

Expression Profiles of Adult T-cell Leukemia Lymphoma and Associations with Clinical Responses to Zidovudine and Interferon α

Running title: Transcriptional Profile of ATLL

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Abstract

Adult T-cell leukemia-lymphoma (ATLL) is an HTLV-1-associated lymphoproliferative malignancy that is frequently fatal. We compared gene expression profiles (GEPs) of leukemic specimens from 9 patients with ATLL at the time of diagnosis and immediately after combination therapy with zidovudine (AZT) and interferon alpha (IFN α). GEPs were also related to genetic aberrations determined by comparative genomic hybridization. We identified several genes anomalously over-expressed in the ATLL leukemic cells at the mRNA level, including *LYN*, *CSPG2* and *LMO2*, and confirmed LMO2 expression in ATLL cells at the protein level. *In vivo* AZT-IFN α therapy evoked a marked induction of interferon-induced genes accompanied by repression of cell-cycles regulated genes including those encoding ribosomal proteins. Remarkably, patients not responding to AZT-IFN α differed most from responding patients in lower expression of these same IFN-responsive genes, as well as components of the antigen processing and presentation apparatus. Demonstration of specific gene expression signatures associated with response to AZT-IFN α therapy may provide novel insights into the mechanisms of action in ATLL.

Introduction

Adult T-cell leukemia-lymphoma (ATLL) is a highly aggressive T-cell malignancy etiologically linked to the retrovirus Human T-cell Leukemia Virus type I (HTLV-1)¹. HTLV-1 is transmitted mainly through breastfeeding, sexually and blood transfusions and is endemic in areas of southern Japan, the Caribbean basin, intertropical Africa, South America, the Middle East and Papua New Guinea. An estimated 15-20 million people are infected with HTLV-1 worldwide, the majority of whom are asymptomatic carriers². Nevertheless, 2-6% of infected individuals will develop ATLL over a 40-60 year period. This very long latency and the low incidence of ATLL development in carriers suggest that the oncogenic potential of the HTLV-1 virus is quite weak and that secondary genetic events must somatically arise within infected cells during transformation. Current data supports the view that the viral Tax protein is instrumental for oncogenesis as has been demonstrated in *in vitro* transformation assays and animal models³. The Tax protein affects multiple intracellular processes and signaling pathways, including cell cycle progression, cell survival, mitosis and genomic stability⁴⁻⁶. Surprisingly, however, *tax* transcripts are detected in only 40% of all primary ATLL tumors^{7,8}, further pointing to the complexity of the HTLV-1-induced transformation and oncogenesis process, the mechanisms of which remain to be elucidated.

Clinically, ATLL is subdivided into four subtypes: acute, lymphoma-type, chronic and smoldering⁹. The first two types show aggressive clinical courses with median survival ranging from 7-13 months⁹. Although diverse therapeutic approaches have been used, standard or dose-intense chemotherapy regimens result in low response rates and

response durations are typically short. Accordingly, novel therapeutic approaches based on a better understanding of this disease are needed. In this context, several novel approaches include unlabelled and radiolabelled anti-CD25 monoclonal antibodies¹⁰, as well as strategies targeting the NFκB pathway^{11,12} and chemokine CCR4 receptor¹³. In addition, promising results have been observed in ATLL patients treated with a combination of zidovudine (AZT) and interferon alpha (IFNα)¹⁴⁻¹⁷.

To further investigate the deregulated pathways that may contribute to HTLV-1-mediated oncogenesis in ATLL, including the mechanisms that may underlie therapeutic responsiveness, we performed microarray gene expression analyses on ATLL specimens obtained at the time of diagnosis and immediately following combination therapy with AZT and IFNα. Further, correlation of patient cytogenetic profiles with patient gene expression data was performed to determine specific genetic aberrations resulting in over or under expression of genes that may contribute to disease pathogenesis. Our studies define a gene expression signature characteristic of ATLL cells, and reveal novel genes associated with response to AZT-IFNα therapy. These data may serve to predict individual responses to these compounds, thus helping to tailor treatment in patients with ATLL.

Materials and Methods

Patients and Treatment Regimen

The diagnosis of acute ATLL was based on characteristic clinical features, immunophenotype, and serological evidence of HTLV-1 antibody by ELISA, which was confirmed by Western blot and/or monoclonal proviral integration. The study group consisted of nine patients with leukemic presentation of HTLV-1 ATLL, all of whom provided informed consent, in accordance with the Declaration of Helsinki. Institutional review board (IRB) approval for these studies was granted by the IRB of the University of Miami.

All patients were treated with a uniform induction regimen combining high dose parenteral AZT (1.5 grams administered twice daily) and IFN α (5-10 million units administered twice daily) as induction therapy, a standard approach at our institution for patients with ATLL at the time of this study. Patients who responded to this induction regimen continued to receive outpatient maintenance therapy in the form of oral AZT (600 mg twice daily) and subcutaneous IFN α (5 million U once or twice daily). For patients with prolonged clinical response, maintenance therapy was gradually tapered to twice-daily oral doses of 300 mg AZT and 3 times weekly subcutaneous injections of 3 million U of IFN α . 'Clinical response' was defined as the disappearance of circulating abnormal lymphocytes, hypercalcemia, organomegaly, and measurable disease lasting for at least one month.

Isolation of PBMCs from ATLL patients and cell lines

Peripheral blood mononuclear cells (PBMCs) from nine patients with ATLL at the time of initial presentation and 24 hours post initial therapeutic dose (6 patients) were obtained and immediately processed for PBMC separation using density gradient centrifugation (Lymphoprep; MediaTech, Herndon, VA). In all the patients ATLL leukemic cells represented the majority of PBMCs at both time points. After separation, PBMCs were washed in sterile phosphate buffered saline, snap frozen as pellets and stored at -80 C for later use. The HTLV1 positive cell line MT2, the CD4-positive lymphoblastic leukemia cell line Jurkat (HTLV1-negative), and the diffuse large B-cell lymphoma cell line SU-DHL6 (HTLV1-negative) were grown in RPMI 1640 medium (Fisher Scientific, Santa Clara, CA) supplemented with 10% fetal calf serum, 2 mM glutamine (GIBCO BRL, Grand Island, NY), and penicillin/streptomycin (GIBCO BRL). MT2 cells were treated with AZT (10 micrograms/ml) and IFN α (1,000 units/ml; Schering-Plough Corporation, Kenilworth, N.J.) *in vitro*. For this project, the cell lines were given code names (LLAT7A and B for untreated and treated MT2 cells and LLAT8 for Jurkat) and investigators that performed initial gene expression analysis were blinded to the nature of the cell line specimens. For each of 6 patients (LLAT1 through LLAT6), and 1 cell line (LLAT7), corresponding sample pairs representing baseline pre-therapy specimens and specimens representing the 24-hour time point following therapy with AZT-IFN α were coded as “A” and “B”, respectively.

Immunoblot analyses

Whole-cell extracts for immunoblot analysis were prepared by lysing 5-10 x 10⁶ cells with RIPA buffer (1 x phosphate-buffered saline [PBS], 1% Nonidet P-40, 0.5%

sodium deoxycholate, 0.1% SDS, 10 mM phenylmethylsulfonyl fluoride, 1 µg/mL aprotinin, and 100 mM sodium orthovanadate) on ice for 30 minutes. After centrifugation at 3000g, the supernatant was assayed for protein concentration by bicinchoninic acid (BCA) assay (Pierce Biotechnology, Rockford, IL). For immunoblotting, 40 µg of whole-cell lysate was separated on 10% SDS–polyacrylamide gel electrophoresis, transferred to polyvinylidene difluoride membranes (BioRad Laboratories, Hercules, CA), and probed with anti-LMO2 antibody previously generated by us¹⁸ at 1:1000 dilution and anti-β-actin antibodies at 1:10 000 dilution (Sigma, St Louis, MO) overnight at 4°C. These antibodies were detected using anti–mouse horseradish peroxidase (HRP)–conjugated antibodies at 1:10 000 dilution (Jackson Immuno Research Laboratories, West Grove, PA) and visualized by the Super Signal West Femto Luminol/Enhancer Solution and Super Signal West Pico Luminol/Enhancer Solution (Pierce Biotechnology), respectively.

Gene expression profiling

Total cellular RNA was isolated from the tumor specimens and cell lines by using the RNeasy kit (Qiagen) according to the manufacturers' instructions. Starting from 3–4 micrograms of total RNA, one round of linear amplification was used to prepare amplified RNA (MessageAmp, Ambion). In each experiment, fluorescent cDNA probes were prepared from an experimental amplified RNA (aRNA) sample (Cy5-labeled) and a reference aRNA sample (Cy3-labeled); the latter used Universal Human Reference RNA (Stratagene), isolated from a pool of 11 cell lines (MCF7, Hs578T, NTERA2, Colo205, OVCAR-3, UACC-62, MOLT-4, RPMI-8226, NB4+ATRA, SW872, and HepG2). The use of a common reference allows the determination of the relative expression of each gene across all of the samples¹⁹. Fluorescent cDNA probes were then hybridized to

microarrays fabricated at the Stanford Functional Genomics Facility (generation SHDW; NCBI GEO GPL3522). The microarrays used included a total of 41,805 features representing 41,409 unique cDNA clones; these clones correspond to approximately 27,319 unique UniGene clusters including at least 14,744 unique named known genes (NCBI UniGene build number 173). Microarrays were hybridized then washed using previously described conditions¹⁹, and then scanned on a GenePix 4000B scanner (Axon Instruments). The data from the microarray experiments is available at the GEO database (<http://www.ncbi.nlm.nih.gov/geo/>) with accession number GSE19160.

Statistical Methods

Microarray data were deposited into the Stanford Microarray Database, where raw data were normalized using a regression based correlation scheme. Data selection included filtering for well-measured features using the ratio of feature intensity over local background exceeding 2.5 fold for at least 70% of the 18 arrays (n= 9606 features). Variant features (n=965) were selected by filtering for probes exhibiting a difference 4-fold or more from the median expression level in at least 3 of 18 (15%) microarrays. Unsupervised analysis was then performed by agglomerative hierarchical clustering using average-linkage that was applied sequentially to both genes and experiments (both median-centered) using the CLUSTER 3.0 program (<http://bonsai.ims.u-tokyo.ac.jp/~mdehoon/software/cluster/software.htm>), and the results were analyzed with TREEVIEW (<http://rana.lbl.gov/EisenSoftware.htm>).

For supervised analyses of gene expression changes upon treatment with AZT-IFN α , Significance Analysis of Microarrays (SAM)²⁰ was applied to all paired samples

with available baseline pre- (“A”) and post- AZT-IFN α therapy (“B”) specimens, starting with the data matrix of 9606 features described above. After imputing missing values through K-nearest neighbors (K=10), the paired metric was applied and a threshold FDR of 15% was set using the MeV 4.4.1 software package ²¹ to identify 150 significant features. For display purposes, paired samples were displayed as the difference in log-ratios between the “B” and “A” samples, and then hierarchically clustered. To assess biological enrichment in response to AZT-IFN α , we applied Gene Set Enrichment Analysis (GSEA v2.0.4, using default parameters) ²² to the pre-ranked list of features as defined above using the paired SAM statistic; we supplemented gene sets within the Molecular Signatures Database (mSIGDB, Broad Institute) ²² with those from the immunological Signatures Database (SIGDB, National Cancer Institute, NIH) ²³ as previously described ²⁴. For supervised analyses of gene expression differences among responding and non-responding patients to AZT-IFN α , SAM was applied to all pre-therapy (A) patient specimens, starting with the data matrix of 9606 features described above. After imputing missing values through K-nearest neighbors (K=10), the 2-class metric was applied to distinguish responding patients (LLAT1, 2, 3, and 4) versus non-responding patients (LLAT5, 6, 9, 10, and 11). To assess biological processes distinguishing responders from non-responders, we again applied GSEA to the pre-ranked list of features as defined above using the SAM statistic.

Comparative genomic hybridization (Array CGH)

High molecular-weight DNA was extracted from 5 million cells with a commercially available kit as described by the manufacturer (QIAamp Tissue Kit;

Qiagen, Valencia, CA). To measure DNA copy number changes throughout each tumor genome, standard comparative genomic hybridization was applied to chromosomes (s-CGH) to eight samples, using a reported method²⁵. Additionally, two cases were selected and studied in higher detail through array-based CGH using a validated microarray containing 2.460 BAC and P1 clones spotted in triplicate (UCSF Hum Array 2.0) and representing an average genomic resolution of 1.4 Mb. Relevant experimental methods and analytical procedures for array CGH have previously been described elsewhere in detail²⁶.

Results

Clinical profile of studied ATLL patients

Nine HTLV-1 associated ATLL patients with acute leukemia subtype were analyzed. The white blood cell counts at presentation ranged from 10-182 x10⁹/L with absolute leukemic lymphocyte counts ranging from 6-153 x10⁹/L. Flow cytometric analyses demonstrated that leukemic cells from all the patients expressed CD4 and CD25 that stained brightly on the cells. HTLV-1 proviral genome in leukemia cells was detected by Southern blot hybridization or PCR analysis. Among the 9 patients with ATLL, 6 also presented with lymphadenopathy. Splenomegaly and hypercalcemia were separately detected in 5 patients each.

Upon confirmation of the diagnosis, all patients received AZT- IFN α combination therapy. Durable response was observed in 4 patients. (LLAT1, LLAT2, LLAT3 and LLAT4), though the durability of these response varied (overall survival range of 0.67- 8.20 years; patient LLAT1 survived for 6.3 years and only patient LLAT2 remains alive

at the last follow-up, 8.20 years since diagnosis). In contrast, all non-responding patients succumbed to complications of their disease and died within 0.25-1.00 years following the diagnosis of ATLL.

Gene expression profiles of HTLV-1+ ATLL

We next explored genome-wide expression profiles obtained from peripheral blood leukemic lymphocytes from diagnostic blood specimens of these nine patients. In six patients (LLAT1, LLAT2, LLAT3, LLAT4, LLAT5 and LLAT6), we also analyzed GEPs of peripheral blood leukemic lymphocytes obtained 24 hours after initiation of AZT-IFN α combination therapy. As controls, we also included GEPs of the HTLV-1+ ATLL cell line MT2 (LLAT7) before and after *in vitro* AZT-IFN α treatment, as well the HTLV-1 negative Jurkat line (LLAT8). Unsupervised hierarchical clustering of specimens based on these genes revealed that distinct GEPs distinguished both transformed leukemic cell lines (*i.e.*, MT2/LLAT7 and Jurkat/LLAT8) from the primary clinical specimens from patients with HTLV-1+ ATLL, as it resulted in their separate clustering (Figure 1). Among GEP features associated with this distinction, we observed differential expression of genes associated with proliferation, whose expression was high in the MT2 cell line, as reflected in a signature comprising many cell cycle associated genes including *PCNA*, *CCNB1*, *CCNA2*, *CDC2*, *CDK4*, *CDC25A*, and *CDCA1*. Notably, many of these genes were previously reported as being over-expressed in HTLV-1 infected cell lines^{1,27-30}.

In contrast, primary leukemic cells from patients' peripheral blood demonstrated significantly higher expression of several surface cell markers, such as CD52, CD37,

CD28, and CD97. In addition, expression of histocompatibility genes such as *HLA-E* and *HA-I* was higher in primary leukemic samples compared to the cell lines. These observations suggest that despite the fact that MT2 cell line is commonly used for research of HTLV-1 related ATLL, it may not be representative of primary leukemic cells. Therefore, we excluded MT2 cell line from subsequent analyses. Overall, distinct clones representing the same gene typically clustered in adjacent rows in this gene-map, indicating that each gene has a distinct pattern of expression and that expression measurements are sufficiently precise to distinguish them.

Expression of several genes that have been previously reported to be induced in Tax-expressing cells was observed to be increased in ATLL cell compared to the Jurkat cells (e.g. *IL2R α* , *IL2R β* and major histocompatibility complex class II genes)³¹. Overall, when focusing on genes exhibiting significant differences between primary diagnostic ATLL leukemia specimens in comparison with the Jurkat cell line (i.e., at least 4 fold in at least 8 of 9 patients with ATLL), 122 arrayed features were reproducibly over-expressed and 50 features had lower expression in ATLL (Supplemental Table 1).

Multiple genes previously reported as expressed at higher levels in ATLL cells compared to normal CD4 lymphocytes were also found to be expressed at markedly higher levels in our ATLL leukemic cells compared to Jurkat cell line (e.g. *LYN*, *LYZ*, *S100A8*, *S100A9*)³⁰. Our analysis separately identified several genes highly expressed in the ATLL cells that may have an important role in pathogenesis of this disease. Among these genes, for example, we identified *LMO2*, which encodes a transcription factor regulating key events in erythropoiesis, angiogenesis, and embryogenesis³². Homozygous mice deficient in *LMO2* die as a result of defective yolk sac erythropoiesis,

whereas heterozygous mice show that *LMO2* plays a role in the development of all bone marrow–derived hematopoietic lineages³³. While *LMO2* is not expressed in normal T cells, this gene is of relevance in T-cell lymphoid and myeloid leukemias resulting from the deregulated expression of *LMO2* as caused by chromosomal translocations and insertional mutations³⁴. Notably, the over-expression of *LMO2* mRNA in leukemic cells of patients with ATLL cell observed herein was also reported in a previous study³⁰.

To further examine whether LMO2 protein is also expressed in ATLL leukemic cases, we performed Western blot analysis (Figure 2). All analyzed primary ATLL cases demonstrated LMO2 protein expression, with significant correlation between *LMO2* mRNA and protein expression (data not shown). Consistent with prior reports³⁵, no expression was observed in the Jurkat cell line. Furthermore, *LMO2* was neither expressed at the mRNA nor at the protein level in the MT2 cell line, further confirming differences in gene expression between primary ATLL specimens and this HTLV-1 infected cell line. Our finding of LMO2 expression in the ATLL leukemic T cells suggests that it may have a role in HTLV-1 induced leukemogenesis, similar to its known role in T-cell acute lymphoblastic leukemia.

Chondroitin sulfate proteoglycan core protein 2 (*CSPG2*) expression was also elevated in ATLL leukemic cells as compared to the Jurkat cells. Of note, *CSPG2* expression was also previously reported to be higher in ATLL cells compared to CD4 lymphocytes³⁰. *CSPG2* may play an important role in cancer cell migration and proliferation, and was reported to be elevated in adenomas and carcinomas^{36,37}. Interestingly, *CSPG2* is positively regulated by β -catenin, which is increased in ATLL cells^{38,39}.

Among our series of patients with ATLL, in all cases leukemic cells demonstrated at least 2-fold over-expression of *CX3CR1* compared to Jurkat cells, similarly to a prior report³⁰. *CX3CR1* is a typical seven transmembrane G-protein-coupled receptor involved in adhesion and chemotaxis⁴⁰, which binds its ligand, *CX3CL1*, a membrane bound adhesion molecule. *CX3CL1* expression on endothelial cells promotes the metastasis of *CX3CR1* expressing tumor cells, as reported for both prostate and breast cancer and is associated with an increased risk of metastasis to the brain^{41,42}. Similar to the expression of *CCR7* in T-cell acute lymphoblastic leukemias⁴³, *CX3CR1* over-expression on the ATLL cells may be associated with parenchymal organ infiltration.

Gene expression signatures of response to AZT-IFN α

In unsupervised analyses, comparison of the pre- and post AZT-IFN α therapy specimens demonstrated that paired specimens derived from individual patients almost invariably clustered together, indicating that intrinsic differences in gene expression among individual patients were more pervasive than the early expression responses induced by AZT-IFN α (Figure 1). Nonetheless, despite baseline variation in expression of responsive genes, comparison of paired specimens from individual patients before and after therapy revealed a concerted signature of transcriptional responses to AZT-IFN α treatment (Figure 3A). Using Gene Set Enrichment Analysis (GSEA), these responses were strikingly enriched for induction of genes known to be responsive to IFN in diverse cell types (Figure 3B) and for repression of those associated with ribosomal biogenesis, cell-cycle regulation, and proliferation (Figure 3C). .

We observed that the inter-individual heterogeneity among these ATLL patients captured gene expression differences relating to their clinical responses to this regimen. Unsupervised analyses revealed that three of the four cases demonstrating a clinical response to AZT-IFN α treatment clustered together on the same dendrogram branch, while the two paired specimens derived from patients that did not exhibit response clustered separately (Figure 1). We applied supervised analyses to explicitly assess differences between signatures of responders to AZT-IFN α and non-responders using GSEA. Notably, despite exhibiting similar response profiles to AZT-IFN α in the magnitude of induction and repression (Figure 3A), patients responding to AZT-IFN α differed most from non-responding patients in their baseline relative over expression of IFN-responsive genes, as well as components of the antigen processing and presentation apparatus (Table 1). Conversely, non-responding patients showed relative over-expression of *E2F3* and many of its proliferation-associated oncogenic targets (Table 1).

Correlation of genomic and gene expression data

HTLV-1 harboring ATLL tumors frequently carry chromosomal aberrations that may or may not be evident on routine metaphase karyotypes. Consequently, the tumor genomic profiles were examined and DNA copy number changes were correlated with gene expression profiles. Genomic analysis was performed on 8 tumor samples prior to therapy using comparative genomic hybridization (genomic DNA was not available for one patient). Overall, all but one case harbored clonal genomic imbalances. The pattern of genomic aberrations in HTLV-1+ ATLL specimens consisted of 49 genomic

imbalances (mean per tumor: 6.125 range: 0-16) and included 15 genomic gains (mean per tumor: 1.875 range: 0-6) and 34 losses (mean per tumor: 4.25 range: 0-15).

The most common chromosomal changes included gains of regions 1q, 3p, and 3q and losses of chromosomal regions 4p, 6q, 9p, 10p, 10q, 16p, 16q, and 17p (Figure 4A). Using array-based CGH, these genomic aberrations were then characterized at higher genomic resolution for two cases (Figure 4B). Despite the anomalous expression of *LMO2* in our ATLL patients, no aberrations were detected at the corresponding cytogenetic interval locus 11p13, suggesting that *LMO2* expression in ATLL cells is not due to a genomic amplification.

We next searched for genes within amplified or deleted genomic loci that were correspondingly over or under expressed at least 1.5 fold compared to the average expression of the series. This analysis revealed 110 genes located in areas of genomic imbalances (Table 2), though only three of the genes (*MET2A*, *IFIT1*, and *IL2RA*) exhibited relative down-regulation in at least two cases with similar chromosomal losses. Of note, expression of *MET2A* and *IFIT1* was also relatively down-regulated in some cases without chromosomal aberrations suggesting alternative mechanisms. Separately, despite our observation of over-expression of *E2F3* and its targets among non-responding patients, we did not observe recurrent amplifications involving the corresponding genomic locus for *E2F3* (i.e., 6p22.3) by comparative genomic hybridization of patients with ATLL (Figure 4A). Prior study demonstrated amplification of *E2F3* and over-expression of its target genes during progression from chronic to acute phase of ATL⁴⁴. The differences between our and previous study may suggest that such lesions may have been occult among our series using conventional CGH based on limitations in its

resolution or reflect different pathogenetic events in cases progressing from the chronic form compared to the *de novo* leukemic type of ATLL. Separately, given the number of chromosomal anomalies observed, the small number of analyzed cases limited a more extensive analysis of association between ATLL genotypes, gene expression profiles, and clinical outcomes.

Discussion

ATLL is a distinct clinical entity associated with HTLV-1 retroviral infection. Regardless of the extensive progress in virology, immunology, and molecular biology of ATLL and HTLV-1, the prognosis of patients with ATLL remains poor. Recently, several studies suggested that some ATLL patients may respond to the combination of AZT-IFN α ¹⁴⁻¹⁷; however, factors associated with responsiveness to the treatment are presently unknown. Our objective was to identify genetic parameters which might be associated with responsiveness to AZT-IFN α combination treatment. In addition, application of global gene expression studies to diagnostic specimens might elucidate the pathogenesis of ATLL.

Our analysis of GEPs of diagnostic leukemic ATLL cells revealed changes in gene expression of about 1000 genes, many of which (*e.g.*, *IL2R α* , *IL2R β* and major histocompatibility complex class II genes) were previously reported to be up-regulated in HTLV-1 infected cell lines and tumors^{27,30,31}. Moreover, multiple genes deregulated in our cases were also recently reported to be either over-expressed or down-regulated in primary ATLL specimens studied by Pise-Masison et al³⁰. Among the prominent genes similarly expressed in our cases as well as cases reported by Pise-Masison et al³⁰, we

observed high levels of expression of *LYN*, *LYZ*, *S100A8*, *S100A9*, *LMO2*, *CSPG2* and *CX3CR1*. These observations support the validity of our gene expression measurements and analyses, performed on leukemic cells derived from representative ATLL patients with characteristic clinical manifestations and clinical course. Anomalous expression of the LMO2 protein in ATLL – a transcription factor not normally expressed in normal T cells but implicated in the pathogenesis of T-cell acute lymphoblastic leukemias – may suggest that it may have a similar role in the pathogenesis of ATLL. The mechanism underlying LMO2 expression in ATLL is unknown. We did not detect aberrations at the corresponding cytogenetic interval locus 11p13 that might point to genomic amplification. It is also highly unlikely that HTLV-1 virus specifically integrates into host DNA in the proximity of the LMO2 gene, since previous studies demonstrated random integration sites of the virus^{45,46}. Further studies to elucidate the mechanism of LMO2 expression and its possible pathogenic role in ATLL are in progress.

While our results corroborate some of the findings observed by Pise-Masison *et al*³⁰, some studies analyzing gene expression of HTLV-1 immortalized T cells reported different observations with regard to some of the genes. For example, down-regulation of the expression of protein tyrosine kinases of the Src and Syk families (e.g. *LCK*, *HCK*, *LYN*) has been reported in response to HTLV-1²⁹, though we did not observe a similar profile among our HTLV-1+ ATLL cases. The latter discrepancy may stem from differences in gene expression between primary tumors and HTLV1 infected cell lines. Indeed, gene expression analyses presented herein demonstrated marked differences in gene expression profiles between MT2 HTLV-1 positive cell line and primary patients' ATLL cells.

Expression of genes associated with cell proliferation was among major differences distinguishing MT2 from primary ATLL patient samples. Similarly, previous studies demonstrated that *in vitro* HTLV-1 infection induces genes associated with proliferation and cell cycling attributed to expression of Tax protein^{28,29}. However, while Tax oncogene, encoded by HTLV-1 virus is expressed in many HTLV-1 infected cell lines, its expression is lost in many primary ATLL cells and may contribute to the observed differences. The differences in gene expression between primary tumors and HTLV-1 positive cell lines suggest that although the latter represent an accessible tool for study of HTLV-1 infection and lymphomagenesis, aberrations observed in these lines may not completely represent changes observed in primary tumor cells.

The primary leukemic cells analyzed in this study harbored genetic aberrations similar to aberrations previously reported in literature and included frequent chromosomal gains of chromosomal regions 3p, 7q, 1q, 2q, 3q, 8p, 8q, 9q, 18q, and 19p in addition to losses at chromosomal regions 6q, 2q, 4q, 5q, 10p, 10q, 12p, 18p and chromosome 13^{47,48}. Analyses of correlation between chromosomal changes and alteration in gene expression of chromosomes located in the chromosomal aberration regions demonstrated relatively poor correlation, similar to our observations in transformed follicular lymphoma specimens⁴⁹.

Gene expression profiling demonstrated a difference in gene expression between ATLL cells responsive and unresponsive to AZT-IFN α combination therapy. Noticeably, leukemic cells from non-responsive patients had high expression of *E2F3* and many of its proliferation-associated oncogenic targets genes, likely reflecting more aggressive nature of these tumors. Of interest, ATLL specimens exhibiting response to AZT-IFN α therapy

displayed high expression of interferon responsive genes prior to treatment initiation and further increase in their expression upon treatment; however, induction of some of these genes was also observed in unresponsive cases. The association between treatment and induction of interferon inducible genes upon treatment was highly statistically significant. Previous studies demonstrated that HTLV-1 may blunt signaling by IFN α ⁵⁰ and the extent of this effect may vary between different tumors. Indeed, over-expression of IRF4, a regulatory transcription factor negatively regulating IFN responses, has been reported as a determinant of resistance in ATLL¹². Interferon-gamma expressing mice exhibit decreased HTLV1 Tax protein tumorigenesis compared to animals deficient in interferon-gamma expression, suggesting that endogenously active interferon signaling pathway may ameliorate aggressiveness of these tumors³. However, the precise mechanism underlying the baseline differences in interferon target genes among ATLL patients, and its association with clinical response to the therapy is presently unknown. A recent *in vitro* study of ATLL-derived HTLV-1–infected CD4⁺ T-cell lines treated with arsenic trioxide and IFN α also demonstrated up-regulation of similar interferon-induced genes in the treated cells undergoing apoptosis and death following treatment¹¹. Similar to our *in vivo* findings that demonstrated changes of gene expression at 24 hours after AZT-IFN α combination treatment, induction of interferon target genes upon *in vitro* treatment with arsenic trioxide and IFN α was already detectable at 12 hours and was sustained up to 48 hours¹¹.

The NF κ B pathway is known to play an integral role in the pathogenesis of HTLV-1 infection and lymphomagenesis¹². Suppression of NF κ B activation by AZT-IFN α combination therapy might lead to apoptosis of ATLL cells, as was recently

reported for combination of arsenic trioxide and IFN α {Nasr, 2003 #15}, while expression of the C-Rel protein, a component of NF κ B imparts resistance to AZT-IFN α therapy¹². However, the exact mechanism of the AZT-IFN α -induced ATLL cell death is presently unknown. Demonstration of specific gene expression signatures associated with response to therapy may help to further elucidate the exact mechanism of AZT-IFN α -induced suppression of NF κ B and needs further evaluation in future studies.

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Legends

Figure 1: Gene Expression in ATLL. Gene expression profiles are depicted for 9 patients with ATLL, including 6 pre (A) and post AZT-IFN α (B) treatment and two T-cell lines, MT2 (LLAT 7A and B) and Jurkat (LLAT 8). Each row represents a separate cDNA clone on the microarray and each column a separate mRNA sample. The displayed matrix represents the relative log-base2 ratio of hybridization of fluorescent cDNA probes prepared from each experimental mRNA sample (compared to the median expression level across samples), as depicted by the corresponding color scale.

Figure 2. LMO2 protein expression in primary ATLL leukemic cells Immunoblot analysis using the anti-LMO2 monoclonal antibody shows LMO2 protein expression in primary ATLL leukemic cells, and the diffuse large B cell cell line SU-DHL6, known to express this protein. LMO2 protein is not expressed in the Jurkat and MT2 cells. *-empty lane.

Figure 3: *In vivo* gene expression responses of patients with ATLL following AZT-IFN α therapy. A) Gene expression signature of *in vivo* response to AZT-IFN α was defined by selecting those exhibiting significant induction or repression in response to AZT-IFN α (n=150) as determined by SAM, with rows ordered based on the magnitude of the difference. The logarithmic difference between the pre- (A) and post- (B) therapy measurements for each patient is captured in the depicted heat map. Selected gene sets exhibiting significant enrichment by GSEA (p<0.01, FDR<0.05) in response to AZT-IFN α are tabulated, with induced and repressed groups represented in B) and C), respectively.

Figure 4: Chromosomal Aberrations in ATLL Patients. (A) Cumulative gains and losses of chromosomal regions in eight Adult T Cell Leukemia patients; (B) Representation of the genomic profiling of case LLAT-9 using high-resolution BAC array-CGH. Bottom: A number of DNA copy number changes was observed, including the gain of 1q, trisomy of chromosome 3, deletion of 6q and deletion of 10p. Inserts: details of the genomic gain involving chromosome 1q22-1q32 and the loss of chromosome 6q14-q21. The presence of only one chromosome X corresponds to males' samples.

Table 1: Gene expression signature of responsiveness to AZT-IFN α treatment. Selected gene sets exhibiting significant enrichment by GSEA ($p < 0.01$, $FDR < 0.2$) in distinguishing patients with clinical responses to AZT-IFN α are tabulated.

| Higher in | Source | Gene Set | Annotation | p-value | FDR | Example Enriched Gene(s) | Primary Author | PMID |
|----------------|--------|--|---|---------|--------|---|----------------|----------|
| Responders | mSIGDB | HSA04612_ANTIGEN_PROCESSING_AND_PRESENTATION | Genes involved in antigen processing and presentation | <0.001 | <0.005 | HLA-DRB1/B5/B4/DPA, HLA-A, B2M, TAP2, TAPBP, RFX5 | Kanehisa | 18077471 |
| Responders | SIGDB | IS_161_IFN_PMBC_2X_UP | Induced >2-fold in PBMC by IFN α /IFN β in vitro (6-hrs) | <0.001 | <0.05 | ISG20, IRF1, GBP1, STAT1, OAS2, MX1 | Baechler | 12604793 |
| Responders | mSIGDB | DER_IFN α _UP | Induced by IFN α in fibrosarcoma | <0.001 | <0.05 | IFITM1, IRF1, HLA-A, GBP1, PSMB8 | Der | 9861020 |
| Responders | mSIGDB | IFN_GAMMA_UP | Induced by IFN γ in fibrosarcoma | <0.005 | <0.05 | IRF1, ICAM1, STAT1, IFITM1 | Der | 9861020 |
| Responders | mSIGDB | IFN_ALPHA_UP | Induced by IFN α in fibrosarcoma | <0.001 | <0.05 | IFITM1, IRF1, STAT1, OAS2, OAS1 | Der | 9861020 |
| Responders | SIGDB | IS_162_IFN_PMBC_4X_UP | Induced >4-fold in PBMC by IFN α /IFN β in vitro (6-hrs) | <0.001 | <0.05 | IRF7, ISG20, TNFSF10, LY6E, CASP10 | Baechler | 12604793 |
| Non-responders | SIGDB | IS_171_E2F3_OVEREXPRESSION_2X_UP | Induced >2-fold by E2F3 | <0.001 | 0.17 | CDKN1C, FZD1, PTCH1, HEY1, MYB, E2F3 | Bild | 16273092 |

Table 2: Differentially Expressed Genes within Chromosomal Aberrations of ATLL

| Lesion/Chromosome | Differentially Expressed Genes |
|-------------------|---|
| (-) 1p | RPL27A |
| (-) 1q | UAP1, DAF, FJL10052, FLJ21841, HDGF, ILF2, NUCKS, S100A10, MGC21854, FCER1G |
| (-) 2p | OLD35, MTHFD2 |
| (+) 2q | IL18R1, GPR55, ITM2C, MGAT4A, TTN, CTLA4, STK17B, PSCDBP |
| (+) 3p | AXUD1, SNRK, CISH, LRIG1, PCAF |
| (-) 3p | SATB1 |
| (+) 3q | CCNL1, IFRG28, PLSCR1, TAZ |
| (-) 5q | CSPG2 |
| (+) 7p | NT5C3 |
| (+) 7q | KIAA1718, TES, UBE2H, LR8, PEG10, FLJ20653 |
| (-) 7q | HIMAP4 |
| (+) 8p | PLEKHA2 |
| (+) 8q | MCM4 |
| (-) 9q | NPDC1, ANXA1, UCK1 |
| (-) 10p | IL2RA , FLJ13267 |
| (-) 10q | IFIT1 , ABLIM1, ADD3, MRPS16, SCD, IFIT2 |
| (-) 11p | RPL27A, IRF7, H19 |
| (+) 11q | SWAP70, SERPING1 |
| (-) 12p | NINJ2, LTBR, SLC2A3, LLT1, TNFRSF7 |
| (-) 12q | OSBPL8 |
| (-) 13q | NY-REN-34, ALOX5AP, EBI2, KIAA0853, UBL3 |
| (-) 15q | MYO5A, ISG20, B2M, IL16, GLCE |
| (-) 16p | NME4, NK4 |
| (-) 16q | MET2A , MET1L, MET1F, COG8, TUBB4, PNAS-108, FLJ20186, SLC7A5 |
| (-) 17p | HS3ST3B1, ITGAE |
| (+) 18q | MGC10200 |
| (+) 19p | EDG6, MYO1F, JAK3, CTL2, MGC15716 |
| (+) 19q | PIK3AP, LTBP4 |
| (-) 19q | PIK3AP, ZNF134 |
| (+) Xp | KIAA1280 |

Genes with at least 1.5-fold difference in relative expression as compared to the average expression across all specimens were considered. In cases with genomic gain/amplification (denoted as “+”), only over-expressed genes were considered, while in cases with genomic deletions (denoted as “-“), only genes with decreased expression are shown. In bold are genes whose expression changed in two cases.

Figure 1

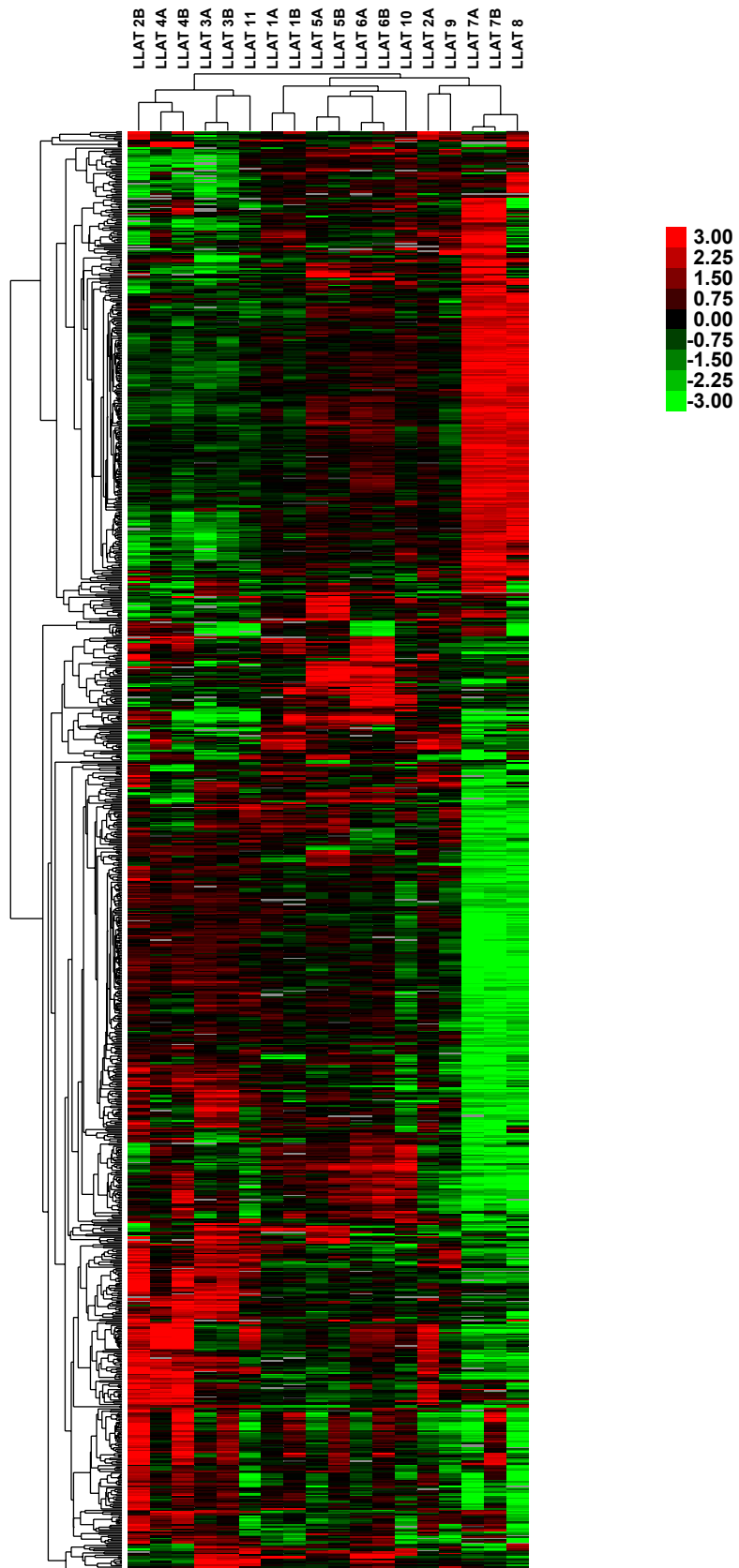


Figure 2

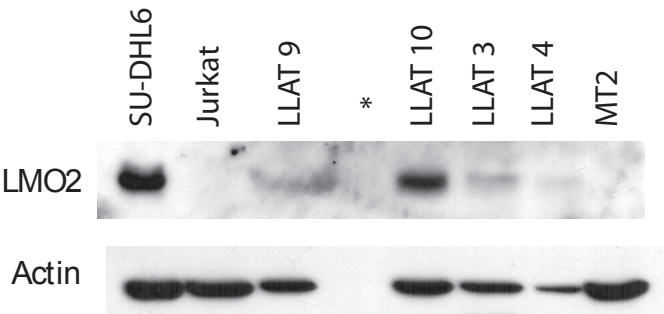
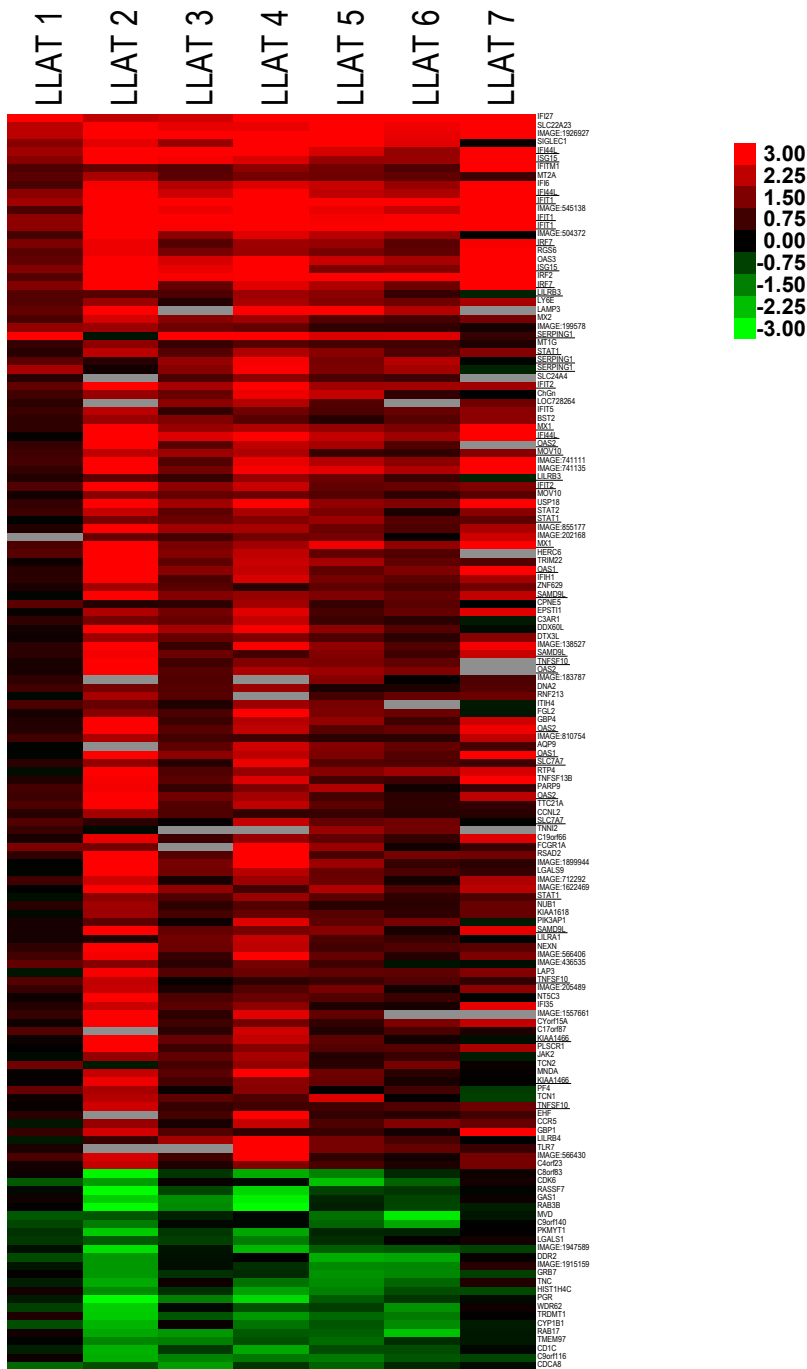


Figure 3

A



B

| Source | Gene Set | Annotation | p-value | FDR | Example Enriched Gene(s) | Primary Author | PMID |
|--------|---------------------------------|--|---------|---------|--|----------------|----------|
| SIGDB | IS_161_IFN_PMB3_2X_UP | Induced >2-fold in PBMC by IFNA/IFNB in vitro (6-hrs) | <0.001 | <0.001 | IFI16, IRF9, IL15, IL12RB2, PRF1, MYD88 | Baechler | 12604793 |
| SIGDB | IS_162_IFN_PMB3_4X_UP | Induced >4-fold in PBMC by IFNA/IFNB in vitro (6-hrs) | <0.001 | <0.001 | IRF1/2/7, MX1/2, STAT1, OAS1/2 | Baechler | 12604793 |
| mSIGDB | SANA_IFNG_ENDOTHELIAL_UP | Induced by IFNG in various endothelial cells | <0.001 | <0.001 | HLA-A, HLA-DPA1, TNFSF10, STAT1 | Sana | 15749026 |
| mSIGDB | IFNA_HCMV_6HRS_UP | Induced by IFNA in fibroblasts (6-hrs) | <0.001 | <0.001 | ISG15, IL15, MYD88 | Browne | 11711622 |
| mSIGDB | RADAEVA_IFNA_UP | Induced by IFNA in hepatocytes | <0.001 | <0.001 | IRF7, ADAR, MX1/2, BST2, TNFSF10 | Radaeva | 11910354 |
| mSIGDB | IFNA_UV-CMV_COMMON_HCMV_6HRS_UP | Induced by either CMV or IFNA in fibroblasts (6-hrs) | <0.001 | <0.001 | MYD88, OAS1/2, MX1/2, IRF7 | Browne | 11711622 |
| mSIGDB | DER_IFNA_UP | Induced by IFNA in fibrosarcoma | <0.001 | <0.001 | IFI6, HLA-A, STAT1, TAP1, IL6, VEGFC | Der | 9861020 |
| SIGDB | IS_83_NFKB_ALL_OCILY3_LY10 | Repressed by Ikb kinase beta inhibitor (MLX105) in DLBCL lines | <0.001 | <0.001 | NFKBIA, NFKBIE, BCL2A1, LTA, IL6, IRF4, PIM1 | Lam | 18160665 |
| mSIGDB | DEATHPATHWAY | Caspase cascade triggered through FAS, DR3, DR4, or DR5 | <0.001 | 7.7E-03 | CASP3/6/9/10, TRAF2, BID, BIRC2/3, BCL2 | BioCarta | N/A |

C

| Source | Gene Set | Annotation | p-value | FDR | Example Enriched Gene(s) | Primary Author | PMID |
|--------|-------------------------------------|---|---------|--------|--|----------------|-------------------|
| mSIGDB | HS03010_RIBOSOME | Large and small ribosomal subunits | <0.001 | <0.001 | RPS23A/15A/4Y1/3A, RPL6/30/35A | Kanehisa | 18077471 |
| mSIGDB | RIBOSOMAL_PROTEINS | Cytoplasmic ribosomal proteins | <0.001 | <0.001 | RPS3A/4Y1/5/6/6KA1/7/8/9/10, RPL3L/6/7A/9/10/13/14/15/18 | van Lersel | N/A |
| SIGDB | IS_49_RIBOSOMAL_PROTEIN | Ribosomal Cluster | <0.001 | <0.001 | RPSA/3A/5/20, RPL37/13/P1 | Shaffer | 11567628 |
| SIGDB | IS_112_PROLIFERATION_NODE1606 | Proliferation-associated cluster | <0.001 | <0.001 | HDAC1, MBP2, RPN2, PTBP1, OXA1L | Su | 15075390 |
| mSIGDB | SERUM_FIBROBLAST_CELLCYCLE | Cell-cycle dependent genes, serum response of fibroblasts | <0.001 | <0.001 | CCNA2, MCM4/5, CKS1B, CDCA7, BUB1, | Chang | 14737219 |
| SIGDB | IS_113_PROLIFERATION_NODE1618 | Proliferation/Cell Cycle-associated cluster | <0.001 | <0.001 | CDC2, CDCA3/8, NUSAP1, MCM4/5/7, CCNB1/2 | Su | 15075390 |
| SIGDB | IS_148_CELL_CYCLE_CHO&WHITFIELD | Cell-cycle periodic genes | <0.001 | <0.001 | CCNA2/B2, MCM4/7, BUB1, TOP2A | Cho/Whitfield | 11137997/12058064 |
| SIGDB | IS_89_BLIMP_PROLIFERATION_REPRESSED | Repressed by BLIMP-1 Proliferation | <0.001 | <0.001 | CKS1B, MCM4/7, TUBB, ACTB, RB1 | Shaffer | 12150891 |
| SIGDB | IS_157_CELL_CYCLE_LIU | Cell-cycle periodic genes | <0.001 | <0.001 | CENPL1, CCNA2, CDCA8, RAD51C | Liu | 15123814 |

Figure 4A

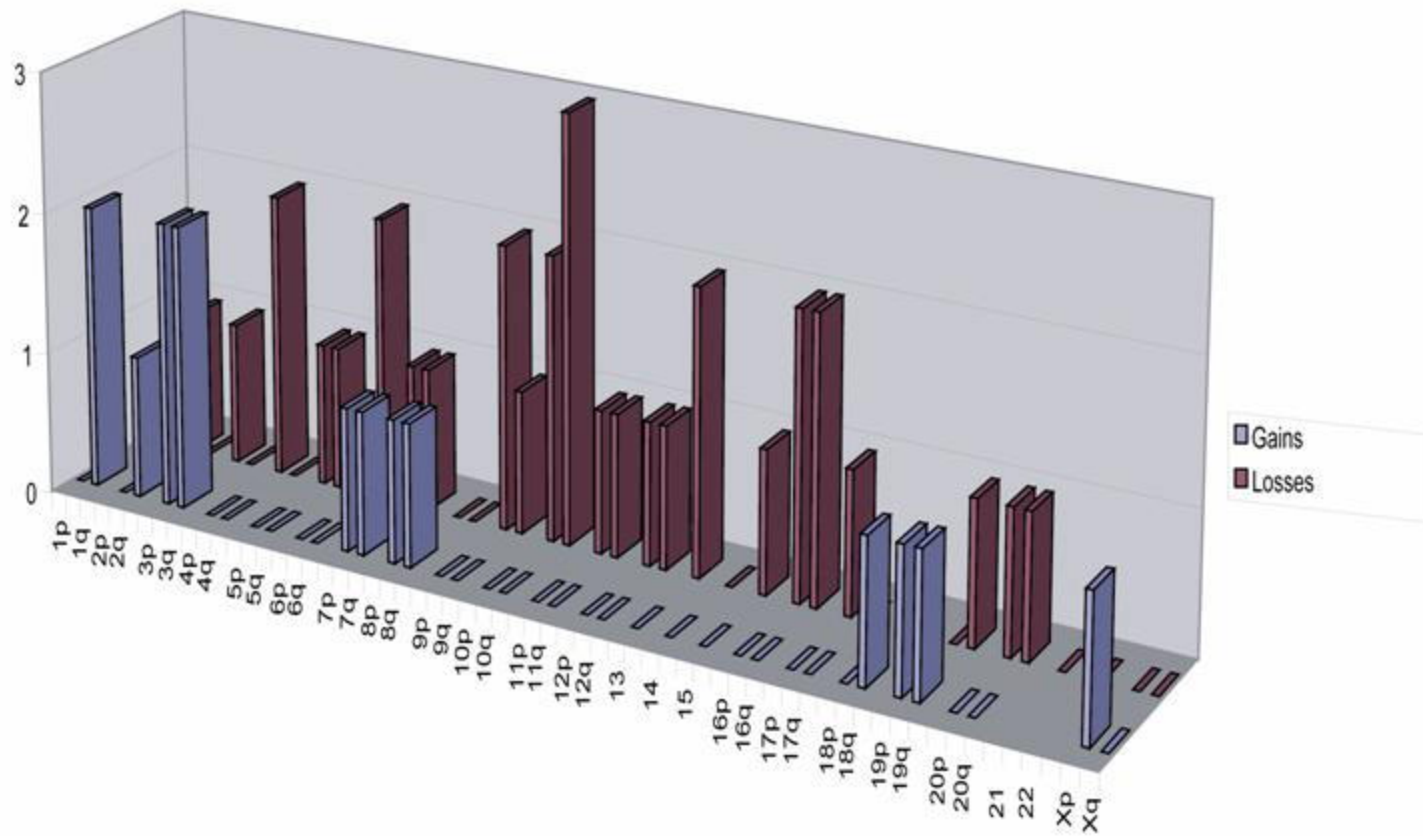


Figure 4B

