cDNA, reverse transcribed from mRNA, as a part of the human genome project have been vigorously debated since the idea of determining the complete nucleotide sequence of humans first surfaced. Proponents of cDNA sequencing have argued that because the coding sequences of genes represent the vast majority of the information content of the genome, but only 3% of the DNA, cDNA sequencing should take precedence over genomic sequencing (4). Proponents of genomic sequencing have argued the difficulty of finding every mRNA expressed in all tissues, cell types, and developmental stages and have pointed out that much valuable information from intronic and intergenic regions, including control and regulatory sequences, will be missed by cDNA sequencing (5). However, many genome enthusiasts have incorrectly stated that gene coding regions, and therefore mRNA sequences, are readily predictable from genomic sequences and have concluded that there is no need for large-scale cDNA sequencing. In fact, prediction of transcribed regions of human genomic sequence is currently feasible only for relatively large exons (6).

On the basis of our high output with automated DNA sequence analysis of 96 templates per day and consideration of the above issues, we initiated a pilot project to test the use of partial cDNA sequences (ESTs) in a comprehensive survey of expressed genes.

Sequence-tagged sites (STSs) are becoming standard markers for the physical mapping of the human genome (7). These short sequences from physically mapped clones represent uniquely identified map positions. ESTs can serve the same purpose as the random genomic DNA STSs and provide the additional feature of pointing directly to an expressed gene. An EST is simply a segment of a sequence from a cDNA clone that corresponds to an mRNA. ESTs longer than 150 bp were found to be the most useful for similarity searches and mapping.

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^{*}To whom correspondence should be addressed.

Libraries of Complementary DNAs

Of the estimated 30,000 genes expressed in the human brain, as many as 20,000 may encode low-abundance, brain-specific transcripts (1). The fact that up to one-fourth of all genetic diseases affect neurological functions is an indication of the diversity and importance of genes expressed in the brain (8).

An assumption in our choice of cDNA libraries was that randomprimed and partial cDNA clones would be more informative in identifying genes and constructing a useful EST database than sequencing from the ends of full-length cDNAs (which contain 5' and 3' untranslated sequences) would be. By obtaining coding sequences, we hoped to take advantage of more sensitive peptide comparisons, in addition to nucleotide sequence comparisons. To discover the inherent limitations to be overcome in a large-scale cDNA sequencing project, we wanted to examine the diversity of representative cDNA libraries, identify desirable and undesirable characteristics of the libraries, and determine the information content and accuracy of single-run sequencing from both coding and flanking regions. Single-run sequencing involves performing a single sequence reaction, rather than relying on multiple, redundant reactions from each strand. We chose three commercial human brain cDNA libraries made from mRNA isolated from the hippocampus and temporal cortex of a 2-year-old female and from a fetal brain (9)

Single-run DNA sequence data were obtained from 609 randomly chosen cDNA clones (Table 1). Double-stranded cDNA clones in the pBluescript vector (Stratagene) were sequenced by a cycle sequencing protocol (10) with dye-labeled primers and 373A DNA Sequencers (Applied Biosystems). The average length of usable sequence was 397 bases with a standard deviation of 99 bases.

Subtractive hybridization has been used by researchers to reduce the population of highly represented sequences in a cDNA library (11, 12) by selectively removing sequences shared by another library. We tested subtractive hybridization as a way of enhancing the number of brain-specific clones in the hippocampus library by hybridizing the hippocampus library with a WI38 human lung fibroblast cell line cDNA library and removing the common sequences (Table 1) (12, 13).

Table 1. Composition of cDNA library determined by random clone sequencing. Each λ ZAP library (Stratagene) was converted en masse to pBluescript plasmids, transfected into *Escherichia coli* XL1-Blue (Stratagene) cells, and plated on plates with X-gal, isopropyl-1-thio-β-D-galactoside, and ampicillin. A total of 1058 clones were picked at random from three human brain cDNA libraries: fetal brain, 2-year-old hippocampus, and 2-year-old temporal cortex (9). Clones selected from the hippocampus library after subtraction with the fibroblast library are listed in the "Subtracted" column. Templates for DNA sequencing were PCR products or plasmids prepared by the alkaline lysis method. About half of the templates prepared by PCR failed to yield an amplified fragment suitable for sequencing. This was primarily due to use of PCR conditions that minimized the need for further purification of the product but selected against amplification of long inserts (5 μl of *E. coli* fresh or frozen overnight carrying the pBluescript plasmid, 7.5 μM

EST Characterization

Initially, EST sequences were examined for similarities in the GenBank nucleic acid database (14). ESTs without exact GenBank

Table 2. EST matches to human genes. Matches of at least 97% were considered to indicate that the EST corresponds directly to the human gene. Number, GenBank accession number of the matched sequence. Map positions are from (8), except where indicated. LDL, low-density lipoprotein; EST names in GenBank are the three-digit number given here preceded by "EST00."

EST	Identification	Number	Map location
001	8-Actin (cytoplasmic)	M10277	
002	B-Actin (cytoplasmic)	M10277	
003	B-Actin (cytoplasmic)	M10277	
264	Y-Actin (nonmuscle)	M24241	17p11-qter
265	Y-Actin (nonmuscle)	M24241	17p11-qter
005	CNPase	M19650	
006	CNPase	M19650	
237	ADP/ATP translocase	J03591	Xq13-q26
238	Fructose-1,6-bisphosphatase	X07292	17cen-q12
239	α-2-Macroglobulin	M11313	12p13.3-p12.3
240	α-Fodrin	M18627	9q33-34
242	α-Tubulin	K00558	‡
243	α-Tubulin	K00558	‡
004	B-Tubulin	X02344	‡
244	Amyloid A4	Y00264	21q21.3-22.05
245	Apolipoprotein J	J02908	8*
246	Breakpoint cluster region	x02596	22q11-q12
251	c-erbA-α-2	J03239	3p24.3
253	Calelectrin	J03578	
254	Calmodulin	J04046	
261	Elongation factor-1 α	X03558	‡
262	Filaggrin	M24355	1q21
263	G _S protein α subunit	X04408	20q13.2-q13.3
266	Glial fibrillary acidic protein	J04569	
268	Gln synthetase	Y00387	
280	Hexokinase	t	10p11.2
269	High-mobility group 1 protein	X12597	-
278	LDL receptor-related protein	X13916	
284	Na+,K+-ATPase α subunit	X04297	1p13-p11
285	Neurofilament light chain	X05608	8p21
288	Phosphoglycerate kinase	L00160	Xq13
362	Ret proto-oncogene	M16029	10q11.2
363	RhoB	X06820	1
366	Osteonectin	J03040	5q31-q33
367	Synaptophysin (p38)	x06389	Xp11.23-p11.22

*Indicates that the EST was mapped in this study by PCR. †The human hexokinase nucleotide sequence has been published (29) but does not appear in GenBank or EMBL. This EST was initially identified by matches to the mouse and rat nucleotide sequences and the human peptide sequence. †Mapping information on this isotype is not available.

each deoxynucleotide triphosphate, and 0.1 μM each primer for 35 cycles: 94°C, 40 s; 55°C, 40 s; 72°C, 90 s). A further percentage of the PCR-generated templates failed to sequence, largely because of primer-dimer or other amplification artifacts. Qiagen columns (Studio City, California) improved the percentage of plasmid templates that yielded usable sequences from about 60% with a standard alkaline lysis protocol to over 90%. Overall, 117 PCR-generated templates and 497 plasmid templates gave usable sequences. Dideoxy chain-termination sequencing reactions were performed with fluorescent dye-labeled M13 universal or reverse primers (Applied Biosystems). After a cycle sequencing protocol (10), carried out in a Perkin-Elmer Thermal Cycler, sequencing reactions were run on a 373A automated DNA sequencer (Applied Biosystems). Some sequencing reactions were performed on an Applied Biosystems robotic workstation (28). For each column, numbers are indicated followed by percents in parentheses.

EST category	Hippocampus	Subtracted	Fetal brain	Temporal cortex
Database match—human Mitochondrial genes Repeated sequences Ribosomal RNA Other nuclear genes Database match—other No database match Polyadenylate insert No insert	48 (12.8)	10 (8.6)	3 (7.9)	6 (7.5)
	39 (10.4)	14 (12.2)	6 (15.8)	0 (0)
	10 (2.7)	7 (6.0)	0 (0)	11 (13.8)
	32 (8.6)	7 (6.0)	4 (10.5)	0 (0)
	32 (8.6)	7 (6.0)	5 (13.2)	4 (5.0)
	160 (42.8)	44 (37.9)	20 (52.6)	6 (7.5)
	53 (14.1)	24 (20.7)	0 (0)	27 (33.7)
	1 (0.3)	3 (2.6)	0 (0)	26 (32.5)

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matches were translated in all six reading frames, and each translation was compared with the protein sequence database Protein Information Resource (PIR) and the ProSite protein motif database

Table 3. EST similarities in the GenBank and PIR databases. All significant similarities (P < 0.01) with GenBank or PIR entries are listed. Matches indicate percent identical bases for nucleotides and percent similarity (identical plus conservative substitutions) for peptides. Number indicates the accession number or locus name of the matched sequence. Abbreviations used are as follows: B, bovine; BM, Brugia malayi; BMDV, bovine mucosal disease virus; C, chicken; CE, Caenorhabditis elegans; D, Drosophila melanogaster; E, E. coli; H, human; L, lamprey; M, mouse; N, Neurospora crassa; P, pig; PP, Pseudomonas putida; PRV, Pseudorabies virus; R, rat; S, squid; T, Torpedo californica; TN, transposon Tn 4556; X, Xenopus laevis; Y, yeast; UT, untranslated; MARCKS, myristoylated alanine-rich C kinase substrate; HPRT, hypoxanthine-guanine phosphoribosyltransferase; GTP, guanosine triphosphate; LAMP, lysosomal-associated membrane protein; tRNA, transfer RNA; snRNP, small nuclear ribonucleoprotein; IGF, insulin growth factor; Mito, mitochondrial; DBP, albumin promoter D site-binding protein; and Pol, polymerase. EST names in GenBank are the three-digit number given here preceded by "EST00."

EST	Description	Length	Match	Number
	Nucleotide similarities		01 5	M24638
247	80-87 kD MARCKS (B)	277	81.5	X06088
377	Mito ATPase B subunit (B)	421	85.1	AUGUGG
248	ρ ADP-ribosyltransferase	256	80	M27278
	substrate (B)	264	71	M20571
256	Enhancer of split (D)	263	70.4	M24441
257	Kinesin (D)	435	75.4	м33874
259	Xotch (X)	495	82.3	X00734
270	B-Tubulin (H)	272	85	X15804
271	α-Actinin (H) Apolipoprotein A-I 5'-UT (H)	110	69	M20656
273	HPRT 3'-UT (H)	85	75	M26434
274		88	67	M20678
275	Kruppel-related Zn2+ fingers (H)	257	71.5	J04182
276	LAMP-1 (H)	318	89	J05224
289	Aconitase (P)	71	74	X01669
293	ras-like (*)	115	77.3	J04486
295	IGF-binding protein 5'-UT (R)	138	57	X06889
299	ras-like (R)	189	89	K02932
300	RP L30 (R)	273	90.8	X13549
301	RP S10 (R)		81	M24686
365	UT conserved sequence element (H)	85 112	64	M3027
368	Electromotor neuron protein (T)	234	80	X15243
371	Maternal G10 mRNA (X)	65	72.3	X04625
372	Catalase T (Y)	216	64.7	M33924
374	RNA Pol II 6th subunit (Y)		04.7	HJJJZ
	Peptide similaritie	62	82.3	S08341
247	80-87kD MARCKS (B)	97	92.8	500763
377	Mito ATPase & subunit (B)		89.8	A35652
249	GTP-binding protein smg p25A (B)	98	74.1	GNWVB
375	Genome polyprotein (BMDV)	27 109	78.0	A2820
250	60K filarial antigen (BM)		57.9	A3121
252	Collagen 1 (CE)	57		A2996
255	Cadherin, neuronal (C)	42	64.3	A2990
256	Enhancer of split (D)	87	78.2	A2476
259	Notch (D)	102	72.5	S0479
260	Mobilization protein MbeA (E)	47	63.8	A3504
272	Ankyrin (H)	84 89	60.7 95.5	S0550
271	α-Actinin (H)		80.0	S0656
275	Finger protein XlcGF20-1 (X)	30	79.2	S0670
279	Elongation factor Tu (*)	24 29	69.0	YRMSC
281	Monophenol monooxygenase (M)	56		A3510
282	Neurogenic receptor trkB (M)		83.4	S0433
283	Ul snRNP 70K protein (M)	59	57.6	
286	Leu-tRNA ligase (N)	48 97	58.3 79.4	A3347 S0396
287	Processing-enhancing protein (N)			A3554
289	Aconitase (P)	106	98.1	
290	Pro-rich protein (clone cP7)	56	64.3	E2537
291	NtrA (PP)	31	61.3	JG033
292	IE180 protein (PRV)	22	86.4	EDBEI
293	ras-like (*)	53	58.5	B3478
294	Alcohol sulfotransferase (R)	35	71.4	A3356 A3489
296	Transcriptional activator DBP (R)	39	74.4	MWRTS
297	Myosin heavy chain (R)	60	58.3	A3484
298	Protein-tyrosine phosphatase (R)	22	86.4	
299	ras-like (R)	55	58.2	TVHUR
300	RP L30 (R)	58	98.3	S1162 S0188
301	RP S10 (R)	67	97.0	
364	Fibrinogen γ chain (L)	35	77.1	FGLMG
257	Kinesin (S)	93	91.4	A3507
368	Electromotor neuron protein (T)	32	81.3	в3331
369	Hypothetical protein (TN)	37	64.9	JQ043
370	Various actins (*)	37	75.7	S0606
371	Maternal G10 mRNA (X)	39	94.9	S0595
373	Hypothetical protein (Y)	24	75.0	C2706
374	RNA Pol II 6th subunit (Y)	73	90.4	B3458

^{*}Matches with sequences from several organisms.

Sequence similarities identified by the BLAST programs were considered statistically significant with a Poisson P-value <0.01. The Poisson P-value is the probability of as high a score occurring by chance, given the number of residues in the query sequence and the database. After the BLASTN search, 30 unmatched ESTs were compared against GenBank by FASTA to determine if significant matches were missed because of the use of BLASTN for the database search. No additional statistically significant matches were found. Statistical significance does not necessarily mean functional similarity; some of the matches reported here may indicate the presence of a conserved domain or motif or simply a common protein structure pattern. Statistically significant matches to GenBank and PIR are reported in Tables 2 and 3. The length and percent identity or similarity of each alignment is given in Table 3 to aid in evaluation of match quality.

On the basis of database searches, the 609 EST sequences were classified into eight groups as shown in Table 1. Four groups, with 197 of the sequences (32% of the total), consist of matches to human sequences: repetitive elements, mitochondrial genes, ribosomal RNA genes, and other nuclear genes. Forty-eight of the sequences (8%) matched nonhuman entries in GenBank or PIR, whereas 230 (38%) had no significant matches. The remaining 134 (22%) sequences contained no insert between the Eco RI cloning sites or consisted entirely of polyadenylate.

Table 4. Matches to the ProSite motif database. Pattern matches from the ProSite database (except posttranslational modification sites) are shown. Abbreviations used are as follows: AA, amino acyl; HIGH, motif consensus in single-letter amino acid code (30); ILGF, insulin-like growth factor; DHFR, dihydrofolate reductase; EGF, epidermal growth factor; Gal-P-UDP, galactose-1-phosphate-uridyl; C2H2, two Cys and two His residues. EST names in GenBank are the three-digit number given here preceded by "EST00."

Motif name	EST
AA-tRNA ligase "HIGH"	094
ATP-binding site A	052,068,158,177,207,091,008,261
Carboxypeptidase/Zn2+	112
COX1	249*
Cytochrome c	060,128,120,139,279*,218,063,106
DHFR	235
Elongation factor	261
EGF	187,203
2Fe/2S Ferredoxin	067
Gal-P-UDP-transferase	101
Glycoprotein hormone	112
ILGF-binding protein	193
Leu zipper	071,072,095,055,070,106,025,200,221,
	107,102,114,131,260*,290*,291*,294*,
	164,287*,061,369*
Nuclear localization	182,020,183,214,062
Rubredoxin	226
Snake toxin	085
Zinc finger (C2H2)	188,275*

^{*}See Table 3 for ESTs with similarity to GenBank or PIR sequences.

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^{(14).} Comparisons with the ProSite motif database were done by means of the program MacPattern from the EMBL Data Library (14a). GenBank and PIR searches were conducted with our modifications of the "basic local alignment search tool" programs for nucleotide (BLASTN) and peptide (BLASTX) comparisons (15). These modifications permit many query sequences to be automatically searched in a sequential fashion. PIR searches were run on the National Center for Biotechnology Information BLAST network service. The BLAST programs contain a rapid database-searching algorithm that searches for local areas of similarity between two sequences and then extends the alignments on the basis of defined match and mismatch criteria. The algorithm does not consider the potential of gaps to improve the alignment, thus sacrificing some sensitivity for 60- to 80-fold increase in speed over other database-searching programs such as FASTA (16).

Table 5. Accuracy of single-run double-stranded automated sequencing. ESTs listed in Table 2 and those matching mitochondrial and ribosomal genes were aligned with sequences from GenBank with the GCG program BESTFIT. The first 85 nucleotides were the polylinker sequence that was not

aligned with the pBluescript SK reference sequence. Tabulation of errors began 15 bases into the BESTFIT alignment and thus is reported beginning with bases 101 to 200.

Bases from	Mismatches- ambiguities*	Ga	Gaps*		Aligned
primer		Insertions	Deletions	%	bases
101-200 201-300 301-400 >400	1.45 1.72 2.07 3.53	0.18 0.25 0.98 2.63	0.19 0.11 0.37 1.06	98.2 97.9 96.6 92.8	8800 8130 5404 3197

^{*}Error rates are reported as number of mismatches, insertions, or deletions per hundred aligned bases. "Mismatches" includes ambiguous base calls.

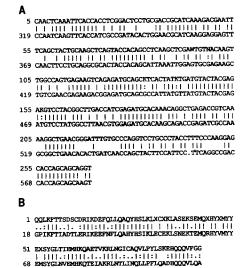
Thirty-six ESTs matched previously sequenced human nuclear genes with more than 97% identity (Table 2). Four of these ESTs were from genes encoding enzymes involved in maintaining metabolic energy, including ADP/ATP (adenosine diphosphate/adenosine triphosphate) translocase, aldolase C, hexokinase, and phosphoglycerate kinase. Human homologs of genes for the bovine mitochondrial ATP synthase F₀β subunit and porcine aconitase were also found (Table 3). Brain-specific cDNAs included synaptophysin, glial fibrillary acidic protein (GFAP), and neurofilament light chain. At least six ESTs were from genes encoding proteins involved in signal transduction: 2',3'-cyclic nucleotide 3'-phosphodiesterase (CNPase) (two ESTs), calmodulin, c-erbA-α-2, G stimulating protein (G_s) α subunit, and Na^+, K^+ -ATPase α subunit. Other ESTs were matches to genes for ubiquitous structural proteins-actins, tubulins, and fodrin (nonerythroid spectrin). Eight ESTs were from genes known to be associated with genetic disorders (8). More than half of the human-matched ESTs have been mapped to chromosomes, indicating the bias of GenBank entries toward well-studied genes and proteins.

ESTs without significant GenBank matches were also compared to the ProSite database of recognized protein motifs. Not counting posttranslational modification signatures, 54 sequences contained motifs from the database (Table 4). Some patterns are found in scores or even, as in the case of the leucine zipper, hundreds of proteins that do not share the functional property implied by the presence of the motif.

Similarities to sequences from other organisms were also detected in the BLAST searches of GenBank and PIR (Table 3). Several ESTs were similar to "housekeeping" genes, including the ribosomal proteins (RP) S10 and L30 (in the rat) and the above glycolytic enzymes. EST00257 showed strong nucleotide sequence similarity to the squid (67.4%) and *Drosophila* (70.4%) kinesin heavy chain. Kinesin was first described as a microtubule-associated motor protein involved in organelle transport in the squid giant axon (17). Six oncogene-related sequences were also among the cDNA clones sequenced. EST00299 and EST00283 showed similarity to several *ras*-related genes, and EST00248 matched the 3' untranslated region of the bovine substrate of botulinum toxin ADP-ribosyltransferase. We also observed similarities with a *Saccharomyces cerevisiae* RNA polymerase subunit and *Torpedo californica* electromotor neuron-associated protein. Two ESTs may represent new members of known human gene families: EST00270 matched the three β-tubulin genes with 88 to 91% identity and EST00271 matched α-actinin with 85% identity at the nucleotide level.

Among the most interesting of the primary sequence relationships was the similarity of ESTs to the *Drosophila* genes *Notch* and *Enhancer of split*. Nucleotide and peptide alignments of EST00256 and EST00259 with the *Drosophila* genes are shown in Fig. 1. Both genes are part of a signal cascade encoded by the "neurogenic" genes that are involved in the differentiation of neuronal and epidermal cell lineages in the neuroectoderm of the developing *Drosophila* embryo (18). It has been proposed that the *Enhancer of split* protein interacts with a membrane protein that is the product of the *Notch* gene to convert a developmental signal into an altered pattern of gene expression (18). EST00256 matched near the 5' end of the *Enhancer of split* coding sequence, away from the mammalian G protein β subunit and yeast *cdc4*-like elements (19). Part of the EST00259 match to *Notch* is in the *cdc10/SW16* region that is similar to three

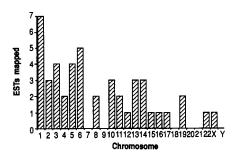
Fig. 1. Sequence alignments of ESTs with Drosophila neurogenic genes. ESTs and EST translations were aligned with nucleotide and peptide sequences of two Drosophila neurogenic genes with the GCG program BESTFIT. The peptide alignment (30) of EST00259 with the Xotch product, the Xenopus laevis homolog of Notch, is also shown. (A) EST00256 with Drosophila Enhancer of split (M20571); 69.202% identity; 1 gap. (B) EST00256 product with the product of Drosophila Enhancer of split (M20571); 72.826% similarity; 58.696% identity, 0 gaps. (C) EST00259 product with the Drosophila Notch (K03508); 60.294% similarity; 43.382% identity; 5 gaps. (D) EST00259 product with the Xenopus Xotch product (M33874); 82.143% similarity; 75.714% identity, 4 gaps. Gaps have been introduced to increase identity and similarity (indicated by dots in lines). Numbers in parentheses indicate the GenBank accession numbers. Symbols between lines: dashes indicate identity; double dots indicate a similarity score of 0.5 to 1.4; single dots represent a



similarity score of 0.1 to 0.4. Scores are from pairwise alignments based on the matrix of Schwartz and Dayhoff (31) as modified in the GCG package.

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Fig. 2. Chromosome segregation of ESTs mapped by PCR. Chromosomes and ESTs are as follows: 1 (293*, 012, 077, 058, 079, 202, 086), 2 (021, 037, 234), 3 (248*, 257*, 274*, 062), 4 (009, 038), 5 (026, 030, 104, 123), 6 (301*, 007, 219, 023, 356), 8 (245*, 223), 10 (024, 197, 131), 11



(016, 111), 12 (014), 13 (372*, 273*, 200) 14 (221, 201, 008), 15 (165), 16 (373*), 17 (068), 19 (368*, 080), and X (276*). PCR conditions were as follows: 60 ng of genomic DNA was used as a template for PCR with 80 ng of each oligonucleotide primer, 0.6 unit of Taq polymerase, and 1 μ Ci of α^{-32} P-labeled deoxycytidine triphosphate. The PCR was performed in a microplate thermocycler (Techne) under the following conditions: 30 cycles of 94°C, 1.4 min; 55°C, 2 min; and 72°C, 2 min; with a final extension at 72°C for 10 min. The amplified products were analyzed on a 6% polyacrylamide sequencing gel and visualized by autoradiography. Asterisks indicate those ESTs with similarity to GenBank or PIR sequences (Tables 2 and 3). EST names in GenBank are the three-digit number given here preceded by "EST00."

cell-cycle control genes in yeast and is tightly conserved in the Xenopus laevis Notch homolog, Xotch. In Drosophila, Enhancer of split is required for formation of epidermal tissue. Notch contains several epidermal growth factor–like repeats and appears to be involved in cell-cell communication during development (20).

Seven genes were represented by more than one EST. Comparisons of all the ESTs against one another revealed two overlaps of unknown ESTs: EST00233 and EST00234 matched in opposite orientations, and EST00235 and EST00236 matched in the same orientation beginning at the same nucleotide. Five human genes were represented by more than one EST: β -actin (three), γ -actin (two), α -tubulin (two), α -2-macroglobulin (two), and CNPase (two).

Mapping of ESTs to Human Chromosomes

We used the polymerase chain reaction (PCR) to screen a series of somatic cell hybrid cell lines containing defined sets of human chromosomes for the presence of a given EST (21). In this process, only the hybrids that contain the human gene corresponding to the EST will yield an amplified fragment. An EST is assigned to a chromosome by analysis of the segregation pattern of PCR products from hybrid DNA templates. The single human chromosome present in all hybrids that give rise to an amplified fragment is the location of the EST.

PCR mapping has been applied to 46 clones, as summarized in Fig. 2. The EST of the human gene for apolipoprotein J (also called SP-40,40 complement-associated protein and sulfated glycoprotein 2) was localized to chromosome 8. Eleven other ESTs with Gen-Bank or PIR similarities were mapped to chromosomes. Although PCR mapping of somatic cell hybrids is relatively rapid—up to three clones can be assigned per day with a single thermal cycler—it is relatively expensive, costing about ten times as much as EST sequencing. With the same oligonucleotide primers, sublocalization can be achieved with panels of fragments from specific chromosomes or pools of large genomic clones in an analogous manner. Other mapping strategies that have been proposed are multiplex in situ hybridization, prescreening with labeled flow-sorted chromosomes, and preselection by hybridization to construct chromosome specific cDNA libraries. However, these methods are limited by the purity

of the chromosome-specific material or the specific activity necessary for detection.

Automated DNA Sequencing Accuracy and GenBank Submission

ESTs that match human sequences in GenBank are excellent tools for the analysis of the accuracy of double-strand automated DNA sequencing. Ninety EST-GenBank matches were examined for the number of nucleotide mismatches and gaps required to achieve optimal alignment by the Genetics Computer Group (GCG) program BESTFIT (22). The number of mismatches, insertions, and deletions was counted for each hundred bases of the sequence (Table 5). As expected, the sequence quality was best closest to the primer and decreased rapidly after about 400 bases. The number of deletions and insertions relative to the GenBank reference sequence increased five- to tenfold beyond 400 bases, whereas the number of mismatches doubled. The average accuracy rate for individual double-stranded sequencing runs was 97.7% for up to 400 bases.

The minimum criteria for submission of ESTs to GenBank were that sequences be at least 150 bases in length and contain <3% ambiguous base calls. The overall accuracy of sequences submitted from each template group was at least 97%, based on matches to known human genes. Three hundred forty-eight ESTs met these criteria and were submitted to GenBank with accession numbers M61953 through M62300, inclusive. All ESTs except those matching mitochondrial or ribosomal RNA (rRNA) genes and simple repetitive elements were submitted to GenBank.

Conclusions and Prospects

Single-run DNA sequencing has proven to be an efficient method of obtaining preliminary data on cDNA clones. Our results demonstrate that sufficient information is contained in 150 to 400 bases of a nucleotide sequence from one sequencing run for preliminary identification of the cDNA and localization to a chromosome. In addition to the 35 ESTs homologous to known human genes, 48 ESTs matched sequences in GenBank or PIR with moderate to striking similarity, including high-quality matches with genes from such evolutionarily distant organisms as yeast (EST00374) and Neurospora (EST00287) (Table 3).

Two hundred thirty ESTs did not match any current database entries and therefore represent new, previously uncharacterized genes. A multitude of approaches for classifying these genes exists, including complete sequencing and expression, chromosome mapping, tissue distribution, and immunological characterization. Currently unidentified cDNAs will also be classified by similarity to genes from other organisms as those sequences become available. Three ESTs reported here (EST00257, EST00259, and EST0374) were identified by similarity to sequences that have appeared since the last full release of GenBank.

The random selection approach used here revealed an unacceptably large number of highly represented clones in these cDNA libraries. Over 30% of the clones from the hippocampus cDNA library consisted of rRNA, mitochondrial cDNAs, or inserts consisting entirely of polyA. Sixty-eight ESTs matched 12 different mitochondrial genes, including 18 matches to cytochrome oxidase I. Although elimination of these uninformative clones is a priority for developing ideal cDNA libraries, techniques to reduce repeated sequencing of clones will become increasingly important as large numbers of cDNAs are sequenced. The use of library preprocessing techniques such as subtraction, which preferentially reduces the

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population of certain sequences in the library (11, 12), and normalization, which results in all sequences being represented in approximately equal proportions in the library (23), should reduce repeated sequencing of high and intermediate abundance clones and maximize the chances of finding rare messages from specific cell populations. In our initial experiments with subtractive hybridization of the hippocampus library with a human fibroblast cDNA library, CNPase and GFAP clones were enriched greater than tenfold and twofold, respectively. Another characteristic of the ideal cDNA library would be directional cloning so that either a coding sequence or a 3' noncoding sequence could be selectively obtained.

The EST data, in conjunction with physical mapping, will provide a high resolution map of the location of genes along chromosomes, a map that would be more costly to construct by genomic sequencing and analysis. By performing a single DNA sequencing reaction on each cDNA clone, a key piece of information was obtained for the relatively low cost of about \$0.12 to \$0.15 per base. The EST approach will provide a new resource for the analysis of chromosome sequence and for human gene discovery.

The screening of cDNA clones to identify the protein complement of a tissue has been explored by others to a limited extent. In 1983, Putney and co-workers sequenced over 150 clones from a rabbit muscle cDNA library and identified clones for 13 of the 19 known muscle proteins, including one new isotype, but no unknown coding sequences (24). Over 400 adult head-specific cDNA clones from Drosophila have been identified by differential screening of cDNA libraries from different developmental stages (25). Improvements in DNA sequencing technologies have now made feasible essentially complete screening of the expressed gene complement of an organism.

In our own laboratory, the EST approach should result in the partial sequencing of most human brain cDNAs in a few years. Similar approaches begun elsewhere (26) could result in a database of most human expressed genes in less than 5 years. The presence of these minimally characterized sequences in GenBank will assist research efforts in several areas of biology. The EST database will provide identification and confirmation of coding regions in naive genomic sequences. Sublocalization of cDNAs that have been mapped to chromosomes will help define the genetic content of specific chromosomal regions and permit correlation with patterns of inheritance in genetic disease. In a related experiment, chromosome sublocalization was the key to establishing that the γ -aminobutyric acid-benzodiazepine receptor β_{3} subunit is deleted in individuals with Angelman-Prader-Willi syndrome (27). We anticipate that ESTs from human brain will further the identification of genes associated with other neurological diseases and will provide a more complete view of gene expression in the brain.

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