Differentiation of Lobular *versus* Ductal Breast Carcinomas by Expression Microarray Analysis¹

James E. Korkola,² Sandy DeVries, Jane Fridlyand, E. Shelley Hwang, Anne L. H. Estep, Yunn-Yi Chen, Karen L. Chew, Shanaz H. Dairkee, Ronald M. Jensen, and Frederic M. Waldman

Comprehensive Cancer Center [J. E. K., S. D., J. F., A. L. H. E., K. L. C., R. M. J., F. M. W.], and Departments of Surgery [E. S. H.], Pathology [Y-Y. C.], and Laboratory Medicine [R. M. J., F. M. W.], University of California San Francisco, San Francisco, California 94143-0808, and Geraldine Brush Cancer Research Institute, California Pacific Medical Center, San Francisco, California 94115 [S. H. D.]

ABSTRACT

Invasive lobular and ductal breast tumors have distinct histologies and clinical presentation. Other than altered expression of E-cadherin, little is known about the underlying biology that distinguishes the tumor subtypes. We used cDNA microarrays to identify genes differentially expressed between lobular and ductal tumors. Unsupervised clustering of tumors failed to distinguish between the two subtypes. Prediction analysis for microarrays (PAM) was able to predict tumor type with an accuracy of 93.7%. Genes that were significantly differentially expressed between the two groups were identified by MaxT permutation analysis using t tests (20 cDNA clones and 10 unique genes), significance analysis for microarrays (33 cDNA clones and 15 genes, at an estimated false discovery rate of 2%), and PAM (31 cDNAs and 15 genes). There were 8 genes identified by all three of these related methods (E-cadherin, survivin, cathepsin B, TPI1, SPRY1, SCYA14, TFAP2B, and thrombospondin 4), and an additional 3 that were identified by significance analysis for microarrays and PAM (osteopontin, HLA-G, and CHC1). To validate the differential expression of these genes, 7 of them were tested by real-time quantitative PCR, which verified that they were differentially expressed in lobular versus ductal tumors. In conclusion, specific changes in gene expression distinguish lobular from ductal breast carcinomas. These genes may be important in understanding the basis of phenotypic differences among breast cancers.

INTRODUCTION

Invasive ductal and lobular breast carcinomas are the most common malignancies of the breast, accounting for $\sim 80\%$ and 15% of all invasive breast tumors, respectively (1). The two tumor subtypes are distinguished on the basis of their histology, with ductal tumors tending to form glandular structures, whereas lobular tumors are less cohesive and tend to invade in single file (2). Lobular tumors are often slower growing than ductal tumors, are more often estrogen and progesterone receptor positive (3, 4), have lower vascular endothelial growth factor expression (5), and more frequently have loss of Ecadherin (6-8). Genomic analyses have also identified differences, with lobular tumors characterized by loss of chromosome 16q and gain of 1q (7, 9). Such studies suggest that lobular tumor development and progression may follow a distinct pathway from ductal tumors. Although treatment for stage-matched ductal versus lobular tumors is similar (10), some studies suggest that metastatic patterns differ between lobular and ductal tumors (11, 12), and lobular tumors may be less responsive to neoadjuvant therapy (13).

The power of expression profiling using microarrays for distinguishing subgroups of breast cancers has been demonstrated by several groups (14–19). Expression profiling and hierarchical clustering of ductal breast cancers have identified classes of tumors with aggressive phenotype and poor prognosis (15, 18). Predictive models based on expression data from node-negative patients can stratify patients into groups that have good prognosis *versus* those with poor prognosis (16, 19). Other studies have found distinct expression patterns based on *BRCA1* and *BRCA2* status (17). To date, however, gene expression differences based on breast cancer histology have not been reported. We report gene expression profiling on a panel of ductal and lobular tumors to identify differentially expressed genes, using several alternative statistical methods to correct for the multiple comparisons problem.

MATERIALS AND METHODS

Samples. Fresh-frozen breast tumors were collected after institutional review board approval from patients treated at UCSF³ and California Pacific Medical Centers. Frozen tumor blocks were trimmed to ensure that a minimum of 70% of the cells present were tumor cells. A total of 106 invasive ductal tumors, 17 invasive lobular tumors, and 6 normal breast samples from reduction mammoplasties were analyzed. Lobular cases were additionally stained for E-cadherin by immunohistochemistry. There were no significant differences between the ductal and lobular groups in distribution of stage or nodal status.

RNA Isolation. Frozen sections were placed directly in Trizol reagent (Invitrogen, Carlsbad, CA), homogenized for 2 min on ice, and RNA was isolated using the manufacturer's protocol. RNA was quantified based on absorbance at 260 nm. Quality of the RNA was assured by measuring 260:280 ratios and reviewing integrity on agarose denaturing gels. Some samples were additionally purified through RNeasy columns (Qiagen, Valencia, CA) according to the manufacturer's protocol. A mixture of equal amounts of RNA from the following cell lines, all available from American Type Culture Collection (Manassas, VA), was used as a common hybridization reference sample: SW872, WM115, NTERA2, MCF7, HEPG2, MOLT4, Hs578t, HL60, OVCAR3, COLO205, and RPMI 8226. The same preparation of reference pool RNA was used for all of the hybridizations.

Expression Microarray Preparation. Microarrays were prepared using standard protocols.⁴ Briefly, clones from the Research Genetics clone set (Research Genetics, Huntsville, AL) were PCR amplified using universal primers (20), and clone band size was verified. Clones were precipitated, dissolved in $3 \times$ SSC, and printed on poly-L-lysine (Sigma, St. Louis, MO) coated slides. Microarrays consisted of 32 subarrays, each 18 rows by 18 columns, for a total of 10,368 spots. Slides were stored under vacuum, and postprocessed using standard protocols.⁴ Microarrays from five different print runs (using the same clone preparations) were used in this study. Data were normalized by print before unsupervised clustering to avoid print specific effects (15).

Labeling and Hybridization. For each sample, 5–10 μ g of RNA was digested with DNase I (Ambion, Austin, TX) then reverse transcribed with superscript II reverse transcriptase (Invitrogen) in the presence of amino-allyl modified dUTP (Sigma) using 2 μ g of random hexamers (Invitrogen) and 1.25 μ g of oligodeoxythymidylic acid primers (Invitrogen). BSA (1.5 μ g; Ambion) and 125 μ mol of ddATP (Invitrogen) were included in the reaction to increase signal and representation of rare transcripts (21). The cDNA product was cleaned through Microcon 30 columns (Millipore, Billerica, MA), coupled to

Received 7/1/03; revised 8/22/03; accepted 8/27/03.

The costs of publication of this article were defrayed in part by the payment of page charges. This article must therefore be hereby marked *advertisement* in accordance with 18 U.S.C. Section 1734 solely to indicate this fact.

¹ Supported by Komen Foundation Grant BCTR00-000378 and UCSF Breast Specialized Programs of Research Excellence P50CA58207.

² To whom requests for reprints should be addressed, at University of California San Francisco Comprehensive Cancer Center, Room S436, San Francisco, CA 94143-0808. Phone: (415) 476-3821; Fax: (415) 476-8218; E-mail: waldman@cc.ucsf.edu.

³ The abbreviations used are: UCSF, University of California San Francisco; PAM, prediction analysis for microarrays; SAM, significance analysis for microarrays.
⁴ Internet address: http://derisilab.ucsf.edu/microarray/protocols.html.

Cy3 dye (Amersham, Piscataway, NJ), and mixed with a Cy5 (Amersham) -labeled reference. The probe mixture was purified through QIAquick PCR columns (Qiagen), and mixed with 2 μ g of Cot-1 DNA (Invitrogen) and 10 μ g of tRNA (Invitrogen) in a buffer composed of 25 mM HEPES, 3× SSC, and 0.03% SDS. The probe was spun through an ULTRAfree MC column (Millipore) heated to 100°C for 2 min, transferred to 37°C for 5 min, and applied under a lifter slip (Erie Scientific, Portsmouth, NH) to the slide surface. Slides were incubated at 65°C overnight in a HybChamber (Gene Machines, San Carlos, CA), and washed in 2× SSC, 1% SDS at 55°C for 10 min, 2× SSC at room temperature for 10 min, and 0.2× SSC at room temperature for 10 min. Slides were briefly rinsed in deionized water and dried with compressed air. Slides were imaged on an Axon 9000B scanner (Axon Instruments, Union City, CA).

Data Analysis. All of the images were analyzed using GenePix pro v3.06 (Axon Instruments). Data were then corrected by subarray (print tip) median centering and LOESS smoothing using the Bioconductor R software package.⁵ Clustering was performed using Eisen's Cluster and TreeView (22). For unsupervised clustering, clones were chosen based on the entire tumor sample set; they were accepted if they were present in at least 80% of cases and showed a log₂ ratio of less than -2 or >2 in at least one case, resulting in a total of ~4,000 genes. All of the genes and arrays were median centered and normalized. The entire LOESS smoothed and median centered data set is available.⁶ For the supervised clustering methods described below, the entire set of ~10,000 genes was used.

The mt.MaxT function in the Multtest package for Bioconductor R was used to determine family-wise error rate-adjusted P values using the t-statistic, to test genes for differential expression between the two tumor sets by the method of Westfall and Young (23). Briefly, the class labels (ductal and lobular) are permuted, and the t-statistic for each gene is calculated. The maximum tstatistic is recorded for 10,000 random permutations, the distribution of maximum t-statistics is compared with observed values for the statistic, and the Pfor each gene is estimated as the proportion of the maximum permutationbased t-statistics exceeding the observed value.

SAM software was applied to adjust *P* values using a false discovery rate to identify genes that were significantly different between groups (24). SAM computes a penalized t-statistic for each gene and then performs a set of permutations to determine the false discovery rate by shuffling the class labels (5000 permutations in our analysis). The δ value was adjusted to give approximately the same number of genes as were identified by PAM.

The PAM R package was used to classify tumors and identify genes that were associated with specific histology (25). PAM ranks genes using a penalized t-statistic and uses soft-thresholding to identify a gene set for classification. The number of genes used is controlled by a thresholding parameter, which is determined with a 10-fold cross-validation. The threshold parameter is chosen to minimize the overall error rate (25).

Quality Control and Validation by Quantitative PCR. Multiple hybridizations of the breast cell line BT474 showed high reproducibility. Washing the slides at 55°C in 2× SSC/0.1% SDS, a higher stringency than reported by others7 additionally increased reproducibility.8 Slides washed under these conditions gave a stronger rank correlation when expression array values were compared with expression values for the ERBB2 gene measured by real-time quantitative PCR across a series of 11 cell lines ($R^2 = 0.85$). As an additional control, replicate clones of selected genes clustered together and showed high correlation. Also, replicate samples were hybridized to slides from different print runs, and these samples showed strong clustering. All of the clones identified by supervised analyses were sequence verified, to avoid misidentification (26, 27). A representative subset of genes identified by array analysis were chosen for validation using commercially available Assays-on-Demand probe-primer sets (Applied Biosystems, Foster City, CA) by real-time quantitative PCR analysis. Briefly, 500 ng of RNA was reversed transcribed with 1.25 units of murine leukemia virus reverse transcriptase (Invitrogen) using 5 $\mu \textsc{m}$ random primers (Invitrogen) in the presence of 7.5 mM MgCl_2 and 1 unit of ANTI-Rnase (Ambion) at 25°C for 10 min, 48°C 40 min, and 95°C for 5 min. RNA was used from 10 lobular tumor samples, 19 ductal tumor samples,

⁸ J. Korkola and F. Waldman, unpublished observations.

1 sample pooled from three reduction mammoplasties, 1 sample pooled from three primary breast epithelial cell cultures, 1 sample pooled from four primary carcinoma-associated breast fibroblast samples, and 2 samples from primary normal breast fibroblast samples. For real-time quantitative PCR, 4 μ l of the cDNA product was used to measure gene expression using an ABI Prism 7900 Sequence Detection System (Applied Biosystems) and the Assay-on-Demand probe-primer sets. One-tailed *t* tests were used to determine significant differences in expression measured by quantitative PCR between ductal and lobular samples.

RESULTS

Hierarchical Clustering of Lobular Tumors. Seventeen lobular and 6 reduction mammoplasty (normal) samples were analyzed by hierarchical clustering on a subset of \sim 3500 genes to explore tumor grouping and gene clustering in the lobular samples. These genes were chosen on the basis of being present in at least 80% of the lobular and normal cases.

Several clusters of related genes were evident by hierarchical clustering, the largest of which was related to proliferation (Fig. 1). This cluster included genes such as *cyclin E1*, *cdc6*, *PCNA*, *B-myb*, histones and histone related centromeric proteins (*CENPE*), the *chek1* mitotic checkpoint gene, and *GART* (involved in purine biosynthesis). Three groups of tumors were evident. Group I, which included the normal samples, was characterized by low levels of expression of genes in the proliferation-associated cluster, group II tumors showed the highest levels of expression, and group III showed mixed expression levels.

A cluster including matrix metalloproteinase *MMP2* and its inhibitor, *TIMP2*, was also evident. Expression of genes in this cluster were highest in tumors from group I, with low levels of expression in group II tumors, and low levels in most tumors in group III.

A cluster of genes related to estrogen receptor (*ESR1*) expression was seen, and included multiple copies of *ESR1* as well as *LIV-1*, which has been shown previously to cluster with *ESR1* (14, 28). Tumors in cluster I showed low levels of expression of *ESR1* and related genes, whereas tumors in clusters II and III showed mixed expression levels. All of the lobular tumors in this study were classified as estrogen receptor-positive by immunohistochemistry except for S36 (* in Fig. 1). Interestingly, this tumor showed high levels of *ESR1* gene expression relative to the other lobular tumors.

Several other gene clusters were present (data not shown). A cluster of *ERBB2* and related genes included *TOB1*, *NSF*, *COX11*, *CLTC*, and an expressed sequence tag (AA485411), all of which map to the same chromosomal region as *ERBB2* (17q12–21). Lobular tumors B413 and S93 showed relatively high levels of expression of *ERBB2*. Other gene clusters included those related to *ZNF217* expression, and *TIMP3* and *CD44* expression. These clusters showed mixed expression levels in the three tumor groups.

Tumors with different stages, grades, nodal status, and outcomes were found in every group, indicating that tumor clustering was not driven by clinical parameters. Two of the lobular cases were progesterone receptor negative by immunohistochemistry, and both were found in the group I cluster that showed low levels of proliferation.

Supervised Analysis of Lobular Cancer *versus* **Normal Breast.** Multiple comparisons may result in many genes appearing significant by chance alone. Several approaches for significance adjustments have been used in the analysis of microarray experiments. We used two similar tests, MaxT and SAM, to identify genes that distinguished between the lobular and normal samples. Both use permutation to identify significant differences between different groups. MaxT identified 49 clones that were significantly different in lobular *versus* normal breast. The 10 most significantly differentially expressed

⁵ Internet address: www.bioconductor.org.

⁶ Internet address: ml.ucsf.edu/people/waldman/Korkola/lobular.htm.

⁷ Internet address: cmgm.stanford.edu/pbrown/protocols/5_hyb_human.html.



Fig. 1. Unsupervised hierarchical clustering of lobular tumors (*black*) and normal breast samples (*green*). *Right*, clustering of tumors into three groups (I, II, and III). The cluster map for all 3500 genes is shown on the *left*. Gene clusters included those related to proliferation, *MMP2*, and *estrogen receptor (ESR)* shown on *left*, magnified images on *right*. Other clusters included those related to *ERBB2 (E)*, *CD44 (C)*, and *ZNF217 (Z;* magnified images not shown).

genes by MaxT analysis are shown in Table 1. SAM analysis also identified 47 of these 49 clones as being differentially expressed, and an additional 88 clones. For these 135 genes, SAM estimated the false discovery rate to be 0.5% (0.62 genes). Of 135 clones, 131 were more highly expressed in the normal than lobular samples.

Hierarchical Clustering of Lobular versus Ductal Tumors. Unsupervised hierarchical clustering did not distinguish the 17 lobular tumors from the 109 ductal tumors. Whereas the normal samples clustered together in one group, lobular cases were found in multiple groups. As was found with the lobular only clustering, a tumor group characterized by low expression levels of proliferation-associated genes was evident. Normal breast samples were confined to this cluster, which also included lobular and ductal cases.

Lobular tumors frequently have absent or altered expression of *E-cadherin* (6). Of the 17 lobular tumors, 15 showed low levels of *E-cadherin* by expression microarray analysis. The exceptions were cases B638 and B413, which showed weak to moderate levels of expression by microarray. Although B638 did not show any staining for *E-cadherin* by immunohistochemistry, B413 showed diminished but positive membranous staining. All of the other lobular cases showed no *E-cadherin* staining by immunohistochemistry. Histological review of B413 revealed mixed invasive lobular cancer and ductal carcinoma *in situ*.

Expression of *E-cadherin* was associated with expression of *ZNF217* (r = 0.488). *E-cadherin* and *ZNF217* are not located on a common chromosomal region and have not been reported previously to have coregulated expression.

All of the lobular cases except one were estrogen receptor-positive. There was a group of tumors that consisted almost entirely of estrogen receptor-negative ductal samples in the unsupervised clustering (data not shown). To determine whether clustering could separate the receptor-positive ductal from lobular cases, clustering was performed excluding the estrogen receptor-negative samples. This clustering did not show improved separation of the lobular from ductal samples (data not shown). There were no tumor groups that formed that were related to other clinical parameters such as stage, nodal status, or outcome with unsupervised clustering. As described in "Materials and Methods," there were no significant differences in these clinical parameters between the tumor types.

Distinguishing Lobular and Ductal Tumors by Differential Gene Expression

MaxT Analysis. MaxT permutation analysis identified 20 clones representing 10 genes that had adjusted *P* values of <0.05 (compared with 1733 clones with P < 0.05 before permutation correction), as shown in Table 2. *E-cadherin* (*CDH1*, 5 clones) was identified as having significantly lower expression levels in lobular than ductal tumors. This gene is frequently lost or altered in lobular breast cancer. Significantly lower levels of *cathepsin B* (*CTSB*, 7 copies) were also

Table 1	Genes	differentially	expressed	between	lobular	cancer	and	normal
breast tissue								

Gene	Genbank accession no.	Normal:lobular ratio ^a	MaxT P^b
Matrix metalloendopeptidase ^c	R98851	7.08	0.030
Bullous pemphigoid antigen 1	H44785	7.53	0.003
Keratin 5	AA160507	11.86	0.005
Metallothionein 1L	AI289110	2.52	0.005
Platelet activating factor acethydrolase 1B	AA464238	0.43	0.005
KIAA0353	AA877815	7.24	0.006
Regulator of G protein signaling 2	AI675670	3.79	0.007
Metallothionein 1L	N80129	3.15	0.007
MAP3K7 interacting protein 1	BC050554	4.37	0.008
Potassium channel KCNMB1	AA029299	5.04	0.009

^a The calculated ratio between normal and lobular samples.

^b The adjusted P from MaxT permutation analysis.

^c For *matrix metalloendopeptidase*, 6 clones were found to be significant by both SAM and MaxT analysis; the least significant MaxT adjusted *P* is shown for this clone.

Table 2 Genes that differentiate lobular from ductal breast cancers

Gene	Genbank accession no.	PAM ^a	SAM^b	$MaxT^{c}$	lob:ductal ^d	MaxT p value ^e
E-cadherin	H97778 or AI671174	6	6	5	0.325	0.003
Osteopontin	AA775616	5	5	0	0.326	0.084
Survivin	AA460685	1	1	1	0.548	0.048
Cathepsin B	AA598950	7	8	7	0.554	0.005
HLA-G	AI565209	1	1	0	0.558	0.250
HLA-F	AA988615	0	1	0	0.577	0.550
H2BFQ	AA010223	0	1	0	0.580	0.550
Chromosome condensation 1	AA291398	1	1	0	0.586	0.120
Triose phosphate isomerase 1	AA663983	1	1	1	0.623	0.045
Calreticulin	H99170	0	2	0	0.643	0.260
β-Actin	M10278	0	1	0	0.664	0.052
Expressed sequence tag	R26172	0	0	1	1.485	0.040
Transmembrane 4 SFM2	N93505	0	0	1	1.547	0.042
Sprouty 1	AA055440	1	1	1	1.697	0.038
Four and a half Lim domains 1	AA455925	1	0	0	1.906	1.000
Alcohol dehydrogenase 3	AI420743	1	0	0	2.050	0.150
Insulin like growth factor 1	AA456321	1	0	0	2.050	0.370
Small inducible cytokine A14	R96626	1	1	1	2.130	0.024
Elastin	AA459308	1	0	0	2.323	0.420
Trans.Factor AP2B	AA018906	1	1	1	2.536	0.012
Thrombospondin 4	AA423957	2	2	1	2.583	0.009

^a The number of replicates for each gene identified by PAM analysis that distinguish lobular versus ductal tumors. Note for *E-cadherin (CDH1)* two different clones were identified in the analysis.

^b The number of replicates for each gene identified by SAM analysis.

^c The number of replicates for each gene identified by MaxT permutation analysis.

^d The average lobular:ductal tumor expression level as measured by microarray.

^e The maxT adjusted P for each gene. For samples with multiple clones, the least significant P is shown.

associated with lobular histology. Other genes identified included transcription factor AP2B (TFAP2B), triosephosphate isomerase 1 (TPI1), and thrombospondin 4 (THBS4).

SAM Analysis. SAM uses a false discovery rate permutation approach for P adjustment to identify genes that are significantly differentially expressed between two or more classes. For 33 clones identified by SAM, it was estimated that the false discovery rate was 2.0%.

PAM Analysis. PAM was also used to classify the tumors. PAM builds a classifier based on a ranking of genes using a penalized t-statistic, then determines the misclassification error rate through cross-validation. The optimal classifier included 31 cDNA clones (15 unique genes). Adding more genes to the classifier increased the error rate, whereas fewer genes did not have enough power to discriminate between classes. This gene set showed excellent performance, classifying 15 of 17 lobular and 103 of 109 ductal samples correctly for an overall success rate of 93.7%.

Validation of Tumor-Associated Genes by Quantitative PCR Analysis. To validate the findings from the expression arrays, 7 genes were tested by real-time quantitative PCR analysis. The genes selected were E-cadherin, survivin, thrombospondin 4, β-actin, transcription factor AP2B, cathepsin B, and osteopontin. Control genes were PPP1CA and GAPDH. Fig. 2A shows the average δ Ct (normalized cycle number, relative to PPPICA) for lobular versus ductal tumors. For every gene that was differentially expressed by microarray, quantitative PCR found significant differences in gene expression. This was true for genes that were more highly expressed in ductal tumors than in lobular (β -actin, E-cadherin, cathepsin B, and osteopontin) and those that were more highly expressed in lobular samples (TFAP2B and thrombospondin 4). The linear fold change between ductal and lobular samples was calculated based on measurements from either quantitative PCR or microarray reading (Fig. 2B). There was good agreement between the two, although quantitative PCR tended to have larger magnitude differences than microarrays.

To determine whether these differentially expressed genes were preferentially expressed in stromal or epithelial cells, RNA from cultured fibroblasts and epithelial cells were tested by quantitative PCR (Fig. 3). β -Actin, cathepsin B, and thrombospondin 4 showed higher levels of expression in the fibroblasts than epithelial cells,

whereas *E-cadherin*, osteopontin, and *TFAP2B* showed higher levels of expression in epithelial cells. *Survivin* showed comparable expression levels in both cell types. To test whether culturing had an effect on gene expression in these samples, an uncultured pooled reduction mammoplasty sample was also tested for expression of these genes by real-time PCR. *Osteopontin*, *TFAP2B*, and *thrombospondin 4* were all expressed at lower levels in the cultured samples than in the reduction mammoplasty, whereas *survivin* was expressed at higher levels in the cultured samples. *E-cadherin*, *cathepsin B*, and *β-actin* did not show any changes in expression between the cultured and uncultured samples.

Hierarchical Clustering on the Basis of Genes Identified by Supervised Approaches. Unsupervised clustering using the 39 clones identified by MaxT, SAM, or PAM showed good discrimination of lobular from ductal tumors (Fig. 4). All of the lobular tumors except 2 were found in a large cluster consisting of 15 lobular tumors and 21 ductal tumors. Within this cluster, a smaller subcluster of 9 tumors was evident and consisted entirely of lobular samples. Clustering based on clones identified only by MaxT, SAM, or PAM all led to similar tumor grouping, with enrichment for lobular tumors in one tumor group (data not shown).

DISCUSSION

Expression analysis using microarrays has proven valuable in the study of tumor biology, identifying genes associated with tumor phenotype, response to treatment, and prognosis (14–17). The technique allows high-throughput analysis of expression for tens of thousands of genes in a single sample, is relatively easy to perform, and tends to give reproducible and accurate results. Expression analysis can detect alterations in both tumor and surrounding stroma (29). Whereas the large number of genes assayed is a strength of the approach, it does require statistical methods to correct for random associations. RNA expression analysis fails to identify post-translational modifications that impact protein expression and function. Furthermore, microarray analysis can be complicated by problems with clone misidentification. Studies that take these potential pitfalls into account have the ability to identify complex gene expression





Fig. 2. A. Cycle difference (test gene – control gene *PPP1CA*) for lobular (\boxtimes) versus ductal samples (\square) for 7 test genes as measured by quantitative PCR. *Error bars*, ±1 SE; *Ps* reflect one-tailed *t* tests between lobular (*n* = 10) and ductal (*n* = 19) samples. *B*, relative gene expression in ductal versus lobular tumors for the 7 test genes. (\boxtimes), real-time quantitative PCR; (\square), microarray.



Fig. 3. Relative gene expression by quantitative PCR for the 7 test genes. Expression levels were normalized to the *PPP1CA* control gene. All expression levels are shown relative to the cultured epithelial cell pool sample (set to a value of 1.0). *CAF*, pooled breast carcinoma associated fibroblast cultured sample; *NHF* 79–99 and *NHF* 195, normal breast associated fibroblast cultured sample; *Epi. Pool*, pooled normal breast epithelial cultured sample; *Red. Mammo.*, pooled reduction mammoplasty sample.

relationships and allow classification of samples based on their molecular profiles.

Lobular tumors are a distinct subset of breast tumors, based on histology, genetics, and biology. They are often hormone receptorpositive and tend to be more slowly proliferating than ductal tumors (3, 4). Lobular tumors have distinct DNA copy number changes compared with ductal cancers, suggesting a separate pathway of tumor formation (7, 9). Whereas gain of 1q and loss of 16q are among the most common chromosomal changes in ductal cancer, array comparative genomic hybridization analysis shows that these alterations occur in ~100% of lobular tumors.⁸ The loss of 16q is of particular interest, because this is the site of the *E-cadherin* gene, which is lost or altered in almost all of the lobular tumors (6–8). Another feature that distinguishes lobular from ductal breast tumors is the rarity of amplification of *cyclin D1* and *ERBB2* in lobular cancer, both of which occur frequently in ductal tumors (30–33).

Supervised analysis was able to identify many genes that were differentially expressed between lobular and normal samples. Many of the genes showing higher expression in normal *versus* tumor samples were related to nonepithelial cell types, likely reflecting the enrichment for cells of epithelial origin in the tumor compared with normal. For example, genes that are more highly expressed in fat (*FABP4* and *caveolin 1*), muscle (*myosin*), and immune cells (*kit*) were more highly expressed in the normal than in lobular tumors. There were also a number of genes involved in cell adhesion and extracellular matrix degradation that were more highly expressed in normal, reflecting a possible change in stromal-epithelial interactions and signaling in lobular tumors.

We chose three supervised methods to distinguish lobular from

ductal tumors; no other supervised approaches were used. SAM and MaxT use similar t tests and permutations to identify differentially expressed genes, but the calculation in SAM analysis adds a small correction factor (24). This results in a less stringent method, which likely accounts for the larger number of significant genes identified. Indeed, several of the genes identified by SAM were of borderline significance according to MaxT analysis. In contrast, PAM analysis does not test statistical significance of differentially expressed genes, but rather selects genes that best classify two groups of samples. This lack of significance likely explains why several of the genes identified by PAM analysis had relatively high Ps according to MaxT.

PAM correctly classified 15 of 17 lobular and 103 of 109 ductal cases. Case B413 was one of the misclassified lobular samples and showed atypical clinicopathological features, with a mixed lobularductal carcinoma *in situ* histology, positive *E-cadherin* expression by microarray analysis, positive but diminished *E-cadherin* staining by immunohistochemistry, a normal copy number for chromosome 16q, and overexpression of *ERBB2*. The atypical phenotype of this sample suggests a possible histological misclassification.

The gene that had the strongest association with lobular histology was *E-cadherin*, which has been described previously as being differentially expressed between the two tumor types (6). *E-cadherin* interacts with other *cadherins* and *catenins* for maintenance of tissue architecture and signaling through the adenomatous polyposis coli pathway (34, 35), and mutations, deletions, and methylation silencing can lead to loss of this function (6, 36). Loss of *E-cadherin* function is thought to directly contribute to the histological appearance of lobular tumors, which are characterized by a lack of cohesive architecture with single cells invading through the stroma (2). All but two



Fig. 4. Hierarchical clustering of lobular and ductal tumors based on the 39 clones identified by any of MaxT, SAM, or PAM. Fifteen of 17 lobular samples (*red*) are found in a single cluster, with 9 of 17 in one tight central cluster that is distinct from ductal samples (*black*). Note blocks of similar expression in replicate clones for osteopontin (*OPN*), cathepsin B (*CTSB*), and E-cadherin (*CDH1*).

of the lobular tumors showed very low levels of expression of *E*-*cadherin* by microarray analysis.

TFAP2B is a transcription factor expressed in both normal and malignant breast tissue (37). One of the target genes of *TFAP2* is *E-cadherin* (38), which raises the possibility that *TFAP2B* is upregulated in lobular tumors in response to low levels of *E-cadherin* protein. In addition to *E-cadherin*, *TFAP2* family members are

thought to control expression of the *IGF1 receptor* (39) and the antiapoptotic gene *BCL2* (40). High levels of *IGF1* were found to be predictive of lobular histology by PAM, whereas low levels of the antiapoptotic gene *BIRC5* (*survivin*; Ref. 41) were found in lobular relative to ductal tumors. This may reflect different mechanisms by which lobular and ductal tumors promote growth and escape apoptosis. It has been observed that *BCL-2* overexpression is often associated with *BIRC5* expression (41), which may explain why levels of *BCL-2* were not predictive of lobular *versus* ductal histology.

Osteopontin and cathepsins have been reported to be inversely correlated with members of the *thrombospondin* family (42, 43). Consistent with these observations, low levels of cathepsin B and osteopontin, and high levels of thrombospondin 4 were found in lobular tumors when compared with ductal tumors. These genes belong to families that have been implicated in control of adhesion, invasion, and metastasis (42–49). The differential expression of these genes associated with regulation of cell adhesion and invasion suggest a model in which lobular tumors may achieve invasive growth by loss of *E-cadherin*, whereas ductal tumors more commonly overexpress cathepsins and osteopontin, and down-regulate thrombospondins to achieve invasiveness.

Previous reports of expression analysis of breast cancers using microarrays have focused on identification of gene sets that are associated with a more aggressive phenotype (14, 18), familial breast cancer (50, 51), or poor prognosis (16). The current study has identified gene clusters that are very similar to ones reported elsewhere. The "normal-like" cluster that described by Perou et al. (28) was similar to the low-proliferation cluster that we observed in our data. There were also some elements of the basal-like, luminal-like, and ERBB2 clusters described by Perou et al. (28) present in our data, but the tumors did not form groups as distinct as in their study, likely because our clustering was performed on a much larger set of genes than their "intrinsic" gene set. Several studies have identified genes such as GATA-3, v-myb, and LIV-1 as being associated with estrogen receptor expression (14, 16, 28), which we observed when our ductal and lobular tumors were clustered. Our study, however, is the first to describe gene expression differences between breast tumors of different pathologically defined histological subtypes.

We have identified a set of genes that are differentially expressed in lobular versus ductal tumors. To determine in which cell compartment these genes were expressed, cultured fibroblasts and epithelial cells were tested for gene expression by real-time quantitative PCR. All of the genes except survivin showed differential gene expression between the fibroblasts and epithelial cells, suggesting that differences in expression observed between ductal and lobular tumors depends not only on expression in the tumor cells but also in the surrounding stromal cells. It is important to note that whereas there were detectable changes in gene expression between these two cell types, the reduction mammoplasty sample showed expression levels that were different from both the epithelial and fibroblast samples for several of the genes. This suggests that culturing the cells had an effect on expression of these genes, or that expression of the genes may be driven by a cell type other than epithelial cells or fibroblasts (such as adipocytes).

Lobular and ductal tumors are currently treated similarly and have similar outcomes. The inability of unsupervised clustering to distinguish between the two tumor types suggests that they have many expressed genes in common, and, thus, subtle differences in gene expression may be responsible for the phenotypic differences between them. In contrast, supervised analysis of tumors based on expression array analyses identified a gene set that distinguishes these two subtypes of breast tumors. In particular, ductal and lobular tumors showed striking differences in the expression of genes associated with cell adhesion and invasion, suggesting that they may achieve invasive growth through separate mechanisms. Several of the genes identified may prove to be useful for diagnosis and may be attractive targets for therapies directed against the specific tumor types.

ACKNOWLEDGMENTS

We thank Dr. ZhenHang Meng (California Pacific Medical Center, San Francisco, CA) for his help with RNA isolation, Molly Thomas (UCSF Cancer Center, San Francisco, CA) for help with sequencing, and Jeremy Brewer, Kshama Mehta, Ekaterina Blaveri, and Sunanda Pejavar (UCSF Cancer Center, San Francisco, CA) for help with microarray preparation. The fibroblast and epithelial cell cultures were kindly provided by Dr. Gerald R. Cunha (UCSF, San Francisco, CA). The WM-115 cell line was generously provided by Dr. Randy H. Kramer (UCSF, San Francisco, CA). Microarray printing was done at the UCSF Core Facility for Genomics and Proteomics. Sequencing and real-time quantitative PCR were performed by the UCSF Comprehensive Cancer Center Genome Core.

REFERENCES

- Rosen, P. P. Invasive Mammary Carcinoma. *In*: Diseases of the Breast, Eds. Harris, J. R., Lippman, M. E., Morrow, M., Hellman, S., pp. 393 and 420. Philadelphia, PA: Lippincott-Raven, 1996.
- Rosen, P. P. Breast Pathology, Vol. I, pp. 545–565. Philadelphia, PA: Lippincott-Raven, 1997.
- Coradini, D., Pellizzaro, C., Veneroni, S., Ventura, L., and Daidone, M. G. Infiltrating ductal and lobular breast carcinomas are characterised by different interrelationships among markers related to angiogenesis and hormone dependence. Br. J. Cancer, 87: 1105–1111, 2002.
- Kruger, S., Fahrenkrog, T., and Muller, H. Proliferative and apoptotic activity in lobular breast carcinoma. Int. J. Mol. Med., 4: 171–174, 1999.
- Lee, A. H., Dublin, E. A., Bobrow, L. G., and Poulsom, R. Invasive lobular and invasive ductal carcinoma of the breast show distinct patterns of vascular endothelial growth factor expression and angiogenesis. J. Pathol., 185: 394–401, 1998.
- Moll, R., Mitze, M., Frixen, U. H., and Birchmeier, W. Differential loss of E-cadherin expression in infiltrating ductal and lobular breast carcinomas. Am. J. Pathol., 143: 1731–1742, 1993.
- Nishizaki, T., Chew, K., Chu, L., Isola, J., Kallioniemi, A., Weidner, N., and Waldman, F. M. Genetic alterations in lobular breast cancer by comparative genomic hybridization. Int. J. Cancer, 74: 513–517, 1997.
- Sobrinho-Simoes, M., and Oliveira, C. Different types of epithelial cadherin alterations play different roles in human carcinogenesis. Adv. Anat.Pathol., 9: 329–337, 2002.
- Gunther, K., Merkelbach-Bruse, S., Amo-Takyi, B. K., Handt, S., Schroder, W., and Tietze, L. Differences in genetic alterations between primary lobular and ductal breast cancers detected by comparative genomic hybridization. J. Pathol., 193: 40–47, 2001.
- Peiro, G., Bornstein, B. A., Connolly, J. L., Gelman, R., Hetelekidis, S., Nixon, A. J., Recht, A., Silver, B., Harris, J. R., and Schnitt, S. J. The influence of infiltrating lobular carcinoma on the outcome of patients treated with breast-conserving surgery and radiation therapy. Breast Cancer Res. Treat., 59: 49–54, 2000.
- Jain, S., Fisher, C., Smith, P., Millis, R. R., and Rubens, R. D. Patterns of metastatic breast cancer in relation to histological type. Eur. J. Cancer, 29A: 2155–2157, 1993.
- Borst, M. J., and Ingold, J. A. Metastatic patterns of invasive lobular versus invasive ductal carcinoma of the breast. Surgery (St. Louis), *114*: 637–641; discussion 641–632, 1993.
- Newman, L. A., Buzdar, A. U., Singletary, S. E., Kuerer, H. M., Buchholz, T., Ames, F. C., Ross, M. I., and Hunt, K. K. A prospective trial of preoperative chemotherapy in resectable breast cancer: predictors of breast-conservation therapy feasibility. Ann. Surg. Oncol., 9: 228–234, 2002.
- West, M., Blanchette, C., Dressman, H., Huang, E., Ishida, S., Spang, R., Zuzan, H., Olson, J. A., Jr., Marks, J. R., and Nevins, J. R. Predicting the clinical status of human breast cancer by using gene expression profiles. Proc. Natl. Acad. Sci. USA, 98: 11462–11467, 2001.
- Sorlie, T., Perou, C. M., Tibshirani, R., Aas, T., Geisler, S., Johnsen, H., Hastie, T., Eisen, M. B., van de Rijn, M., Jeffrey, S. S., Thorsen, T., Quist, H., Matese, J. C., Brown, P. O., Botstein, D., Eystein Lonning, P., and Borresen-Dale, A. L. Gene expression patterns of breast carcinomas distinguish tumor subclasses with clinical implications. Proc. Natl. Acad. Sci. USA, 98: 10869–10874, 2001.
- 16. van 't Veer, L. J., Dai, H., van de Vijver, M. J., He, Y. D., Hart, A. A., Mao, M., Peterse, H. L., van der Kooy, K., Marton, M. J., Witteveen, A. T., Schreiber, G. J., Kerkhoven, R. M., Roberts, C., Linsley, P. S., Bernards, R., and Friend, S. H. Gene expression profiling predicts clinical outcome of breast cancer. Nature (Lond.), 415: 530–536, 2002.

- Hedenfalk, I., Duggan, D., Chen, Y., Radmacher, M., Bittner, M., Simon, R., Meltzer, P., Gusterson, B., Esteller, M., Kallioniemi, O. P., Wilfond, B., Borg, A., and Trent, J. Gene-expression profiles in hereditary breast cancer. N. Engl. J. Med., 344: 539–548, 2001.
- van de Rijn, M., Perou, C. M., Tibshirani, R., Haas, P., Kallioniemi, O., Kononen, J., Torhorst, J., Sauter, G., Zuber, M., Kochli, O. R., Mross, F., Dieterich, H., Seitz, R., Ross, D., Botstein, D., and Brown, P. Expression of cytokeratins 17 and 5 identifies a group of breast carcinomas with poor clinical outcome. Am. J. Pathol., *161:* 1991–1996, 2002.
- 19. van de Vijver, M. J., He, Y. D., van't Veer, L. J., Dai, H., Hart, A. A., Voskuil, D. W., Schreiber, G. J., Peterse, J. L., Roberts, C., Marton, M. J., Parrish, M., Atsma, D., Witteveen, A., Glas, A., Delahaye, L., van der Velde, T., Bartelink, H., Rodenhuis, S., Rutgers, E. T., Friend, S. H., and Bernards, R. A gene-expression signature as a predictor of survival in breast cancer. N. Engl. J. Med., 347: 1999–2009, 2002.
- Hegde, P., Qi, R., Abernathy, K., Gay, C., Dharap, S., Gaspard, R., Hughes, J. E., Snesrud, E., Lee, N., and Quackenbush, J. A concise guide to cDNA microarray analysis. Biotechniques, 29: 548–550, 552–544, 556 passim, 2000.
- Decraene, C., Reguigne-Arnould, I., Auffray, C., and Pietu, G. Reverse transcription in the presence of dideoxynucleotides to increase the sensitivity of expression monitoring with cDNA arrays. Biotechniques, 27: 962–966, 1999.
- Eisen, M. B., Spellman, P. T., Brown, P. O., and Botstein, D. Cluster analysis and display of genome-wide expression patterns. Proc. Natl. Acad. Sci. USA, 95: 14863– 14868, 1998.
- Westfall, P., and Young, S. Resampling-Based Multiple Testing. New York: Wiley, 1993.
- Tusher, V. G., Tibshirani, R., and Chu, G. Significance analysis of microarrays applied to the ionizing radiation response. Proc. Natl. Acad. Sci. USA, 98: 5116– 5121, 2001.
- Tibshirani, R., Hastie, T., Narasimhan, B., and Chu, G. Diagnosis of multiple cancer types by shrunken centroids of gene expression. Proc. Natl. Acad. Sci. USA, 99: 6567–6572, 2002.
- 26. Ross, D. T., Scherf, U., Eisen, M. B., Perou, C. M., Rees, C., Spellman, P., Iyer, V., Jeffrey, S. S., Van de Rijn, M., Waltham, M., Pergamenschikov, A., Lee, J. C., Lashkari, D., Shalon, D., Myers, T. G., Weinstein, J. N., Botstein, D., and Brown, P. O. Systematic variation in gene expression patterns in human cancer cell lines. Nat. Genet., 24: 227–235, 2000.
- Taylor, E., Cogdell, D., Coombes, K., Hu, L., Ramdas, L., Tabor, A., Hamilton, S., and Zhang, W. Sequence verification as quality-control step for production of cDNA microarrays. Biotechniques, *31*: 62–65, 2001.
- 28. Perou, C. M., Sorlie, T., Eisen, M. B., van de Rijn, M., Jeffrey, S. S., Rees, C. A., Pollack, J. R., Ross, D. T., Johnsen, H., Akslen, L. A., Fluge, O., Pergamenschikov, A., Williams, C., Zhu, S. X., Lonning, P. E., Borresen-Dale, A. L., Brown, P. O., and Botstein, D. Molecular portraits of human breast tumours. Nature (Lond.), 406: 747–752, 2000.
- 29. Perou, C. M., Jeffrey, S. S., van de Rijn, M., Rees, C. A., Eisen, M. B., Ross, D. T., Pergamenschikov, A., Williams, C. F., Zhu, S. X., Lee, J. C., Lashkari, D., Shalon, D., Brown, P. O., and Botstein, D. Distinctive gene expression patterns in human mammary epithelial cells and breast cancers. Proc. Natl. Acad. Sci. USA, 96: 9212–9217, 1999.
- Oyama, T., Kashiwabara, K., Yoshimoto, K., Arnold, A., and Koerner, F. Frequent overexpression of the cyclin D1 oncogene in invasive lobular carcinoma of the breast. Cancer Res., 58: 2876–2880, 1998.
- Mercapide, J., Zhang, S. Y., Fan, X., Furio-Bacete, V., Schneider, J., Lopez de la Osa, I., Patchefsky, A. S., Klein-Szanto, A. J., and Castresana, J. S. CCND1- and ERBB2gene deregulation and PTEN mutation analyses in invasive lobular carcinoma of the breast. Mol. Carcinog., 35: 6–12, 2002.
- Porter, P. L., Garcia, R., Moe, R., Corwin, D. J., and Gown, A. M. C-erbB-2 oncogene protein in *in situ* and invasive lobular breast neoplasia. Cancer (Phila.), 68: 331–334, 1991.
- Soomro, S., Shousha, S., Taylor, P., Shepard, H. M., and Feldmann, M. c-erbB-2 expression in different histological types of invasive breast carcinoma. J. Clin. Pathol., 44: 211–214, 1991.
- Berx, G., and Van Roy, F. The E-cadherin/catenin complex: an important gatekeeper in breast cancer tumorigenesis and malignant progression. Breast Cancer Res., 3: 289–293, 2001.
- Wijnhoven, B. P., Dinjens, W. N., and Pignatelli, M. E-cadherin-catenin cell-cell adhesion complex and human cancer. Br. J. Surg., 87: 992–1005, 2000.
- Huiping, C., Sigurgeirsdottir, J. R., Jonasson, J. G., Eiriksdottir, G., Johannsdottir, J. T., Egilsson, V., and Ingvarsson, S. Chromosome alterations and E-cadherin gene mutations in human lobular breast cancer. Br. J. Cancer, *81*: 1103–1110, 1999.
- Zhang, J., Brewer, S., Huang, J., and Williams, T. Overexpression of transcription factor AP-2α suppresses mammary gland growth and morphogenesis. Dev. Biol., 256: 128–146, 2003.
- Hennig, G., Lowrick, O., Birchmeier, W., and Behrens, J. Mechanisms identified in the transcriptional control of epithelial gene expression. J. Biol. Chem., 271: 595– 602, 1996.
- 39. Turner, B. C., Zhang, J., Gumbs, A. A., Maher, M. G., Kaplan, L., Carter, D., Glazer, P. M., Hurst, H. C., Haffty, B. G., and Williams, T. Expression of AP-2 transcription factors in human breast cancer correlates with the regulation of multiple growth factor signalling pathways. Cancer Res., 58: 5466–5472, 1998.
- Decary, S., Decesse, J. T., Ogryzko, V., Reed, J. C., Naguibneva, I., Harel-Bellan, A., and Cremisi, C. E. The retinoblastoma protein binds the promoter of the survival gene bcl-2 and regulates its transcription in epithelial cells through transcription factor AP-2. Mol. Cell. Biol., 22: 7877–7888, 2002.

- Tanaka, K., Iwamoto, S., Gon, G., Nohara, T., Iwamoto, M., and Tanigawa, N. Expression of survivin and its relationship to loss of apoptosis in breast carcinomas. Clin. Cancer Res., 6: 127–134, 2000.
- 42. Urquidi, V., Sloan, D., Kawai, K., Agarwal, D., Woodman, A. C., Tarin, D., and Goodison, S. Contrasting expression of thrombospondin-1 and osteopontin correlates with absence or presence of metastatic phenotype in an isogenic model of spontaneous human breast cancer metastasis. Clin. Cancer Res., 8: 61–74, 2002.
- 43. Gasparini, G., Toi, M., Biganzoli, E., Dittadi, R., Fanelli, M., Morabito, A., Boracchi, P., and Gion, M. Thrombospondin-1 and -2 in node-negative breast cancer: correlation with angiogenic factors, p53, cathepsin D, hormone receptors and prognosis. Oncology, 60: 72–80, 2001.
- 44. Kadar, A., Tokes, A. M., Kulka, J., and Robert, L. Extracellular matrix components in breast carcinomas. Semin. Cancer Biol., *12*: 243–257, 2002.
- Rudland, P. S., Platt-Higgins, A., El-Tanani, M., De Silva Rudland, S., Barraclough, R., Winstanley, J. H., Howitt, R., and West, C. R. Prognostic significance of the metastasis-associated protein osteopontin in human breast cancer. Cancer Res., 62: 3417–3427, 2002.

- Tuck, A. B., and Chambers, A. F. The role of osteopontin in breast cancer: clinical and experimental studies. J. Mamm. Gland Biol. Neoplasia, 6: 419–429, 2001.
- Koblinski, J. E., Dosescu, J., Sameni, M., Moin, K., Clark, K., and Sloane, B. F. Interaction of human breast fibroblasts with collagen I increases secretion of procathepsin Br. J. Biol. Chem., 277: 32220–32227, 2002.
- Foekens, J. A., Kos, J., Peters, H. A., Krasovec, M., Look, M. P., Cimerman, N., Meijer-van Gelder, M. E., Henzen-Logmans, S. C., van Putten, W. L., and Klijn, J. G. Prognostic significance of cathepsins B and L in primary human breast cancer. J. Clin. Oncol., *16*: 1013–1021, 1998.
- de Fraipont, F., Nicholson, A. C., Feige, J. J., and Van Meir, E. G. Thrombospondins and tumor angiogenesis. Trends Mol. Med., 7: 401–407, 2001.
- Hedenfalk, I., Ringner, M., Ben-Dor, A., Yakhini, Z., Chen, Y., Chebil, G., Ach, R., Loman, N., Olsson, H., Meltzer, P., Borg, A., and Trent, J. Molecular classification of familial non-BRCA1/BRCA2 breast cancer. Proc. Natl. Acad. Sci. USA, 100: 2532–2537, 2003.
- Chinnaiyan, A. M., and Rubin, M. A. Gene-expression profiles in hereditary breast cancer. Adv. Anat. Pathol., 9: 1–6, 2002.