

Fig. 5. Association of Mec1 with sites near the HO-induced DSB. (A) Kinetics of Mec1 association with DSB. (B) Effect of the rad9 $\Delta$ , rad24 $\Delta$ , and  $ddc1\Delta$  mutations on Mec1 association with DSB. Cells transformed with pGAL-HO or the control vector were processed and subjected to a chromatin immunoprecipitation assay, as in Fig. 2B (A) and Fig. 2C (B). Strains used (11) contain  $MAT\alpha$  and MEC1-HA.

the association of Mec1 with DNA lesions remains to be determined. ATR and hRad9 are human homologs of Mec1 and Ddc1, respectively (1), and localize to nuclear foci that may contain regions of damaged DNA (27, 28). Because homologs of the checkpoint genes have been identified in other species, it is likely that the mechanism described here is conserved in the checkpoint control among eukaryotic cells.

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- 11. All strains were isogenic with KSC006 and were derived using standard genetic techniques. Strains are MATa except for those indicated as  $MAT\alpha$ . To express Rad53-HA, cells were transformed with YCpT-RAD53-HA, a TRP1 marker version of YCpRAD53-HA (16).
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- 17. Yeast cells were cultured in medium containing 2% sucrose, and then one-half of the culture was maintained in sucrose and the other half was incubated with 2% galactose to induce HO expression. Cells were converted to spheroplasts with the

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use of oxalyticase (50  $\mu g/ml)$  in 50 mM Hepes-KOH (pH 7.5); 100 mM NaCl; 0.4 M sorbitol; 50 mM NaF; 5 mM PNPP; 1 mM Na3VO4; 0.5 mM PMSF; aprotinin (13 µg/ml); leupeptin (5 µg/ml); pepstatin (5 µg/ml); and 1 mM benzamidine. Spheroplasts were lysed by adding Triton X-100 (0.25%) and were subsequently cross-linked with 1% formaldehyde for 15 min at 4°C. Immunoprecipitation of cross-linked DNA was performed essentially as described (29) with the use of monoclonal antibody 12CA5 to HA. DNA was also purified from the whole cell extract (designated "input"). PCR was done in 50-µl volumes containing 1/25 of the anti-HA antibody immunoprecipitates or 1/1200 of input, respectively. The PCR products were separated in 2% agarose gels and were stained with ethidium bromide. The sequences of primers for the are as follows: HO1 set at  $MAT\alpha$ locus, 5'-CCAGATTTGTATTAGACGAGGGACGGAG-TGA-3' and 5'-AGAGGGTCACAGCACTAATACAGC-TCGTAAT-3'; HO2 set at MATα locus, 5'-GGTG-TCCTCTGTAAGGTTTAGTACTTTTGT-3' and 5'-CA-CAGATGAGTTTAAATCCAGCATACTAGACA-3'; and SMC2 locus 5'-AAGAGAAACTTTAGTCAAAACAT-GGG-3' and 5'-CCATCACATTATACTAACTACGG-3'.

Cells were processed and incubated with mouse an-18. tibody to HA (16B12; Babco, Richmond, CA). Antibody binding was detected using Cy3-conjugated anti-mouse antibody (Jackson ImmunoResearch, West Grove. PA).

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## The Plasticity of Dendritic Cell **Responses to Pathogens and Their Components**

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Dendritic cells are involved in the initiation of both innate and adaptive immunity. To systematically explore how dendritic cells modulate the immune system in response to different pathogens, we used oligonucleotide microarrays to measure gene expression profiles of dendritic cells in response to Escherichia coli, Candida albicans, and influenza virus as well as to their molecular components. Both a shared core response and pathogen-specific programs of gene expression were observed upon exposure to each of these pathogens. These results reveal that dendritic cells sense diverse pathogens and elicit tailored pathogen-specific immune responses.

How organisms respond appropriately to the wide variety of pathogens and antigens they encounter on a daily basis remains a central question in immunology. It has recently been shown that pattern recognition receptors expressed on immune cells contribute to the specific detection of pathogens (1, 2). However, the downstream target genes induced by the different pathogens have not been fully determined. The importance of dendritic cells (DCs) in initiating immune responses led us to investigate at a genetic level how DCs discriminate different pathogens (3). DCs reside in an immature state in most tissues, where they recognize and phagocytose pathogens and other antigens (4). Direct contact with many pathogens leads to the maturation of DCs, which is characterized by an increase in antigen presentation, expression of costimulatory molecules, and subsequent stimulation of naïve T cells in lymphoid organs (4). The extensive reprogramming of DCs during maturation prompted us to measure the corresponding changes in gene expression. We used oligonucleotide microarrays (5) to test to what extent DCs discriminate between phylogenetically diverse pathogens and whether the commonly studied molecular components of these pathogens are sufficient to account for the live pathogen response.

Human monocyte-derived DCs (6) were exposed to a diverse set of organisms and com-

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pounds: a Gram-negative bacterial species, E. coli, and its cell wall component, lipopolysaccharide (LPS); a fungus, C. albicans, and yeast cell wall-derived mannan; and an RNA virus, influenza A, and double-stranded RNA (dsRNA). DCs were cultured (6) with pathogens or their components between 1 and 36 hours (7) and RNA was isolated, labeled, and hybridized to microarrays (8, 9). Each pathogen stimulation was repeated in three independent donors, and each component stimulation was repeated in two donors. Genes with expression levels that changed in response to stimuli (termed regulated genes) were selected on the basis of repeated differences in the expression levels of the treated and untreated samples across multiple time points (10). Of the ~6800 genes represented on the oligonucleotide array, a total of 1330 genes changed their expression significantly upon encounter with one of the pathogens or components (10). Such a large-scale change in gene expression demonstrated that DCs are able to undergo a marked transformation in their cellular phenotype.

Analysis of the individual responses to pathogens showed that a unique number of genes was regulated by each pathogen. Influenza and *E. coli* were able to modulate the expression of exclusive subsets of genes (Fig. 1, A and C) (11), whereas *C. albicans* only modulated the expression of a subset of *E. coli*–regulated genes (Fig. 1B). In addition, gene expression was most rapidly induced by *E. coli*, less rapidly by *C. albicans*, and most slowly by influenza (*12*).

The intersection of the three different pathogen responses revealed a common set of 166 highly regulated genes (Fig. 1, A and D). To describe the dynamics of DC response after exposure to any of the three pathogens, we classified these genes according to their kinetics of expression and known biological functions (Fig. 2) (13). Immediately after contact with any of the three pathogens, a rapid decline was observed in the transcript levels of genes associated with phagocytosis and pathogen recognition (Fig. 2B). At the same time, there was a transient increase in the expression of immune cytokines, chemokines, and receptors that contribute to the recruitment of monocytes, DCs, and macrophages to the site of infection. Also strongly induced was a set of cytoskeletal genes that may potentially mediate shape change and migratory behavior of activated DCs. The induction of signaling genes and transcription factors in the middle phase may be involved in preparing the DC to be receptive to regulatory signals in the lymphatics and lymph nodes. In addition, several antigen processing and presentation genes were induced to high levels in a sustained fashion. Genes

E. coli C. alb

С

involved in generating reactive oxygen species (ROS) were induced across the time course, which suggests that infecting organisms are killed throughout DC maturation and migration. Finally, during the late phase, chemokine receptors known to mediate responses to lymph node chemokines, thereby mediating DC migration, were upregulated (14). The set of 166 genes described here thus constitutes part of a core DC response. This response is elicited independently of pathogen characteristics and unfolds as a temporally ordered cascade that modulates both innate and adaptive immune responses (Fig. 2C).

In contrast, analysis of the E. coli-specific genes (Table 1 and Fig. 1E) showed that DCs also strongly and rapidly up-regulated most innate immune genes on the array, including inflammatory cytokines, neutrophil- and monocyte-attracting chemokines, and prostaglandin pathway components. This potent inflammatory response probably is partially counteracted by interleukin-10 (IL-10) that is induced in the middle phase. At later times, genes that regulate the adaptive immune response were induced, including T cell-stimulating genes, secreted cytokines, and a subset of chemokines that are thought to attract naïve  $T_{H}2$  T helper cells (15). An unexpected class of cytokine receptors that share a

E. coli C. alb

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**Fig. 1.** Pathogen-regulated gene expression in human monocyte-derived DCs. (**A**) Overlapping sets of *E. coli–, C. albicans–,* and influenza-regulated genes (*10*). Numbers in the overlapping region of the Venn diagram represent common regulated genes. Numbers of pathogen-specific genes are shown inside the stippled circles (*11*). Some pathogen-specific genes are also found in the common group but are much more strongly regulated in one pathogen than in others. (**B**) Representation of mRNA expression levels at 0, 1, 2, 4, 8, 12, and 24 hours in



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response to *E. coli* and *C. albicans*. Each gene is represented by a single row of colored bars, and each time point is represented by a single column. Color bars represent the ratio of hybridization measurements between corresponding time points in the pathogen and control medium profiles, according to the scale shown. Genes are placed in groups corresponding to pairwise overlaps shown in accompanying Venn dia-

grams. From top to bottom: *E. coli*– but not *C. albicans*–regulated genes; common regulated genes; *C. albicans*– but not *E. coli*–regulated genes. (C) Gene profiles and overlaps for *E. coli* and influenza. (D and E) Gene expression of common response genes [(D), see also Fig. 2] and differential response genes [(E), same genes as in Table 1] in three independent donors.

common  $\gamma$  chain (IL-2R, IL-7R, IL-15R, and IL-4R) were also induced. The expression of these receptors may allow DCs to respond to lymphocyte-derived interleukins within the lymph node.

All these immunostimulatory responses may be enhanced through induction of additional induced gene families (Table 1) (12)—for example, cell stress genes that modulate levels of antimicrobial ROS, antiapoptotic genes that may extend the lifetime of the infected DC (16), and the lateexpressing matrix metalloproteases that may allow processing of cytokines and DC migration to lymph nodes (17). Genes with undefined roles in DC function were also regulated by *E. coli*, including signaling molecules, transcription factors, adhesion molecules, and many of the glycolytic genes. HIF1 $\alpha$ , a known transcription factor of glycolysis genes, was also up-regulated (18). Collectively, these diverse changes of gene expression in response to *E. coli* and LPS reflect a significant cellular and immunological reprogramming of the DC.

Relative to the response of DCs to *E. coli*, their response to *C. albicans* was greatly attenuated in many functional categories and constituted a subset of the *E. coli* response, with a much smaller number of immune genes and with no robust *C. albicans*-specific genes (Fig. 1, A and B, and Table 1). Because many of the immune genes are known to be regulated by the transcription factor NF- $\kappa$ B (*19*), this difference may be partially explained by the relatively weak



**Fig. 2.** Expression kinetics of common response genes in DCs. (A) Schematic transient (T) and sustained (S) gene expression profiles based on self-organizing map clusters of up-regulated genes (*38*). Temporal clustering of up-regulated genes is based on the expression kinetics of *E. coli*-responsive genes (E, early; M, middle; L, late). Down-regulated genes (down) were placed into a single cluster. (B) Function of genes regulated at different times in response to any pathogen; underlined genes are down-regulated; all others are up-regulated. GenBank accession numbers are listed in (*12*). (C) Stages in DC life: encounter and phagocytosis of pathogens, activation of the adaptive immune cells, and apoptosis.

NF-κB up-regulation (Table 1).

DCs regulated a large number of genes in response to influenza, comparable to the number regulated in response to E. coli. However, the innate immune response was relatively weak and completely devoid of genes capable of stimulating neutrophils, as confirmed by a neutrophil chemotaxis assay (12). The adaptive response to influenza was also distinct from the response to E. coli. The antiviral genes-those encoding interferon (IFN)  $\alpha$  and  $\beta$ —were strongly induced, as were the interferon-inducible chemokine genes (Table 1). This suggests possible effects on induction and migration of naïve T<sub>H</sub>1 cells (15). An important subset of genes induced by influenza are linked with the inhibition of the immune response at certain stages. These include proapoptotic genes that may lead to early death of infected cells (16)as well as genes encoding mcp-1, which can block IL-12 production in macrophages (20); HLA-E, which can inhibit natural killer cells (21); Gfrp, a close homolog of a protein that inhibits NO synthesis (22); and IDO, which can inhibit T cell activation (23). Influenza also modulated the expression of a large set of genes involved in diverse cellular functions and whose contribution to pathogenhost interactions may not have been studied previously (12).

To further dissect the ability of DCs to discriminate pathogens, we investigated whether individual pathogen components were sufficient to elicit these differential pathogen responses. Despite additional active molecules known to be present on bacteria, LPS was able to mimic and account for almost the entire bacterial response (Fig. 3A). Unexpectedly, the fungal component mannan mimicked the magnitude and biological character of the bacterial response more closely than it did the fungal or viral response profiles (Fig. 3, A and B) (12). Although dsRNA was a less potent stimulator of the bacterial response, it did elicit a strong innate response com-



Fig. 3. Relation between pathogen- and component-responsive genes. (A) Overlapping sets of pathogen-regulated and corresponding component-regulated genes (as in Fig. 1). (B) Comparison of *E. coli*-regulated and other component-regulated genes.

parable to that induced by bacteria, and at the same time elicited aspects seen in the viral response (Fig. 3, A and B) (12). Thus, all three components were able to elicit the expression of many innate immune genes as well as most of the genes in the common pathogen response. This finding shows that the core DC program can be triggered by multiple stimuli with diverse molecular structures.

Genome-scale studies of DC transcriptional responses have allowed us to demonstrate the existence of common and differential pathogen recognition pathways. Although there have been reports of changes in gene expression in DCs in response to LPS, the response to pathogens has not been thoroughly investigated (24, 25). Differential immune responses to pathogens have been described in clinical and animal studies (26-28), and we show here that these responses are reflected by changes in DC gene expression.

The temporal cascade of gene expression in the common response to pathogens [which is also induced by Gram-positive Staphylococcus aureus (29)] accounts for core DC functions and delineates the essential role of DCs in linking innate recognition of pathogens with antigen presentation and the development of an adaptive T cell response (30-33). The existence of this common response reflects a convergence of pathways from receptors that are known to distinguish some of these components and pathogens. In contrast, the presence of pathogen-specific gene expression in most functional categories (including transcription factors and cytokines) suggests that distinct pathways are activated by different pathogens. These differential responses demonstrate that human monocytederived DCs are flexible in their responses and may even exhibit a diversity of responses similar to that of the different DC subtypes (34, 35).

The extensive plasticity of the DCs observed in our experiments indicates that the concept of DC maturation cannot be simply defined by the modulation of a standard set of markers (4). Instead, we propose that DCs not only are capable of generating a core response to any pathogen, but also exhibit stimulus-specific maturation and activation. For each stimulus, particular subsets of genes are modulated and lead to important physiological consequences. There is likely to be even more differential regulation in vivo, depending on DC subtype, cell interactions, and tissue location. Determining whether these unique responses are advantageous to the pathogen, or to the host, is essential for understanding host-pathogen interactions (36). Further studies of these pathogen-regulated genes may thus enhance our understanding of DC maturation and provide future targets for immunotherapy.

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**Table 1.** Functional categories of genes regulated differentially in response to *E. coli, C. albicans*, and influenza. Code: +, gene expression is up-regulated in response to pathogen; -, gene expression is not changed; ++ and +++, gene expression is changed at a higher level relative to other pathogens that regulate the same gene (each + denotes increased expression by a factor of  $\sim$ 2.5); +/-, gene expression is regulated in a subset of donors; d, gene expression is down-regulated.

GenBank accession no.	E. coli	C. albicans	Influenza
	Innate		
Y00787	+ + +	+	+
X54489	+ + +	+	+/-
M57731	+ + +	+	+/-
X53800	++	+/-	+/-
X02910	++	+	+
	+ + +	+	+
	++	+	+
	+	_	_
	++	_	_
	++	+	++
	++	+/-	+/-
	+		+/-
			+/-
		·	.,
	++	+	+
	_	_	+
U04636	++	+	+
	Adaptive		
	·		
M65290	++	+	-
U59286	+	+	++
X72755	+	+	++
X02530	+	+	++
V00535	+	-	++
J00207	_	-	+
J00210	-	-	+ + +
V00533	_	-	+
M28585	-	-	+
D43767	++	+	+/-
			+/-
005171	I	I	
1102200			
		_	+/-
			+
			+
			++
LU8 187	++	+	-
		-	++
X71874	+	+	+/-
U02020	+ + +	+	+
Im	mune receptor		
		+/-	+
			+
			_
			+/-
			-
			-
			_ ++
			++
			-
			-
		-	-
		++	++
Imm	une transcription		
S76638	++	+/-	+
M58603	++	+/-	++
L19067	+	+	+
M83221	+	+/-	-
	accession no. Y00787 X54489 M57731 X53800 X02910 X04500 X04602 M28983 X03656 M69203 U64197 U77180 L15702 e D38128 L28175 U04636 M65290 U59286 X72755 X02530 V00535 J00207 J00210 V00533 M28585 D43767 U83171 U03398 U33017 U04343 M24283 L08187 J00105 X71874 U02020 Im U31628 M29696 X01057 X71874 U02020 Im U31628 M29696 X01057 X52425 X17648 D49410 U03397 M32315 Y10659 M24406 Z11697 Imm	accession no.      E. coli        Innate      Innate        Y00787      +++        X54489      +++        M57731      +++        X53800      ++        X02910      ++        X04500      +++        X04602      ++        M28983      +        X03656      ++        M69203      ++        U64197      ++        U77180      +        L15702      ++        P38128      ++        L28175      -        U04636      ++        V059286      +        X72755      +        X02077      -        J00207      -        J00210      -        V00533      -        M28585      -        D43767      ++        U03398      ++        U03397      +++        J00105      ++        X71874      +        U02020      +++        Immune receptor        U31628	accession no.      E. coli      C. abbicans        Innate      Innate        Y00787      +++      +        X54489      +++      +        M57731      +++      +        X02910      ++      +        X04602      ++      +        X04602      ++      +        M28983      +      -        Y00787      ++      +        V00703      +      +        M69203      ++      +        U6197      ++      +        U6197      +      +        U64197      +      +        U64197      +      +        U64197      +      +        U64197      +      +        U6436      +      +        U5286      +      +        V00535      +      -        V00535      +      -        V00535      -      -        V03307      +++      +        U03017      +++      +

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- Elutriated human monocytes (Advanced Biotechnology Inc.) were differentiated into DCs for 7 days in standard conditions with granulocyte-macrophage colony-stimulating factor (GM-CSF) and IL-4 (12, 30).
- Pathogens or their components were added to DC cultures (10<sup>7</sup> cells per plate per time point) at day 7 at the following amounts: *E. coli* SD54 (ATCC) [multiplicity of infection (MOI) 5:1], *Influenza* A/PR/8/34 (750 HAU/mI), *Candida albicans* HLC54 (5:1 MOI), LPS from *E. coli* 055:85 (1 μg/ml, Sigma L-2880), polyinosine-polycytidine (25 μg/ml, Pharmacia; endotoxin levels were *S. cerevisiae* (1 mg/ml, Sigma M-7504). See (12).
- 8. Total RNA at each time point was isolated, labeled, and prepared for hybridization to HuGeneFL oligonucleotide arrays (Affymetrix) using standard methods (12, 37).
- Gene expression measurements were stored, analyzed, and visualized using a set of database and analysis tools developed in the lab. Messenger RNA expression kinetics and induction levels were validated with enzyme-linked immunosorbent assay (ELISA) measurement of tumor necrosis factor (TNF) α, IL-12/p40, IL-10, and MCP-1 protein levels (*12*).
- 10. A scoring system was developed to measure significant change in stimulated expression levels relative to control time course. We collected a time series of mRNA fluorescence levels,  $R = \{R_1, R_2, R_3, \dots, R_n\}$ , in DCs exposed to each pathogen or compound, and a control series of mRNA levels,  $C = \{C_1, C_2, C_3, ..., C_n\}$ , in untreated DCs from the same donor.  $R_i$  and  $C_i$  are steady-state mRNA hybridization measurements ("average difference" in Affymetrix terminology) at the ith time point; n is the total number of time points. We devised a score,  $S_i = (R_i - \mu_c)/\sigma_c$ , to measure deviation of the stimulated expression level at one time point, R, from the mean,  $\mu_c$ , of all the time points in the control time course. By using  $\sigma_c$ , the standard deviation of the control time course, the score penalizes genes with high noise in the media control, thus allowing us to extract the most robust data. Up-regulated and down-regulated genes were selected according to criteria described in (12).
- Stimulus-specific genes (Figs. 1 and 3, stippled circles) were selected if the ratio of relative expression levels between stimuli was larger than 2.5, or if the data passed a stringent stimulus-specific filter based on the score (12).
- 12. Supplementary information is available on *Science* Online (www.sciencemag.org/cgi/content/full/294/ 5543/870/DC1) and our lab's Web site (http://web. wi.mit.edu/hacohen/dc).
- 13. A self-organizing map algorithm (38) was used to cluster genes on the basis of similarity of their temporal expression profiles and allowed us to classify genes into six groups: genes that peak at early, middle, or late phases of the time course, and, for each of these, genes that are expressed transiently or in a sustained fashion (Fig. 2A). We also assigned each of the regulated genes to functional categories according to the public databases and the Proteome annotated database (Human PSD, kindly provided through a collaboration with Proteome Inc.).
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Table	1.	Continued
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Gene	GenBank accession no.	E. coli	C. albicans	Influenz
stat4	L78440	++	+	_
stat3	L29277	+	+	+/-
irf2	X15949	+	-	+
irf4	U52682	+	+/-	+/-
isgf3	M87503	+	+/-	+
csda	M24069	++	-	-
	Glyco	olysis and energy		
eno1	M14328	+	-	d
pk3	X56494	++	-	+/-
tpi	J04603	+	-	-
gys	J04501	+	_	d
pgm1	M83088	+	+/-	d
gk	X69886	+	+/-	-
pfkp	D25328 V00572	++	-	_ +/_
pgk1 a2pdb	X01677	+	-	+/-
g3pdh ldh1	X02152	+	_	+/= +/-
pgd	U30255	+	_	+/-
pga pgam1	J04173	+	+	+
hif1α	U22431	+	_	+/-
ing r a	011.01	Apoptosis		
nhibitor		r -r 310		
pai2	M31551	++	-	_
iex-1	S81914	++	+	_
tax1bp1	U33821	+	-	+/-
flip	AF005775	++	+	+/-
bag1	Z35491	+	+	+/-
ciap2	U37546	++	++	+
bcl2-a1	U29680	++	+	+
mcl1	L08246	+	-	+
tau	X56468	+/-	+/-	++
Activator				
casp4	U28014	++	+	+/-
nip3	U15174	++	+/-	-
trail	U37518	+	+	++
fas	X63717	+	+	+
casp5	U28015	+	-	+
bak1	U16811	+/-	+/-	+
pmaip1	D90070	+	-	++
casp10	U60519	+/-	+	+
		actors and receptor	2	
tgfa	X70340	+	-	-
ndp	X65724	+++	_	-
wnt5a	L20861	+++	+/-	-
activinβa	X57579	+ + +	++	+
p2x4	AF000234	+	+	-
vdr	J03258	+	+/-	-
		ue remodeling		
mmp9	J05070	+/-	+	-
mmp7	L22524	++	-	-
mmp3	X05232	+	_	_
mmp19	X92521	+	+/-	+/-
mmp14	Z48481	++	_	+/-
mmp12	L23808	++	+	_
mmp10	X07820	+	-	-
mmp1 lad1	X54925 U42408	++	-	_ +/_
extl2	U76189	+/-	-+	+/-+/-
collagen-a1	M55998	+	_	
tnr	X98085	+	_	+/-
		Cell stress		
mt1g	J03910	+++	+/-	+/-
mt1e	M10942	+++	+/-	+/-
btg2	U72649	++	+/-	-
fth1	L20941	++	+	_
quiescin	L42379	++	+/-	_

#### Table 1. Continued

Gene	GenBank accession no.	E. coli	C. albicans	Influenza
ddit1	M60974	++	_	+/-
map3k4	D86968	++	+/-	+/-
mt1l	X76717	++	-	+/-
mt1h	X64177	++	+	+
mt2a	V00594	++	+	+
hspa1a	M11717	++	+/-	++
ninj1	U72661	++	+	++
sod2	X07834	++	+	++
atox1	U70660	+	+	-
hspa6	X51757	+	+/-	-
krs1	U26424	+	+/-	-
mt1a	K01383	++	-	-
mt1f	M10943	+	-	-
rtp	D87953	++	+/-	-
cyp450db1	X07619	+	+/-	+/-
gst12	U46499	+	-	+/-
hsf4	D87673	+	-	+/-
hspa4	L12723	+	-	+/-
dusp1	X68277	+	-	+
mtf	X78710	+	-	+
hsp70	U10284	+/-	-	+
hsp27	Z23090	-	+/-	+++
cbr1	J04056	+/-	+	+
	Imi	mune inhibitors		
mcp1	S69738	+	++	++
il10	U16720	++	_	_
hla-e	X56841	_	_	+
gfrp	U78190	d	_	+
ido	M34455	++	+/-	++

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