# Comparison of Probe Hybridization Array Typing to Multilocus Sequence Typing for Pathogenic *Escherichia coli*<sup>⊽</sup>

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Received 2 September 2008/Returned for modification 10 October 2008/Accepted 29 December 2008

Probe hybridization array typing (PHAT) is a previously validated, high-throughput, highly discriminatory binary typing method based on the presence or absence of genetic material. To increase the utility of PHAT, we identified a refined PHAT probe set using 24 known and potential Escherichia coli virulence genes, by which groups similar to multilocus sequence typing (MLST) clonal groups (CGs) could be determined. We PHAT typed 1,132 E. coli isolates, representing at least 62 MLST CGs and diverse disease states, using a "libraryon-a-slide" microarray format. Using 24 PHAT probes, all 62 MLST CGs in the representative E. coli collection were distinguished. For major CGs, PHAT correctly classified all sequence types within CG7 and CG17 but misclassified between one and four sequence types for CG13, CG14, CG23, CG38, and CG58, giving an overall sensitivity and specificity of 80.4 and 98.7%, respectively. After application of the PHAT classification to the whole collection, MLST validation of the PHAT probe classification resulted in sensitivities from 0.0 to 100.0% and specificities from 75.0 to 100.0% for individual CGs and an overall sensitivity and specificity of 64.7 and 88.3%, respectively. The refined PHAT probe set is capable of classifying isolates into groups in a manner similar to major clonal complexes of MLST, indicating coevolution between the chromosomal background and the flexible gene pool. Further refinement is needed to distinguish between closely related groups. For analysis of large bacterial collections, PHAT is a relatively time- and cost-efficient method and is ideal for a first level of analysis.

Designing a research study to examine the molecular characteristics of bacteria takes careful consideration of many factors, including the collection of isolates, the methods of analysis and, ultimately, the cost. The design is even more critical for studies based on large collections of isolates, since all time and cost requirements are magnified. Selecting a typing system is likely to be one of the most important decisions, since the method chosen will impact the cost, personnel needed, type of analysis, time to results, and the assumptions that can be made based on the typing results.

Because it is based on sequence and thus is both portable and unambiguous, many consider multilocus sequence typing (MLST), which is based on variation in housekeeping loci in the genome, the ideal typing method. MLST is highly discriminatory for establishing long-term patterns of evolution (9). However, MLST does not provide much insight into recent genetic history, such as acquisition of mobile genetic elements. For example, alleles of the highly clonal food-borne pathogen *Escherichia coli* O157:H7, which causes bloody diarrhea and hemolytic-uremic syndrome, share nearly identical (>99.9%) nucleotide sequences among different isolates (12). In this

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case, MLST cannot differentiate *E. coli* O157:H7 isolates from each other, making it less useful for pathogen tracking and outbreak investigations.

In addition, MLST analysis can be quite daunting, especially for a large collection of isolates. For example, a study involving typing of 1,000 *E. coli* isolates results in 14,000 DNA sequences that must be visually examined for base-calling errors, compensated for reference sequence additions or deletions, trimmed to the appropriate length, and finally analyzed for the correct allele numbers. Therefore, the analysis for MLST requires significant personnel time and laboratory resources beyond the base cost of DNA isolation, PCR, and sequencing.

Probe hybridization array typing (PHAT) is an alternative typing method complementary to MLST. PHAT is a highly discriminatory method that determines relatedness of strains by using a binary system based on results of DNA dot blot hybridization for the presence or absence of genetic material (13). Strains that share diverse regions of genetic content are more likely to be related than strains that do not. By using gene probes that reflect genetic variation, PHAT provides insight into a more recent genetic history of a strain than that found using MLST. PHAT is ideal for use with large isolate collections since it can be easily adapted to a high-throughput "library-on-a-slide" (LOS) microarray format (20). LOS is capable of testing up to 1,200 isolates in duplicate in a single experiment. In addition, the binary output of PHAT typing is easily digitally formatted for large databases, making data analysis of PHAT more time-efficient than for MLST. While using MLST on 1,000 isolates can be daunting, if they can be

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<sup>&</sup>lt;sup>v</sup> Published ahead of print on 14 January 2009.

grouped first using PHAT, only a subset need be typed by MLST.

The previously published set of PHAT probes was a proof of concept requiring further refinement (13). First, the probes included in the initially published set were validated using uropathogenic and rectal isolates of *E. coli*. Therefore, the discriminatory power of PHAT for other pathotypes was not tested. Second, all probes were gene fragments from subtraction PCR experiments with rectal isolates, many without clearly defined genetic functions or relationships to virulence. Lastly, the PHAT types could not be mapped to MLST types, and thus direct comparisons between PHAT and MLST could not be made.

Here we describe a refinement of the PHAT probe set intended to classify *E. coli* isolates into groupings corresponding to MLST clonal groups (CGs). Probes were selected from genes with known and unknown functions related to virulence potential. The probe set was developed and validated by using a diverse collection of *E. coli* isolates, including strains that cause diarrhea, urinary tract infections (UTIs), and meningitis and commensal vaginal and rectal isolates and thus should be generalizable to isolates from these groups.

## MATERIALS AND METHODS

Bacterial collections and culture conditions. We used E. coli isolates from five different bacterial collections to develop and validate our refined PHAT probe set. The first collection contains E. coli and Shigella sp. isolates from Thomas Whittam's collection (National Food Safety and Toxicology Center, Michigan State University) representing all major known clonal complexes based on MLST type (n = 255). The collection is primarily from human and animal isolates causing diarrhea but also includes isolates that cause UTIs and meningitis from clinical specimens of stool, urine, and blood. We also include three collections from Betsy Foxman from three sources: (i) rectal, i.e., commensal E. coli isolates obtained from rectal swab specimens from healthy women and men aged 18 to 39 (n = 661); (ii) cystitis, i.e., uropathogenic *E. coli* isolates from urine from women aged 18 to 39 with lower UTI (n = 42); and (iii) vaginal, i.e., isolates obtained from vaginal swabs from women aged 18 to 39 with UTI (n = 24) or without UTI (n = 7). All isolates were collected over a 3-year period (1996 to 1999) from the same underlying population (6). The final collection is E. coli pyelonephritis isolates from adults (Harry Mobley, University of Michigan) and children (Patricia Brown, Detroit Medical Center) (n = 143) clinically diagnosed with pyelonephritis. Isolates were obtained from both urine and blood specimens. All E. coli isolates were grown in Luria-Bertani broth (Difco/Becton Dickinson, Franklin Lakes, NJ) overnight at 37°C for subsequent DNA isolation.

Selection and creation of PHAT probes. To determine the PHAT probe set, we used three sets of previously described genes and an additional new set of genes. The first set of genes includes the previously described genes chuA, yjaA, and tspE4.C2 (1). These genes categorize *E. coli* isolates into one of the four main ECOR phylogenetic groups: A, B1, B2, or D. If an isolate was positive for the presence of chuA and yjaA, then the isolate is categorized as belonging to phylogenetic group B2. If an isolate was positive for chuA but negative for yjaA, then the isolate that was negative for chuA and yjaA, then the isolate that was negative for chuA and yjaA, then the isolate that was negative for chuA and yjaA, then the isolate that was negative for chuA and yjaA, then the isolate that was negative for chuA and yjaA, then the isolate that was negative for chuA and yjaA, then the isolate that was negative for chuA and yjaA, then the isolate is categorized as group B1, and an isolate that was negative for chuA and tspE4.C2 would belong to group A.

The second set of genes includes the previously described genes stx1, stx2, eae, bfp, lt, virF, ipaH, and aafII (15). These genes help to categorize E. coli isolates into one of six diarrheagenic pathotypes: enterotoxigenic E. coli (ETEC), enteropathogenic E. coli (EPEC), Shiga-toxin producing E. coli (STEC), enterohemorrhagic E. coli (EHEC), enteroinvasive E. coli, or enteroaggregative E. coli. E. coli isolates that are positive for the presence of Shiga toxin-producing genes, stx1 or stx2, are categorized as STEC. If these isolates are also positive for the presence of the intimin gene, eae, they are categorized as EHEC. E. coli isolates that are positive for the bundle-forming pill gene, bfp, are considered typical EPEC, while isolates that are negative are considered atypical EPEC. Isolates positive for the labile toxin gene, lt, are categorized as enterotoxing EPEC. Isolates positive for the labile toxin gene, lt, are categorized as enterodiates toxing enterointy E. coli, while isolates positive for the aggregative adherence fimbria II gene, *aafII*, are considered enteroaggregative *E. coli*. Isolates that are positive for *ipaH* and *virF*, an invasion plasmid antigen and a transcriptional activator of a virulence loci, respectively, are considered to be enteroinvasive *E. coli*.

The third set of genes includes the previously described genes *iroN*, *ompT*, *hly*, *kpsMT*, and *aer* (5, 8, 10). These genes represent virulence factors that have been associated with *E. coli* that cause UTIs (uropathogenic *E. coli*).

The fourth set of genes consists of genes that were identified by in silico comparison of the sequenced strains *E. coli* CFT073 and *Shigella flexneri* 2457T to *E. coli* MG1655 using GenomeComp (17) and BLAST2 (National Center for Biotechnology Information [NCBI] database, National Institutes of Health [www .ncbi.nlm.nih.gov]) software (L. Zhang, unpublished data). Ideal genes were considered ones present in ca. 40 to 60% of the sequenced strains of *E. coli* and *Shigella* sp. in the NCBI database and have a potential virulence function. Genes selected for PHAT probes from the genome of *E. coli* CFT073 included c0286, c0311, c0340, c1164, c1600, c3389, and c3680 (named after the gene locus tag for *E. coli* CFT073 in the NCBI database). The gene that was selected to make into a PHAT probe from the *S. flexneri* 2457T genome included S3187 (named after the gene locus tag for *S. flexneri* 2457T in the NCBI database).

We redesigned the primers used for each gene (except the genes associated with UTI in set 3) to give product lengths that would optimize the LOS hybridization procedure using Primer Select Lasergene software (DNAstar, Inc., Madison, WI). The Primer sequences, product lengths, and annealing temperatures for each gene probe are shown in Table 1. Each PCR tube contained 50 ng of purified DNA template, 100 pmol of each primer, and Platinum PCR Supermix (Invitrogen, Carlsbad, CA), resulting in a total volume of 50 µl. PCR amplification was performed by using the PTC-100 programmable thermal cycler (MJ Research, Waltham, MA). PCR conditions used were as follows: soaking time of 2 min at 94°C, followed by 30 cycles of denaturing at 94°C for 30 s, annealing at the temperatures given in Table 1 for 30 s, and extension at 72°C for 2 min. This was followed by a final extension at 72°C for 5 min. PCR products were then purified by gel electrophoresis using a 1% agarose gel. Gels were then stained with ethidium bromide for visualization of DNA bands. Bands were excised from the gel and purified by using a QIAquick gel extraction kit (Qiagen, Inc., Valencia, CA). PCR amplification was performed a second time using the same procedure except using purified PCR product as template DNA. The resulting PCR products were then purified by using a QIAquick PCR purification kit (Qiagen). Probes were labeled with fluorescein-12-dCTP (Perkin-Elmer, Waltham, MA) by using a BioPrime labeling kit (Invitrogen). A DNA quantification probe was created using the seven MLST genes: aspC, clpX, fadD, icdA, mdh, lysP, and uidA. PCR amplification of the MLST genes was performed by using the MLST protocols described below and using DNA from E. coli CFT073 as the template. PCR products from all seven genes were pooled and labeled with digoxigen-11-dUTP (Enzo Life Sciences, Inc., Farmingdale, NY) using a BioPrime labeling kit (Invitrogen). All probes were tested with positive (template strain and purified probe) and negative (water) controls on nylon membranes (Hybond H+; Amersham Pharmacia, Buckinghamshire, United Kingdom) using the LOS hybridization procedure below to ensure the probes would hybridize as expected before use.

Microarray LOS arraying and hybridization. An E. coli microarray was created using 1,200 isolates and controls as described above. Genomic DNA was isolated by using a high-throughput sonication method as previously described (20). DNA from isolates and controls was arrayed onto Membrane Vivid microarray slides (Pall Life Sciences Corp., Ann Arbor, MI) by using a VersArray ChipWriter compact system (Bio-Rad, Hercules, CA) and the Virtek microarray (Virtek Vision Corp., Waterloo, Ontario, Canada) using protocols previously described (19, 20). All probes were hybridized to slides by using a modified dot blot method as previously described (21). Briefly, the quantification probe was hybridized to microarray slides overnight at 68°C in PerfectHyb Plus hybridization buffer (Sigma-Aldrich, St. Louis, MO). Slides were washed and the digoxigen-labeled quantification probe was detected using anti-digoxigen horseradish peroxidase and an aminoethylcarbasole peroxidase kit (Enzo Life Sciences). The quantification probe was then stripped from the slides using ethanol and washed. The PHAT probes of interest were then hybridized to the slides as before. After a washing step, the fluorescein-labeled PHAT probes were detected by using anti-fluorescein alkaline phosphatase (Roche, Basel, Switzerland) and an alkaline phosphatase kit (ArrayIt; TeleChem, Sunnyvale, CA). The intensity of each spot on the slide for each PHAT probe was normalized to the intensity of the quantification probe, thus accounting for differences in DNA concentration at each spot. The normalized intensities were compared to the intensities for positive and negative controls (sequence strains known to be positive and negative for the probe) to determine the presence or absence of the gene fragment in different E. coli strains, using previously described protocols (18, 19).

Gene	Gana function	Template	Sequence	; (5'-3') <sup>b</sup>	PCR	Amplicon	Source
name	Celle Infiction	strain <sup>a</sup>	Primer 1	Primer 2	temp (°C)	size (bp)	or reference
chuA	Outer membrane	CFT073	ATCGCGGCGTGCTGGTTCTTGT	AGCCAGTTGGTCGGGTTGATAGTC	59	985	1
<i>yjaA</i> tspE4.C2	Hypothetical protein Anonymous DNA fragment	CFT073 CFT073	TGAAAGCAAACGTGAAGTGTC CTTCCCGCTCTCCAGGCAACAT	TGCTTAAACATTGCCAGGAC GTGAGACAGAAACGCGGGTA	50 57	324 781	1 1
stxI	Shiga toxin 1	TW07814	AGGGCGTGGAGGATGTCAAGAATA	TGCCGGACACATAGAAGGAA	57	915	15
stx2 eae	Shiga toxin 2 Intimin, attaching and effacing	TW07814 TW07892	GTTCCGGGAATGCAAATCAGTCGTC TTCGCAATGGTAATACTCTGGTTC	AUTTITICACCAGTCGCCCACAC ATTITITCACCAGTCGCCCACAC CCGGTTTGCCTTTCCCTTCC	57 54	946 857	15 15
bfp lt ipaH	aunctouce protein Bundle-forming pili Heat-labile toxin Invasion plasmid antigen	TW03875 TW07814 TW06117	AGAGAAGAACCCTGGAT TCGATGATGCTACCCCTGAAAAAC TTACCCGAGACGTTAGAAGA	TCGACCTGAAATGTTGC CGCTCCGACCTGACCAAATG CAGAGCGCCGGTATCATTATCG	45 56 50	411 975 830	15 15 15
virF	Transcription-al activator of virulence loci	TW06117	AAGGTGTTCAATGACGGTTAGC	GCATGCGAATATCAAGAAGGA	50	560	15
aafII c0286	Aggregative adherence fimbria II Hypothetical protein	TW04393 CFT073	CCAGGTGCGGCAATCAGAGT TTGCTTCCCTGCGATTATTTAGTG	TGGCAGGGCAGTATCGTTCAT CTGCGGTTCTGGCTGTGATGGATT	54 54	988 930	15 This study
c0311 c0340	Hypothetical protein Hypothetical protein	CFT073 CFT073	AGTGTTTCTGCCTTTCCTG AGGATGTTCTGGAGGAGTGC	GACTTCGTACATACCGCTCTG CAGGGATATGACGAGTTGTTC	50 54	286 528	This study This study
c1164 c1600	Hypothetical protein ycdT Putative periplasmic iron binding	CFT073 CFT073	TCGGTATTGTTTGTGGGGGGGGATTT TCGGAAATCGTACTCTCGCTAAA	TTGGCCGATGCTGATTGAACTGTC GCTGCAGAAGTCTCATCATAACC	52 54	1,024 599	This study This study
c3389 c3680	Hypothetical protein Hypothetical protein	CFT073 CFT073	TGCCTGCGGTGGATAACAAC CGGAAGTGGTCAACGGGCATAC	AGAACGCGGAACAAGACTGATTT TTCGTCTTCATAGCGCTCTTTACC	55 54	839 698	This study This study
S3187 iroN	Hypothetical protein Iron-related siderophore	2457T CFT073	GTGGTCGACCCCGGTTACTTTTT AAGTCAAAGCAGGGGGTTGCCC	GGATTCATTATTCGGGGGTCTATTC GACGCCGACATTAAGACGCAG	54 65	488 700	This study 8
ompT hly	receptor Outer membrane protease Alpha-hemolysin, lyses red blood	CFT073 CFT073	AGCAGTAGTGATGAAGTTAT AGATGATGAGCTTCAGGTTC	CGGACATTAGTCTTGGAACT ATCCGACTTGTACTATGTGC	54 54	800 1500	v v
kpsMT aer	ceus Group II capsule Aerobactin, aerotaxis receptor	CFT073 CFT073	GCGCATTTGCTGATACTGTTG CGTACAGTATCCCGTGAAGAGTTT	CATCCAGACGATAAGCATGAG AAGGGCATCAGTGAGGGAAG TATT	52 65	519 764	s s
a All stroi	no ono E' aoli avonat for C'Anumi atmin 2	157T					

TABLE 1. Refined set of PHAT gene probes

<sup>&</sup>lt;sup>a</sup> All strains are *E. coli* except for *S. flexneri* strain 2457T. <sup>b</sup> The primers for the following probes were designed from *E. coli* CFT073 locus numbers: *chuA* (64308), *yiaA* (64968), tspE4.C2 (c4836), c0286, c0311, c0340, c1164, c1600, c3386, c3389, and c3680. The primers for <sup>b</sup> The primers for the following probes were designed from the *S. flexneri* 2457T locus numbers: *str1* (193SLT1), *st2* (X7865), *bfp* (AB024964, AF119170, EC13FFGNS, U21784), *lt* (ECLT87, ECOELTBH), *eue* (AJ298279, AJ308550, AJ308551, AJ308552, M58154, U38618, U66102, Z11541, AB0440740, AF055531, AF056528, AF116890, *bfp* (AB024964, AF119170), EC13FFGNS, U21784), *lt* (ECLT87, ECOELTBH), *eue* (AJ298279, AJ308550, AM38154, U38618, U66102, Z11541, AB0440740, AF055528, AF116890, AF200363, AF449418, AF530555, AF530557, AJ271407), *ipaH* (AF386526, AL391753, AF391753, AF348706, M76445, M32063), *wiF* (AY206433, AF348706, AL391753, X16661, X58464, M29172), and *aafH* (AF114828). Template strains identified by the prefix TW are from T. Whittam's collection (National Food Safety and Toxicology Center, Michigan State University).

MLST. MLST was performed previously on all representative *E. coli* collection isolates of T. Whittam. We used the same protocol to perform MLST on selected isolates from the cystitis, pyelonephritis, and vaginal and rectal collections for verification of the cluster analysis. MLST PCR protocols from the *Ec*MLST database (16) webpage (www.shigatox.net/stec/mlst-new/index.html) were followed using Platinum *Taq* DNA polymerase (Invitrogen). PCR products were purified by using a QIAquick PCR purification kit (Qiagen) and then sequenced at the University of Michigan Biology Core facility using primers for both 3'and 5' directions. DNA sequence chromatograms were visualized and edited by using FinchTV software (Geospiza, Inc., Seattle, WA). A consensus sequence was obtained for each of the seven gene fragments for each isolate by using MegAlign (DNAstar, Inc.). DNA sequences were then compared to the *Ec*MLST database to determine the allele type for each gene. The allele type profiles for each isolate were then used to assign sequence type (ST) and CG designations.

Analytic strategy. Our aim was to identify an optimal PHAT probe set which can maximally classify the E. coli isolates into different phylogenetic groups and compare the groups to classification using MLST. We performed cluster analysis using Cluster v2.11 and subsequently visualized the results by creating dendrograms with TreeView v1.60 software available at: http://rana.lbl.gov /EisenSoftware.htm (4), initially for classifying the representative E. coli collection for which MLST data were available. In the cluster analysis, distances between of all pairs of data to be clustered (e.g., all of the CGs in the current data set) were calculated using a Pearson correlation. Cluster uses agglomerative hierarchical processing, which consists of repeated cycles where the two closest remaining items (those with the smallest distance) are joined by a node/branch of a tree, with the length of the branch set to the distance between the joined items. The two joined items are removed from list of items being processed replaced by an item that represents the new branch. The distances between this new item and all other remaining items are computed, and the process is repeated until only one item remains. The CGs and STs used in the cluster analysis were as follows: CG7 (STs 23, 24, 25, 26, 357, and 378), CG13 (STs 86, 87, 88, and 296), CG14 (STs 104, 106, 110, and 310), CG17 (STs 118, 119, 120, 225, and 255), CG23 (STs 169, 170, 171, 172, 272, 273, 298, and 343), CG38 (STs -20, -3, 27, 28, 265, 271, 299, 338, and 346), and CG58 (ST 281, 282, 300, 344, and 384). The identified probe set was then used to classify isolates from other collections. As a validation, MLST was performed on a subset of isolates with PHAT signatures that corresponded to major CGs consensus PHAT signatures in the representative E. coli collection.

## RESULTS

All isolates from the five collections—diarrhea, cystitis, pyelonephritis, rectal, and vaginal—were probed using the identified PHAT probe set with LOS. The presence or absence of PHAT probes was determined unequivocally in 1,000 strains; these strains were used for cluster analysis and MLST validation.

**Cluster analysis.** The distribution of PHAT probes in the representative *E. coli* collection was analyzed to compare the PHAT classification to MLST CGs. The results were imported into TreeView to create a dendrogram (Fig. 1). Here, all 62 CGs in the collection were distinguished as separate branches in the tree. Using any less than the full set of 24 PHAT probes gave results in which not all 62 CGs could be distinguished.

In order to have sufficient power to determine whether PHAT could distinguish between MLST STs within a CG, we limited the analysis to the seven CGs that had five or more isolates (resulting in "major" CGs) in order to have power to distinguish between STs in a given CG. The major CGs used were CG7 (EPEC 4: 0119:H6 strains, basal to EPEC 1), CG13 (ETEC P: from pigs, including 0157:H43 clone), CG14 (EHEC 2: 026:H11 and 0111:H8 and relatives), CG17 (EPEC 2: classical EPEC with H2 antigen), CG23 (ECOR A: *E. coli* Reference Collection group A and including atypical EPEC 0111:H12), CG38 (UTI 1: uropathogens, including CFT073), and CG58 ("new" designation).

The PHAT probe set distinguished between many of the STs



FIG. 1. Dendrogram of cluster analysis results for isolates of the representative *E. coli* collection (n = 221). All 62 multilocus ST CGs were distinguished using 24 PHAT probes. CG 0 contains 73 singleton STs.

(Fig. 2) but had trouble distinguishing others, sometimes placing STs from the same CG into different PHAT groups. The sensitivity and specificity of this PHAT probe set for placing STs into the correct MLST CG ranged from excellent to good as follows: CG7 (100.0 and 100.0%), CG13 (66.6 and 95.0%), CG14 (80.0 and 100.0%), CG17 (100.0 and 97.5%), CG23 (50.0 and 94.7%), CG38 (80.0 and 94.4%), and CG58 (80.0 and 100.0%). Overall, the PHAT probe set has a sensitivity and a specificity of 78.3 and 97.5%, respectively, for this subset of strains from the representative *E. coli* collection, with the highest sensitivity and specificity for CG7 and CG17 and somewhat less for the other CGs. Identifying additional probes specific for each CG would improve this classification.

The PHAT probe set also correctly distinguished between isolates of the same ST and CG in 14 cases in the representative *E. coli* collection. These cases include the following CGs



FIG. 2. Dendrogram of the STs of the major CGs from the representative *E. coli* collection (n = 46) with PHAT genetic signatures. Gray squares indicate the presence of the gene for a given ST, and black indicates the absence of the gene. All STs in CG7 and CG17 were correctly grouped together, while between one and four STs were misclassified for CG13, CG14, CG23, CG38, and CG58.

and STs: CG0 and STs 10, 212, 227, 292, 304, and 339; CG11 and ST66; CG14 and ST106; CG28 and ST205; CG34 and ST89; CG38 and ST28; CG48 and ST381; CG65 and ST319; and CG67 and ST165. The genes best at differentiating strains within the same ST for a given CG were as follows: *hly* (seven CGs), *ompT* (three CGs), c0286 (three CGs), *stx1* (two CGs), *aer* (two CGs), *kpsMT* (one CG), c0311 (one CG), c1164 (one CG), c3389 (one CG), c3680 (one CG), and *stx2* (one CG).

MLST validation. From the cluster analysis of representative E. coli strains, we assigned a PHAT type that corresponded to each CG. In order to validate the PHAT assignment to CG, we identified all isolates in the cystitis, pyelonephritis, rectal, and vaginal collections whose PHAT type corresponded to a CG, based on the representative E. coli collection strains tested. From each pool of isolates identified from a specific CG, we randomly selected up to six isolates for MLST, for a total of 24. No isolates were chosen from CG14 (EHEC 2) because there were no isolates in the cystitis, pyelonephritis, rectal, or vaginal collections which matched the PHAT probe signature for this CG. The MLST typing results are shown in Table 2. The overall sensitivity and specificity of PHAT to predict MLST CG is 64.7 and 88.3%, respectively, with the most accurate assignments for CG7 and CG17: CG7 (100.0 and 95.6%), CG13 (0.0 and 75.0%), CG17 (100.0 and 100.0%), CG23 (40.0 and 92.8%), CG38 (100.0 and 81.8%), and CG58 (100.0 and 86.4%).

# DISCUSSION

For large bacterial collections, where time and cost requirements of MLST may be prohibitive, PHAT is an ideal first level of analysis. Since PHAT is able to identify groups that are equivalent to major CGs of MLST, it provides a picture of the distribution of major groups in the collection, in addition to phylogenetic groupings and virulence signatures. After PHAT typing, investigators can choose selected isolates from each PHAT group to determine the ST and CG, saving the cost of applying MLST to all isolates in the collection.

The PHAT probe set can be refined to include a varied set of genes, including potential virulence genes, phylogenetic markers, antibiotic resistance genes, or other genes of interest. Probes can be added to a core set of PHAT probes, so as to better define closely related groups that may need more discrimination. For bacteria with very heterogeneous genomes, such as *E. coli*, the accuracy of assignment to CGs based on PHAT may vary somewhat with study collection, so additional or alternative probes may be required. While the PHAT probe set presented here was created and validated using *E. coli* 

Isolate	Source	MLST gene allele profile							ST	CG as determined by:		PHAT signature
		aspC	clpX	fadD	icdA	lysP	mdh	uidA		MLST	PHAT	C
C625M-62	Rectal	6	21	8	5	7	41	7	788	0	7	00000010110100000000000
C609F-71	Vaginal	9	11	10	10	4	11	10	23	7	7	0000001011010000000000
C638F-61	Rectal	3	3	13	1	1	1	29	168	23	13	00000000100110000100000
C627F-64	Rectal	3	3	1	15	1	1	1	169	23	13	00000000100010000000000
T151F-66	Rectal	3	3	1	1	1	1	1	171	23	13	00000000100010000000000
C656M-62	Rectal	3	3	1	1	1	1	1	171	23	13	00000000100010000000000
T277F-64	Rectal	3	3	1	1	1	1	1	171	23	13	0000000010011100000000
C534F-62	Rectal	3	3	1	129	1	2	217	787	0	13/23 <sup>a</sup>	0000000010001100000000
DMC44BLD	Blood, pyelonephritis	4	2	2	2	1	2	2	119	17	17	000000110000111110000000
T373F-62	Rectal	3	9	1	7	1	169	1	794	23	23	00000000100011100000000
T396M-62	Rectal	3	3	1	1	1	1	1	171	23	23	00000001101011000000000
C118F-62	Rectal	3	3	1	1	1	1	1	171	23	23	00000001101011000100000
T83F-62	Rectal	3	3	1	1	1	1	1	171	23	23	00000001101011100100000
CFT 4	Urine, pyelonephritis	36	33	31	8	4	11	25	27	38	38	0000001011111111111111101110
T185F-2	Urine, cystitis	21	7	1	37	1	35	37	792	47	38	000000100111111111110100
T313F-2	Urine, cystitis	21	7	32	37	1	35	37	793	47	38	000000100111110111100100
T46M-62	Rectal	21	7	32	37	4	35	37	31	47	38	000000100111111111110100
T256F-62	Rectal	21	7	32	37	4	35	37	31	47	38	000000100111110111110100
C622M-62	Rectal	36	33	31	8	4	11	25	27	38	38	0000001011111111111111111
T395M-62	Rectal	3	12	13	1	1	2	12	795	23	58	0000000000001000000000
T112M-62	Rectal	67	12	98	78	1	76	40	791	58	58	0000000000011000000000
C669F-64	Rectal	4	12	1	68	1	1	40	790	0	58	0000000000001000000000
T400F-62	Rectal	67	3	13	15	1	1	40	796	58	58	00000000000010001000000
C658M-62	Rectal	4	3	1	15	1	168	135	789	0	58	0000000000001000000000

TABLE 2. Comparison of CG assignment by MLST and PHAT for selected E. coli isolates

<sup>a</sup> Using the PHAT probe genetic signatures, this isolate was included in both CG13 and CG23.

isolates, other probe sets can be created to type other bacterial agents. Any new PHAT probe set, however, would need to be properly validated for the agent of interest. Thus, PHAT is a very adaptable system that can be modified to suit many typing objectives, in a relatively time- and cost-efficient manner.

MLST analysis demonstrated that the refined PHAT probe set is able to correctly resolve most isolates for MLST CGs CG7, CG17, and CG14, with the most discriminatory probes for these CGs being chuA, yjaA, tspE4.C2, c1164, and c3389. However, PHAT did not resolve all CGs the same as MLST, since classification by PHAT grouped strains of certain CGs together (CG13/CG23 and CG38/CG47), and a majority of CG58 strains were classified into different CGs. Isolates of CG13 and 23 are both phylogenetic group A, while CG38 and CG47 are both group B2. The PHAT probe results have considerable overlap for each pair of CGs, suggesting that each pair may be closely related. While four of five CG58 isolates were correctly classified in the cluster analysis, only two validation isolates were typed as CG58 by MLST. Three other validation isolates were typed as CG0 or CG23. However, the PHAT probe set was developed using uropathogenic, diarrheal, meningitic, and commensal E. coli isolates, but isolates included in the final validation were mostly commensal E. coli isolates. This may have contributed to lower concordance between PHAT and MLST typing. A more detailed discussion on these results is included below.

In the cluster analysis, PHAT correctly classified all isolates within CG7 (EPEC 4), CG17 (EPEC 2), and all but one isolate of CG14 (EHEC 2). All isolates in CG7, CG14, and CG17 were positive for the gene *eae*, while all other CGs are negative for this gene. The *eae* gene encodes for intimin protein located in the locus of enterocyte effacement. The locus of enterocyte effacement is responsible for attaching and effacing histopathology, a defining feature of the diarrheal disease caused by the pathotypes EPEC and EHEC (11).

The phylogenetic probes chuA, tspE4.C2, and yjaA were useful in differentiating CGs by PHAT. The cluster analysis shows that CG14 and CG17 are related and are both phylogenetic group B1. This finding is consistent with previous studies (2, 7). CG14 and CG17 are further differentiated by probes c1164 and c3389, which are positive for CG17 and negative for CG14. The gene c1164, also known as ycdT, encodes a hypothetical inner membrane protein with a predicted diguanlyate cyclase domain. The gene c3389 encodes a hypothetical protein that is similar to the OmpA family of outer membrane proteins. The gene c3389 was also found in most CG38 isolates, while being absent in all of the other major CGs. c3389 has been previously associated with group B2 strains and has been found to be absent in strains from phylogenetic groups A and D (3). A better understanding of the function of c1164 and c3389 would help to inform about the differences between these CGs.

The refined PHAT probe set is capable of classifying isolates into groups in a manner similar to major clonal complexes of MLST, indicating coevolution between the chromosomal background and the flexible gene pool. While groupings between MLST and PHAT are similar, they do not match exactly, and therefore the results are not directly comparable. However, this is to be expected given that the evolutionary basis for change is different in each method. MLST classifies isolates based on base pair changes in DNA fragments of conserved housekeeping genes. Most changes in these genes are thought to represent a distant genetic history of a given strain, giving rise to a situation where two related strains share a common ancestor. PHAT, on the other hand, classifies isolates based on the presence or absence of genes to give a binary signature. Changes in whole gene presence or absence are likely to reflect much more recent genetic history for a given strain, given that these virulence genes tend to be propagated by horizontal gene transfer mechanisms, such as bacteriophages, plasmids, and transposable elements. Therefore, two related strains by PHAT typing do not necessarily share a common ancestor for core genes. Thus, we are comparing two very different evolutionary measurement scales, with MLST changes occurring on a slow time scale and PHAT changes which may occur on a faster time scale. Instances where STs share similar lineages (as determined by MLST) but different PHAT signatures are especially interesting to characterize further, since they may represent lineages where acquisition of specific sets of virulence genes may result in increased propensity to cause disease.

Although these two typing systems give results that are not directly comparable, they are highly complementary. Many studies are focused on the virulence potential and the clinical implications of particular strains, and the relevance of the MLST gene is likely to occur only through indirect genetic linkages to actual virulence genes (14). PHAT, however, would be an ideal typing system to use to answer these types of questions since any potential virulence gene could be a PHAT probe candidate. These candidate genes can then be screened for across the collection relatively quickly to determine whether any relationships between the gene and clinical disease exist, which may help to determine whether further study is warranted. One caveat is that discriminatory power of a specific PHAT probe may vary by study collection. As the PHAT probe set is further developed and refined by applying to large sets of isolates from various diseases, it will be possible, and of practical importance, to establish an all-round array for PHAT.

### ACKNOWLEDGMENTS

This study was supported in part by National Institutes of Health/ Alliance for the Prudent Use of Antibiotics.

We thank Harry Mobley and Patricia Brown for providing some of the *E. coli* isolates for the present study and Hardik Doshi for help with the LOS hybridizations.

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