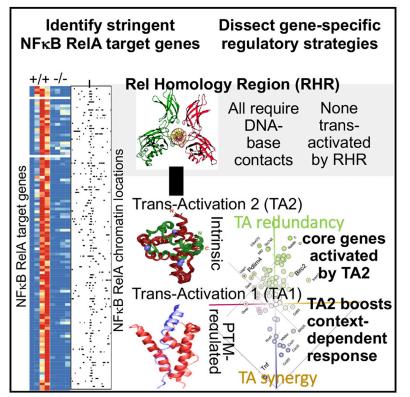
# **Cell Reports**

## Dissecting the Regulatory Strategies of NF-κB RelA Target Genes in the Inflammatory Response Reveals Differential Transactivation Logics

### **Graphical Abstract**



### Authors

Kim A. Ngo, Kensei Kishimoto, Jeremy Davis-Turak, ..., Gourisankar Ghosh, Simon Mitchell, Alexander Hoffmann

### Correspondence

ahoffmann@ucla.edu

### In Brief

Ngo et al. developed a genetic complementation system for NF- $\kappa$ B RelA that reveals that NF- $\kappa$ B target-gene selection requires high-affinity RelA binding and transcriptional activation domains for gene induction. The synergistic and redundant functions of two transactivation domains define proinflammatory and inflammation-response genes.

### **Highlights**

- NF-κB target gene control is defined by transcriptomics, epigenomics, and math modeling
- NF-κB target genes require RelA transactivation domains TA1/TA2 in AND-or-OR logics
- For inflammatory initiators, constitutive TA2 boosts TA1's PTM-regulated activity
- For inflammatory resolvers, TA1/TA2 redundancy renders context-independent control

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## Dissecting the Regulatory Strategies of NF-κB ReIA Target Genes in the Inflammatory Response Reveals Differential Transactivation Logics

Kim A. Ngo,<sup>1</sup> Kensei Kishimoto,<sup>1</sup> Jeremy Davis-Turak,<sup>1,3</sup> Aditya Pimplaskar,<sup>1</sup> Zhang Cheng,<sup>1,4</sup> Roberto Spreafico,<sup>1,5</sup>

Emily Y. Chen,<sup>1,6</sup> Amy Tam,<sup>1,7</sup> Gourisankar Ghosh,<sup>2</sup> Simon Mitchell,<sup>1,8</sup> and Alexander Hoffmann<sup>1,9,\*</sup>

<sup>1</sup>Signaling Systems Laboratory, Department of Microbiology Immunology, and Molecular Genetics (MIMG), Institute for Quantitative and Computational Biosciences (QCB), Molecular Biology Institute (MBI), University of California, Los Angeles, Los Angeles, CA 90095, USA <sup>2</sup>Department of Chemistry and Biochemistry, University of California, San Diego, La Jolla, CA 92037, USA

<sup>3</sup>Present address: OnRamp BioInformatics, Inc., 8996 Miramar Road, Suite 308, San Diego, CA 92126, USA

<sup>4</sup>Present address: Center for Epigenomics, University of California, San Diego, 9500 Gilman Drive, La Jolla, CA 92093, USA

<sup>5</sup>Present address: VIR Biotechnology, 499 Illinois St, San Francisco, CA 94158, USA

<sup>6</sup>Present address: Zymo Research, 17062 Murphy Ave, Irvine, CA 92614, USA

<sup>7</sup>Present address: Department of Systems Biology, Harvard University, Boston, MA, USA

<sup>8</sup>Present address: Brighton and Sussex Medical School, University of Sussex, Brighton, UK

<sup>9</sup>Lead Contact

\*Correspondence: ahoffmann@ucla.edu

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#### SUMMARY

Nuclear factor  $\kappa B$  (NF- $\kappa B$ ) RelA is the potent transcriptional activator of inflammatory response genes. We stringently defined a list of direct RelA target genes by integrating physical (chromatin immunoprecipitation sequencing [ChIP-seq]) and functional (RNA sequencing [RNA-seq] in knockouts) datasets. We then dissected each gene's regulatory strategy by testing RelA variants in a primary-cell geneticcomplementation assay. All endogenous target genes require RelA to make DNA-base-specific contacts, and none are activatable by the DNA binding domain alone. However, endogenous target genes differ widely in how they employ the two transactivation domains. Through model-aided analysis of the dynamic time-course data, we reveal the gene-specific synergy and redundancy of TA1 and TA2. Given that post-translational modifications control TA1 activity and intrinsic affinity for coactivators determines TA2 activity, the differential TA logics suggests contextdependent versus context-independent control of endogenous RelA-target genes. Although some inflammatory initiators appear to require co-stimulatory TA1 activation, inflammatory resolvers are a part of the NF-κB RelA core response.

#### INTRODUCTION

An important concept is molecular biology is the modular domain organization of transcription factors (TFs) (Keegan et al., 1986), typically distinguishing between a DNA-binding domain (DBD) and a separable transcriptional activation domain (TAD) that could be fused to a heterologous DBD. Prominent mammalian TFs, including nuclear factor  $\kappa$ B (NF- $\kappa$ B) RelA (Schmitz and Baeuerle, 1991; Schmitz et al., 1994), conform to the modular domain model. Such studies used exogenous reporter genes that provided a convenient assay for TF activity. However, they lacked the physiological context of endogenous regulatory regions, which may involve complex protein-protein interactions and are often considerable distances from the transcription start site. Indeed, subsequent studies provided numerous examples in which the functional distinction between DNA binding and transcriptional activation did not neatly segregate into distinct structural domains, with the DBD providing transcriptional activity (Corton et al., 1998) or, conversely, not being required for TF recruitment to the target gene (Kovesdi et al., 1986).

Given that the regulatory context of endogenous target genes determines a TF's mode of function, next-generation TF structure-function studies may be considered probes of the regulatory diversity of its endogenous target genes. However, only with the advent of quantitative transcriptomic and epigenomic measurement capabilities enabled by next-generation sequencing has it become feasible to undertake such studies. The present study is leveraging such technological development to dissect the regulatory strategies of inflammatory response genes that are regulatory targets of NF- $\kappa$ B ReIA.

The NF- $\kappa$ B family member RelA is a ubiquitously expressed potent transcriptional activator that is induced by exposure to pathogens and inflammatory cytokines to activate the expression of many inflammatory and immune-response genes (Hayden and Ghosh, 2008; Hoffmann and Baltimore, 2006). The signaling mechanisms involved in regulating NF- $\kappa$ B RelA activity have been elucidated in detail (Basak et al., 2012; Mitchell et al., 2016), but there is much more uncertainty about how it controls endogenous target genes. Indeed, although many genes have been identified to be potentially regulated by NF- $\kappa$ B (http:// www.bu.edu/nf-kb/gene-resources/target-genes/), there is no database that lists the NF- $\kappa$ B target genes in a particular physiological condition, defined cell type, and stimulus.



RelA's domain organization is characterized by the Rel homology region (RHR), which mediates dimerization and DNA binding functions (Baeuerle and Baltimore, 1989) and was structurally characterized by X-ray crystallography (Chen et al., 1998a, 2000). However, it is possible that for some endogenous target genes, promoter recruitment of RelA is mediated primarily by protein-protein interactions, for example, via pre-bound CREBbinding protein (CBP) (Mukherjee et al., 2013).

RelA's C terminus contains two transactivation domains, TA1 and TA2 (Ballard et al., 1992; Moore et al., 1993; Schmitz and Baeuerle, 1991), which interact with transcriptional regulatory factors. TA1 consists of an amphipathic helix characteristic of an acidic activation domain and can interact with MED80 subunit of the Mediator complex, Tfb1/p62 subunit of TFIIH, and CBP via the kinase-inducible domain interacting (KIX) domain (van Essen et al., 2009; Lecog et al., 2017; Mulero et al., 2019). TA2 also interacts with CBP/p300 but via the TAZ1 domain with sufficient affinity that it could be characterized by nuclear magnetic resonance (Mukherjee et al., 2013; Nyqvist et al., 2019), as well as MED80. The RHR was reported to interact with CBP as well via phosphorylated S276 (Zhong et al., 2002), and knockin mutations of the S276A or S276E mutation showed complex mouse phenotypes and transcriptional defects (Dong et al., 2008). It also remains possible that trans-activation of some target genes is mediated by other sequences within ReIA, for example, between RHR and TA2/TA1.

Interestingly, a key difference between TA1 and TA2 is the role of post-translational modification (PTM). Unlike TA2, TA1's conformation is thought to be regulated (Savaryn et al., 2016) by phosphorylation of any of seven potential sites (S529, Ser535, S536, S543, S547, S550, and S551 in human ReIA) altering cofactor interactions (Milanovic et al., 2014) and, hence, transcriptional activation potential (Hochrainer et al., 2013). In particular, S536 is a prominent phospho-acceptor site (Christian et al., 2016), which is a reliable biomarker for RelA activity. This suggests a model in which TA1's transactivation activity is dependent on a phosphorylation event that integrates the activity of other signaling pathways, such as CKII, CaMKIV, RSK1, TAK1/TAB1, PI3K/Akt, ATM, and IKK<sub>E</sub> (Bae et al., 2003; Bao et al., 2010; Bird et al., 1997; Bohuslav et al., 2004; Buss et al., 2004a; Haller et al., 2002; Moreno et al., 2010; Sabatel et al., 2012; Sakurai et al., 2003; Wang et al., 2000; Yoboua et al., 2010), whereas TA2's transactivation potential is intrinsic to its biochemical structure. Remarkably, however, it remains unknown whether NF-kB response genes show differential regulation by TA1 versus TA2; this is an important question because TA2-regulated genes would be expected to provide for a core NF-kB-mediated inflammatory response, whereas TA1-regulated genes are dependent on other signaling pathways as well.

Here, we report the stringent identification of endogenous NF- $\kappa$ B target genes induced by tumor necrosis factor (TNF) in primary fibroblasts and a genetic complementation system for RelA variants to probe their regulatory strategies. We found that all RelA target gene binding was dependent on base-specific contacts within the  $\kappa$ B sequence, and all transactivation was dependent on the two C-terminal activation domains; neither the transcriptional activation domain nor did the DNA binding domain proved sufficient for target gene selection or

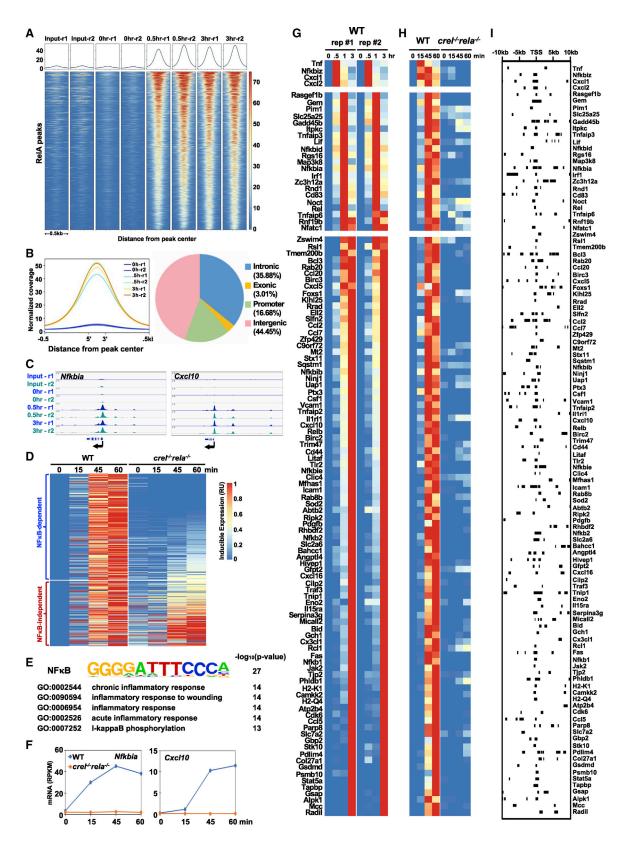
transcriptional activation, respectively. However, we discovered remarkable gene-specific regulatory strategies involving the transcriptional activation domains TA1 and TA2. Although most genes were regulated by both TA1 and TA2, the two transactivations functioned either redundantly or synergistically, forming logical OR-or-AND gates in a gene-specific manner. Although OR gate genes were robustly activated by the constitutive TA2 activity, on AND gate genes TA2's role is to boost the PTM-regulated TA1 activity. Thus, our study distinguishes NF- $\kappa$ B ReIA target genes as being either largely signaling context independent or largely signaling context dependent.

#### RESULTS

#### Stringent Identification of TNF-Responsive NF-kB ReIA Target Genes

To identify high-confidence NF-κB RelA target genes, we applied two rigorous criteria, namely (1) TNF-induced NF-кB/ RelA binding to the target gene's regulatory regions, and (2) TNF-induced transcriptional activation that is genetically dependent on NF-kB. To examine the genome-wide binding pattern of NF-kB, we performed chromatin immunoprecipitation followed by sequencing (ChIP-seq) with ReIA-specific antibodies during a short course of TNF stimulation of 0, 0.5, and 3 h in wild-type (WT) primary murine embryonic fibroblasts (MEFs). Bioinformatic analysis of the replicate datasets (false-discovery rate [FDR] < 0.01) identified in 9,829 RelA peaks that were TNF-inducible at 0.5 or 3 h (Figure 1A). Overall, these ChIP-enriched RelA binding events were notably enhanced at 0.5 h and largely remained at 3 h (Figure 1B, left panel). We identified the locations of these RelA peaks to be 44% in intergenic regions, 17% within promoter regions (comprising 5 kb upstream of the transcription start site), 36% within intronic regions, and 3% within exonic regions of genes (Figure 1B, right panel). Genome browser tracks of two known NF-kB target genes, Nfkbia and Cxcl10, confirmed easily discernible peaks above a low background, and those peaks were highly inducible in response to TNF and highly reproducible between the two datasets (Figure 1C).

To assess the NF-κB-dependent transcriptional response to TNF, we performed gene expression analysis of nascent transcripts via chromatin-associated RNA sequencing (caRNAseq) in WT and  $crel^{-/-}rela^{-/-}$  MEF cells (Figure 1D). We chose caRNA-seq analysis rather than polyA<sup>+</sup> RNA-seq to ensure that we identified transcriptional induction, rather than changes in mRNA levels mediated by post-transcriptional mechanisms, for example, changes in the mRNA half-life. Previous work has shown that the absence of ReIA can be partially compensated for by the NF- $\kappa$ B family member cRel (Hoffmann et al., 2003), necessitating the use of the combination knockout to assess RelA-dependent gene expression. Our 1-h analysis revealed 419 TNF-inducible genes in WT MEFs whose caRNA levels were more than 2-fold induced in WT MEFs at any time point after TNF stimulation relative to the unstimulated (0 h) point (Figure 1D). Setting the maximum reads per kilobase of transcripts per million mapped reads (RPKM) for each gene to 1 and the basal RPKM in unstimulated WT cells to be 0, we plotted data from crel-/-rela-/- MEF cells next to WT data. We found that 259 genes had peak expression values that were less than half



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in the mutant relative to WT, and 160 genes showed expression that was more than half, leading us to label the former as largely "NF- $\kappa$ B dependent" and the latter largely "NF- $\kappa$ B independent." Motif-enrichment analysis of the regulatory DNA regions associated with transcription start sites (TSSs) with HOMER (Heinz et al., 2010) revealed a preponderance of kB sites in the NF-kB-dependent genes but no highly significant motif for NF-κB-independent genes (Figure 1E). Focusing on those that are protein coding (229 and 120, respectively), we undertook gene ontology (GO) analysis with Enrichr Ontologies (Kuleshov et al., 2016) for over-represented functional pathways in each category. We found that the top five most highly enriched GO terms (by p value) for the NF-kB-dependent genes described the inflammatory response and NF- $\kappa$ B activation (Figure 1E), whereas the NF-kB-independent genes did not yield highly significant terms. Line graphs of two NF-kB-dependent genes, Nfkbia and Cxcl10 (Figure 1F), exemplify the high degree of NF-KB dependence in their TNF-induced expression.

To develop the list of stringent NF-κB RelA-regulated target genes, we intersected the above-described physical/binding data (within 10 kb of each gene's TSS) and the genetic/functional data and further ensured that the nascent transcripts were indeed processed into mature mRNAs by performing polyA<sup>+</sup> RNA-seq from total RNA isolated from WT MEF cells in response to TNF, extending our time analysis to 3 h (0.5, 1, and 3 h time points). Selecting for peak fold change in response to TNFs of  $\geq\!2,$  an FDR of <0.01 and  $\geq\!50\%$  NF- $\!\kappa B$  dependence of the maximum value in the time course, we generated a list of 113 stringently selected NF-kB/RelA-regulated target genes (Figure 1G). The replicate datasets showed a high level of concordance. The corresponding caRNA-seq data (Figure 1H) indicate that, aside from the very early gene group, the timing of the peak mRNA abundance may not be driven by transcriptional mechanisms but, rather, by post-transcriptional mechanisms, such as mRNA processing (Pandya-Jones et al., 2013) or mRNA halflife (Hao and Baltimore, 2009). Mapping the RelA ChIP-seq data associated with each gene (Figure 1I) identified probable RelA binding events responsible for gene induction but did not reveal a correlation between ReIA binding location and transcriptional induction dynamics.

## An Experimental System to Dissect Regulatory Strategies of NF-kB RelA Target Genes

To characterize the regulatory strategies of NF-kB RelA-target genes by probing them for their requirements of RelA functional domains, we developed an experimental workflow for retroviral complementation of ReIA-deficient MEF cells with specifically engineered variants of ReIA and performed subsequent transcriptomic analysis in response to TNFs. To prolong the lifespan of primary MEFs (Todaro and Green, 1963), which would otherwise not be amenable for such genetic manipulation, we investigated whether we could use MEFs deficient in p53. Transcripts induced by TNF, interleukin (IL)-1 ß, or lipopolysaccharide (LPS), revealed similar gene expression patterns between two biological replicates of p53-deficient MEFs and their littermate WT controls (Figure S1A). Pairwise comparisons revealed high reproducibility in inducible gene expression between  $p53^{-/-}$ and WT MEFs at each time point (Figures S1B-S1E), justifying the use of p53-deficient MEFs for studies of inflammatory response genes.

To develop the primary MEF RelA complementation system, we bred knockout mouse strains to produce a strain that was not only deficient in NF- $\kappa$ B subunits but also in p53, which allowed production of primary  $p53^{-/-}crel^{-/-}rela^{-/-}$  MEF cells from E12.5 embryos (before embryonic lethality of this genotype at E13). After expansion of these cells for about a week, we retrovirally transduced them with RelA-wt (Figure 2A), selected transduced cells with puromycin, and examined complementation by biochemical assays. Immunoblotting revealed RelA expression in reconstituted cells at about the same level as WT control MEFs (Figure S2A). An electrophoretic mobility shift assay (EMSA) with a  $\kappa$ B site probe showed strong DNA binding activity after TNF stimulation (Figure S2B).

To further test the genetic complementation system, we examined NF- $\kappa$ B RelA binding via RelA ChIP-seq using RelAwt reconstituted MEFs with and without 0.5 h of TNF stimulation on previously identified endogenous NF- $\kappa$ B target genes (Figure 1G), such as *Nfkbia* and *Cxcl10* (Figure 2B). Importantly, we found that RelA-binding peaks identified in WT MEF controls were indeed also present in the reconstituted RelA-wt cells (Figure 2C).

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Figure 1. Identifying NF-κB ReIA Target Genes in the TNF Response of Murine Embryonic Fibroblasts (MEFs)
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(A) Genome-wide binding of NF- $\kappa$ B RelA ChIP-seq in WT MEFs stimulated with 10 ng/mL of TNF at 0.5 and 3 h; 9,829 RelA-binding events were identified in two independent replicate experiments. The heatmap shows read density along ±0.5 kb of DNA centered around the peak read density for each binding event and ordered by high to low read density.

(I) A map of 297 ReIA-binding peaks identified by ChIP-seq for each of the 113 NF-kB target genes within ±10 kb of the TSS, shown in the same order as in (G) and (H).

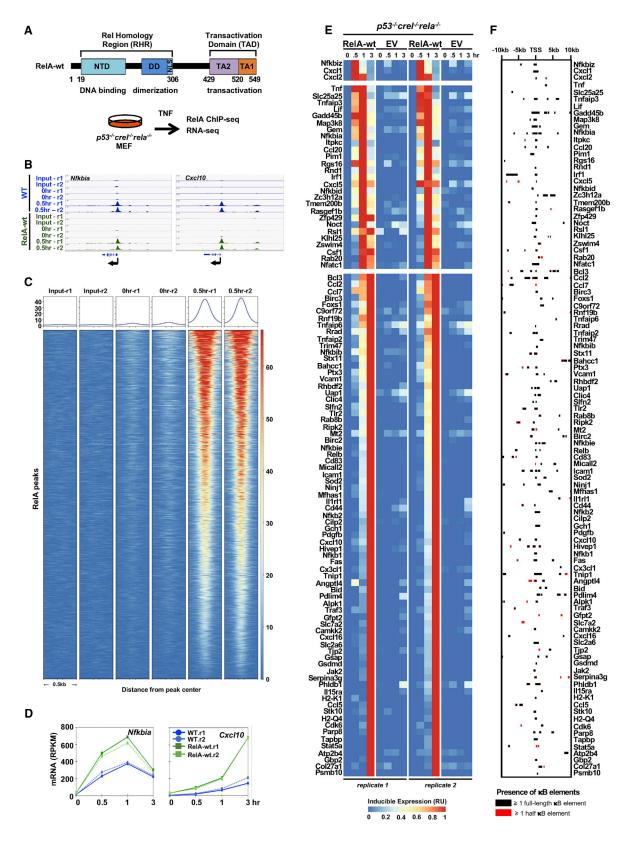
<sup>(</sup>B) Left panel: normalized ReIA ChIP-seq density over identified peaks within the genome. Right panel: pie chart shows where ReIA peaks are found to be located. (C) Genome browser tracks of two replicates (r1 and r2) of ReIA ChIP-seq peaks in WT MEFs for two known NF-κB target genes, *Nfkbia* and *Cxcl10*.

<sup>(</sup>D) Heatmap of the relative induced expression of 419 nascent transcripts measured by caRNA-seq analysis, whose maximal induced expression was  $\geq 1$  RPKM and  $\geq 2$ -fold over basal. Blue to red indicate low to high expression levels, respectively. Of these 419 genes, 229 genes were protein coding and NF- $\kappa$ B dependent, as their maximal expression was <50% in *crel*<sup>-/-</sup>*rela*<sup>-/-</sup> compared with WT MEFs. The heatmap of gene expression is ordered by high to low NF- $\kappa$ B dependence.

<sup>(</sup>E) *De novo* motif and gene ontology analyses for NF-κB-dependent genes identified the most highly enriched motif (within –1.0 to 0.3 kb of the TSS) and GO terms (using Enrichr Ontologies tool [Kuleshov et al., 2016]). For NF-κB-independent genes, top motifs and GO terms showed substantially less significance. (F) Line plots of chromatin-associated RNA (caRNA) abundance in RPKM for known NF-κB target genes, *Nfkbia* and *Cxcl10*.

<sup>(</sup>G) Heatmap of mature mRNA (polyA<sup>+</sup> RNA-seq) relative induced expression, as in (D), for 113 NF-κB target genes, which were defined by the presence of a RelA ChIP-seq peak and TNF-inducible NF-κB-dependent caRNA expression. Two biological replicates of WT MEFs are shown, ordered by their peak time of expression.

<sup>(</sup>H) Heatmap of the relative induced expression of nascent transcripts determined by caRNA-seq for these 113 NF- $\kappa$ B-dependent genes shown in the same order as in (G).



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Next, we examined gene expression responses to TNF in reconstituted MEFs stimulated with TNF using polyA<sup>+</sup> RNA-seq. We found high reproducibility in replicate reconstituted MEFs on Nfkbia and Cxcl10 (Figure 2D). Extending our analysis to the 113 NF-κB target genes, a scatterplot analysis demonstrated good correlations in polyA<sup>+</sup> RNA expression patterns between WT MEF controls and the reconstituted RelA-wt MEFs at each time-point analysis (Figure S2C). Specifically, we found that 104 genes satisfied the same criteria applied to WTs and  $crel^{-\bar{l}-}rela^{-l-}$  MEFs, namely TNF fold-change over time of  $\geq 2$ , an FDR of <0.01, and  $\geq$ 50% NF- $\kappa$ B dependence of the maximum expression value in the time-course (Figure 2E), thereby validating the primary MEF complementation system. In sum, our analysis revealed 104 NF-κB target genes (Table S1) that showed robust ReIA DNA binding and ReIA-dependent, TNF-inducible expression at both nascent and mature mRNA transcript level.

#### All TNF-Induced NF-κB Target Genes Require that ReIA Makes Base-Specific Contacts within the κB Element

Prior structural and functional studies of NF-κB-DNA complexes demonstrated that NF-kB binds to a variety of kB sites, in which NF-kB recognizes 9–11-bp palindromic kB DNA elements to the sequence 5'-GGR(N<sub>3-5</sub>YCC)-3' (Hoffmann et al., 2006). Using that information, we identified all kB DNA elements that were associated with all identifiable ReIA ChIP-seq peaks (Figure 1I) for each of the 104 genes (Table S1). Mapping the ReIA ChIPseq data and KB DNA elements associated with each gene within 10 kb of their TSSs (Figure 2F), we found kB DNA elements for 223 RelA binding peaks on 104 genes. Those 223 RelA binding events harbor 617 full-kB and 12,768 half-kB DNA elements with an FDR of <0.01. When the FDR is relaxed to <0.05, then the 234 ReIA binding events are identified as harboring 663 full-kB and 14,072 half-kB DNA elements, and the conclusions are confirmed (Figure S2D). Overall, we did not observe a correlation between the relative affinity of the kB site sequence determined by in vitro protein-binding-DNA microarrays (Siggers et al., 2011) and the number of reads within a peak (Figure S2E).

To determine whether DNA-base-specific contacts of the ReIA protein are in fact required for recruiting NF- $\kappa$ B to target sites and for activating target genes upon inflammatory stimulation, we generated a triple amino acid mutation (R35A, Y36A, and E39A), depicted in Figure 3A, termed the ReIA DNA-binding mutant (ReIA<sup>DB</sup>). The mutations abrogate base-specific contacts within the  $\kappa$ B sequence (Figure 3B; Chen et al., 1998a). We retro-

virally transduced that DNA-binding mutant into primary  $p53^{-\prime-}crel^{-\prime-}rela^{-\prime-}$  MEFs and examined the NF- $\kappa$ B by biochemical assays. Immunoblotting confirmed expression of reconstituted RelA<sup>DB</sup> protein, albeit at slightly lower levels (about 75%) than found with RelA-wt (Figure 3C). Co-immunoprecipitation confirmed that the RelA<sup>DB</sup> mutant was able to associate with p50 to form dimeric NF- $\kappa$ B and to interact with p105, I $\kappa$ B $\alpha$ , and I $\kappa$ B $\beta$  to form higher-order I $\kappa$ B-NF- $\kappa$ B complexes, characteristic of latent NF- $\kappa$ B in unstimulated cells (Figure S3A). We next assessed the NF- $\kappa$ B DNA-binding activity via EMSA and found that RelA<sup>DB</sup> showed no  $\kappa$ B-site-binding activity in response to TNF stimulation, unlike the RelA-wt control (Figure 3D), although immunoblotting of the nuclear extracts confirmed the nuclear presence (Figure S3B). In sum, the RelA<sup>DB</sup> mutant does not support high-affinity NF- $\kappa$ B DNA-binding *in vitro*.

We next examined NF-kB RelA binding in vivo by RelA ChIPseq. On previously identified 9,829 endogenous chromatin sites (Figure 1A), the ReIA<sup>DB</sup> mutant showed dramatically diminished TNF-induced RelA binding (Figure 3E). For example, on Nfkbia and Cxcl10 genes, TNF-induced RelA binding was dramatically reduced (Figure S3C). Focusing on the 104 NF-κB target genes (Figure 2E), we evaluated every previously identified ReIA binding peak and found that most showed a substantial >2-fold reduction in the RelA<sup>DB</sup> mutant (Figure 3F). Detailed differential RelA ChIP peak analysis (Table S1) revealed that those few RelA peaks that were less affected by the  $\mbox{RelA}^{\mbox{DB}}$  mutant were generally less prominent in WT cells (Figure 3G), which we interpreted to be indicative of the strong contribution of high-affinity DNA binding ability. Furthermore, they generally showed poorer κB site motifs, as guantified by *in vitro* protein-DNA microarray studies (Figures 3H and S3D). Overall, our analysis reveals that NF-kB RelA selects most inflammatory-response target genes via direct ReIA-DNA interactions via base-specific contacts.

Next, we investigated whether the reduced  $\kappa$ B recruitment of the DNA binding mutant results in a diminished transcriptional response from the NF- $\kappa$ B target genes. We performed polyA<sup>+</sup> RNA-seq in reconstituted MEFs stimulated with TNF over a 3-h course analysis (0.5, 1, and 3 h). Examining the model target genes, *Nfkbia* and *Cxcl10*, we found that the RelA<sup>DB</sup> mutant did not support their gene expression (Figure S3E). Extending the analysis to the 104 NF- $\kappa$ B target genes, we found that the TNF-induced gene expression response was almost entirely abolished in the RelA<sup>DB</sup> mutant cells (Figure 3I). This is also evident in a principal-component analysis (PCA) of the 104 genes (Figure S3F), which shows that the transcriptional response of

Figure 2. A RelA Genetic Complementation System for Studying the Control of Endogenous NF-KB RelA Target Genes

<sup>(</sup>A) Schematic of the domain structure of the mouse ReIA protein (with relevant amino acid numbers) and the primary cells to be complemented and the experimental assays to be performed.

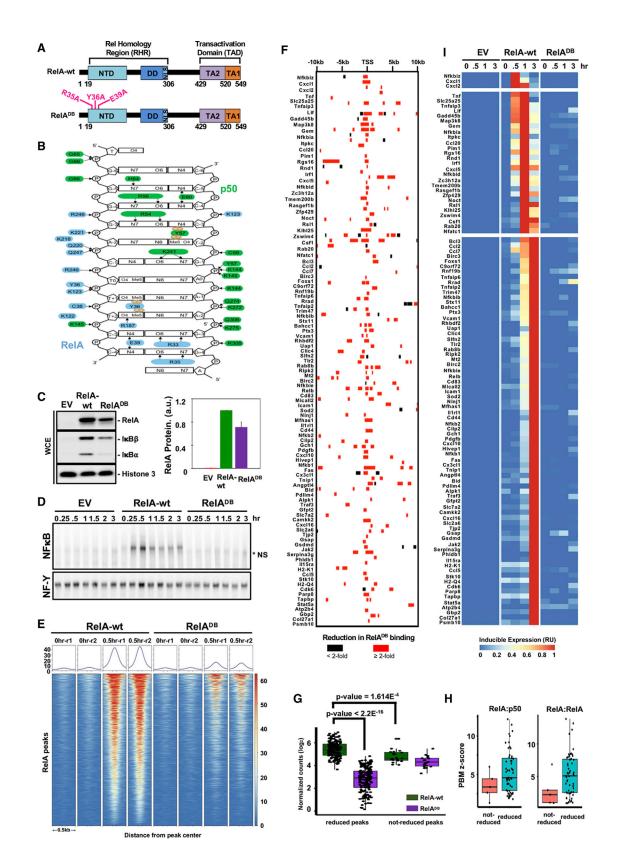
<sup>(</sup>B) Genome browser tracks of RelA binding events on the *Nfkbia* and *Cxcl10* genes in WT MEFs and *p53<sup>-/-</sup>crel<sup>-/-</sup>rela<sup>-/-</sup>* MEFs reconstituted with RelA-wt, data from two independent experiments (r1 and r2) are shown.

<sup>(</sup>C) Heatmap of the read density along  $\pm 0.5$  kb of ReIA ChIP-seq peaks after 0.5 h of TNF treatment for 104 genes identified as NF- $\kappa$ B-dependent genes in WT MEFs and  $p53^{-/-}crel^{-/-}rela^{-/-}$  MEFs reconstituted with ReIA-wt.

<sup>(</sup>D) Line plots of mRNA expression in RPKM of Nfkbia and Cxcl10 genes analyzed by polyA<sup>+</sup> RNA-seq.

<sup>(</sup>E) Heatmap of relative induced expression in reconstituted ReIA-wt and empty vector (EV) in *p53<sup>-/-</sup>crel<sup>-/-</sup>* MEFs, as determined by polyA<sup>+</sup> RNA-seq. Two independent experiments are shown.

<sup>(</sup>F) A map of the NF- $\kappa$ B binding sites ( $\kappa$ B DNA sequences) within each of the 223 ReIA ChIP-seq peaks identified with an FDR < 0.01 and associated with the 104 NF- $\kappa$ B target genes. Full  $\kappa$ B elements refer to 9-, 10-, and 11-bp sequences conforming to the consensus: 5'-GGR(N<sub>3-5</sub>)YCC-3', where R = A or G; Y = C or T; N = any nucleotide (A, C, G, or T). Half- $\kappa$ B elements refer to 5'-GGR-3' and 5'-YCC-3'.



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the mutant largely overlaps with the empty vector control. Only one gene retained 50% transcriptional activation, *Rrad* (Rasrelated glycolysis inhibitor and calcium channel regulator). Close examination revealed some residual RelA binding within the promoter region (Figure S3G), including a  $\kappa$ B binding site at –123 bp (5'-GGGAATCCCC-3'), whose 4G stretch could provide sufficient affinity to heterodimeric NF- $\kappa$ B via the p50 binding partner (Cheng et al., 2011).

In sum, our analysis showed that for most genes the triple amino acid mutation abrogates TNF-induced *in vivo* DNA binding (ReIA ChIP data) and target gene expression. Our results suggest that ReIA target-gene selection depends on base-specific interactions between ReIA and the  $\kappa$ B site; our data do not rule out that protein-protein interactions with chromatin-bound factors contribute to binding-site selectivity but indicate that such interactions do not suffice for the activation of inflammatory response NF- $\kappa$ B target genes.

## All TNF-Induced NF-κB Target Genes Are Regulated by Two C-Terminal TA Domains

To investigate the role of RelA's C-terminal region in the transcriptional activation of endogenous NF- $\kappa$ B target genes, we first generated two truncated, variant forms of murine RelA: a full truncation of its C-terminal region (deleting aa 326–549;  $\Delta$ 326–549), referred to as C-term<sup> $\Delta$ </sup>; and a deletion specifically of its two TA domains (deleting residues 429–549;  $\Delta$ 429-549), referred to as TAD<sup> $\Delta$ </sup> (Figure 4A).

Immunoblotting of reconstituted MEFs showed close to WT expression of the TAD<sup> $\Delta$ </sup> mutant but slightly lower levels of ReIA, I $\kappa$ B $\alpha$ , and I $\kappa$ B $\beta$  in the C-term<sup> $\Delta$ </sup> mutant (Figure 4B). Nevertheless, NF- $\kappa$ B DNA-binding activity was detected by EMSA at comparable levels to that of reconstituted ReIA-wt controls (Figure 4C). Upon stimulation, both mutants showed a normal onset of TNF-inducible binding activity of NF- $\kappa$ B; however, post-induction repression characteristic of TNF-induced NF- $\kappa$ B activity was abrogated, indicative of defective negative-feedback control. Indeed, no TNF-induced *Nfkbia* mRNA expression was observed in either mutant (Figure 4D).

Extending the analysis to RNA-seq data of the 104 NF- $\kappa$ B target genes, the PCA plot showed that both mutations result

in severe deficiency in TNF-induced gene-expression response (Figure 4E), largely equivalent to the empty vector (EV) control. Single-gene analysis by heat-map visualization confirmed that global picture (Figure 4F): none of the 104 genes showed normal TNF induction, with only one gene, *Slfn2*, being induced to about 50% in the TAD<sup>Δ</sup> mutant. In sum, despite the elevated TNF-induced NF- $\kappa$ B activity in these mutant cells (because of deficient negative feedback control), the data indicate that all transcriptional activation functions of NF- $\kappa$ B require the C-terminal activation domains TA1 and TA2.

To determine whether NF-kB target genes have differential requirements for either TA1 or TA2, we constructed variants of RelA (Figure 5A), a deletion mutant lacking residues 520-549 that define the TA1 (hereafter is referred to as TA1<sup> $\Delta$ </sup>); a double amino acid mutant L449A and F473A, which abrogates the ReIA TA2 function of interacting with the TAZ1 domain of transcriptional coactivator, CBP/p300 (Mukherjee et al., 2013), referred to as (TA2<sup>CI</sup>); and a double mutant (TA2<sup>CI</sup>TA1<sup>Δ</sup>). (Internal deletion of TA2 appeared to disrupt the function of TA1, which prompted us to design point mutations within the domain.) After reconstitution of  $p53^{-/-}crel^{-/-}rela^{-/-}$  MEFs, we confirmed that expression levels of RelA variants and the canonical IkBs were close to those in RelA-wt control (Figure 5B). Further, gelmobility shift analysis confirmed that those targeted mutations did not interfere with NF-kB dimerization, activation, and DNA binding to  $\kappa B$  sites upon TNF stimulation (Figure 5C). However, similar to C-term<sup> $\Delta$ </sup> and TAD<sup> $\Delta$ </sup> mutants examined previously, we found that NF-kB DNA-binding activity was persistent over the 3-h time, indicative of a loss of proper negative-feedback control. Indeed, TNF-induced Nfkbia mRNA expression was substantially diminished in single mutants and abrogated in the double mutant (Figure 5D).

To extend the gene expression analysis to the 104 NF- $\kappa$ B target genes, we analyzed RNA-seq data for all described mutants. PCA revealed that both single mutants showed global deficiencies in the TNF-induced gene expression response, whereas the double mutant appeared almost entirely deficient in transcriptional activation, akin to the complete TAD<sup> $\Delta$ </sup> mutant (Figure 5E). Interestingly, visualizing the data at single-gene resolution in the heatmap format (Figure 5F) revealed subtle

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Figure 3. High-Affinity Binding by ReIA Is Required for the TNF-Induced Expression of All NF-KB Target Genes
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(A) Schematic representation of the targeted mutations in the DNA binding mutant of murine ReIA (R35A, Y36A, and E39A).

(F) A map of RelA binding events associated with 104 NF- $\kappa$ B target genes indicating whether RelA binding is reduced  $\geq$ 2-fold in the RelA<sup>DB</sup> mutant (red bar). (G) Quantification and comparison of RelA peaks shown in (F). Averaged normalized counts from two replicates of RelA ChIP-seq experiments in RelA-wt or RelA<sup>DB</sup> expressing MEFs are plotted to compare RelA peaks that are highly dependent on high-affinity binding by RelA versus those that are less dependent. For each category, Mann-Whitney U-test results indicate that peaks less dependent on high-affinity binding by RelA show a lower read count in RelA-wt control cells. (H) Correlation between RelA ChIP-seq peaks and protein-binding microarray (PBM)-determined z-scores of the strongest- $\kappa$ B binding-site sequences for RelA:peaks; the five with the strongest z-scores were plotted.

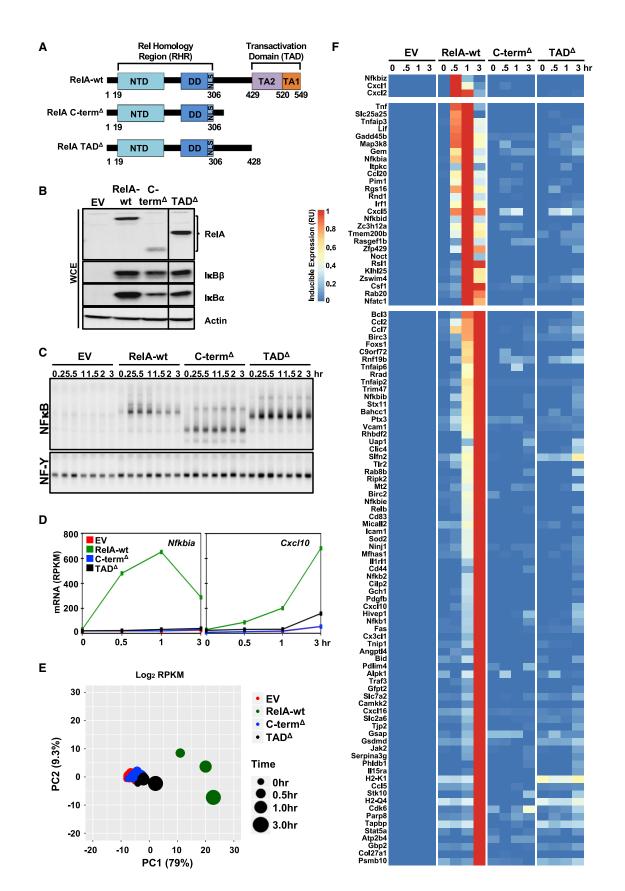
(I) Heatmap for the transcriptional TNF response of the 104 target genes in genetically complemented ReIA-wt and ReIA<sup>DB</sup> cells, analyzed by polyA<sup>+</sup> RNA-seq.

<sup>(</sup>B) Schematic of the  $\kappa$ B DNA contacts made by RelA:p50 NF- $\kappa$ B heterodimer, adapted from Chen et al. (1998a). The heterodimer structure reveals base-specific contacts made by specific amino acids in the RelA protein, indicating the critical roles of R35, Y36, and E39. Arrows denote hydrogen bonds; brown ovals indicate Van der Waals contacts.

<sup>(</sup>C) Protein expression of RelA,  $I\kappa B\beta$ ,  $I\kappa B\alpha$ , and histone 3 as loading control, by immunoblot in unstimulated cells genetically complemented with indicated EV, RelA-wt, and RelA<sup>DB</sup>. Quantified protein expression is shown on the right. Error bars represent the standard deviation from two independent experiments.

<sup>(</sup>D) Analysis of nuclear NF- $\kappa$ B activity by EMSA with  $\kappa$ B and NF-Y (loading control) probes of nuclear extracts prepared at indicated times after TNF stimulation of genetically complemented cells shown in (C). The data are representative of two independent experiments. \*NS, non-specific band.

<sup>(</sup>E) Heatmap density shows ReIA ChIP-seq peaks at 9,829 locations defined in Figure 1A, in genetically complemented (ReIA-wt and ReIA<sup>DB</sup>)  $p53^{-/-}crel^{-/-}rela^{-/-}$  MEFs in response to 0.5 h of TNF stimulation.



differences in the functionality of the mutants that warranted a quantitative analysis.

#### A Model-Aided Analysis Reveals Gene-Specific Logic Gates Formed by ReIA TA1 and TA2

For each RelA target gene to assess the functional requirements of TA1 and TA2 quantitatively, we had to address the potentially confounding effect of alterations in the NF- $\kappa$ B activation time course (Figure 5C). We developed a mathematical formalism that considered both the measured time courses of mRNA and the NF- $\kappa$ B DNA-binding activity that drives transcription; hence, an ordinary differential equation (ODE) model of RelA-dependent gene expression was constructed (Figure 6A). The model consists of a single ODE representing the rate of change of the mRNA that resulted from NF- $\kappa$ B-driven synthesis and mRNA decay (see Method Details). NF- $\kappa$ B DNA binding activity and the specific activation activity ( $k_{act}$ ) of the particular RelA variant.

Given the DNA binding activity measured for each ReIA TA mutant, we could identify the activation rate  $(k_{act})$  for each gene that optimally accounts for the measured mRNA profile (Figure 6B). Other parameters ( $K_D$ ,  $n_{hill}$ ,  $k_{deg}$ ) were also fit but assumed to be the same for all ReIA variants because they represent intrinsic properties of the gene promoter of mRNA. Particleswarm optimization was used to minimize the distance between simulated RNA time courses and the measured RNA-seq data for each of the 104 genes, and the model was able to recapitulate the experimental findings indicating that altered activation strengths associated with each TA mutant could explain the altered RNA-seg results (Figure 6C). A stringent criterion  $(\ln(dist) < -2.5$ , see Method Details) was applied to exclude 28 genes with unsatisfactory fits. For the remaining genes, a wide range of activation strengths (kact) values were identified for the TA1  $^{\Delta}$  and TA2  $^{CI}$  mutants, from  ${\sim}1$  (in which TA mutation did not affect gene induction strength relative to RelA-wt) to 0 (where TA mutation of a single TA domain entirely abrogated gene expression) (Figure 6C).

Our hope for this analysis was to identify differences in relative dependence on TA1 versus TA2 among the 104 RelA target genes, and we found modest specificity: for example, inflammatory genes Cxcl2, Cd83, and Icam1 had greater TA1 dependence, whereas Pdlim4 (Src inhibitor) and Gsap (protease) showed a higher degree of TA2 dependence. However, for many genes, the optimally parameterized  $k_{act}$  values for TA1<sup>Δ</sup> and TA2<sup>CI</sup> mutants were correlated (Figure 6C) with marked differences in the degree of the decrease associated with both mutants (Figure 6D). For example, Cxcl1, Cxcl2, and Tnf, showed a substantial decrease in expression when mutating either TA

domain (Figures 6D and 6E, bottom left), whereas II15ra and II1rl1 expression remained normal when either TA domain was removed (Figures 6D and 6E, top right). On the former class of genes, the inability of either TA domain to function effectively on its own suggests that TA1 and TA2 function synergistically, whereas, on the latter class of genes, they seem to function redundantly or independently. Thus, the unexpected conclusion from this analysis is that ReIA target genes differ whether they impose an AND gate or an OR gate logic on the two TA domains within ReIA. Given that the activity of TA1 is thought to be dependent on the phosphorylation status of serines in its amphipathic helix, an AND-versus-OR gate logic determines distinct regulatory role for TA2: in the latter case, TA2 may be primary driver of transcriptional activation, but in the former case, TA2 merely assists or boosts TA1-driven gene activation.

#### A Knockin Mouse Reveals that Regulatory Strategies of RelA Target Genes Are Generally Conserved in Different Cell Types but Are Often Stimulus Specific

The complementation of ReIA-deficient primary MEF cells with mutated variants of ReIA allowed us to study the effects of numerous specific mutations on the TNF response. To dissect regulatory strategies of endogenous target genes in other cell types and in response to other stimuli, we engineered a mouse strain that harbors the previously described RelA TA2<sup>CI</sup>TA1<sup>Δ</sup> variant as a knockin mutation, termed ReIA<sup>TA</sup> (Figure S4A). Homozygous RelA<sup>TA/TA</sup> mice are not embryonically lethal, unlike the RelA<sup>-/-</sup> mice, but are sickly and smaller than their heterozygous littermates (Figure S4B), whose genotype was verified by PCR (Figure S4C). To examine whether RelA target genes showed similar or differential regulatory strategies in other cell types and other inflammatory stimuli, we produced extensive RNA-seq data by stimulating WT and RelATA/TA primary MEFs and bone-marrow-derived macrophages (BMDMs) with TNF or Toll-like 4 receptor ligand LPS.

We first identified genes that were activated in both MEFs and BMDMs by a stringent  $\log_2$  fold-change >2 threshold (Figure 7A). We found 37 such genes in response to TNF and 481 in response to LPS stimulation (Figure 7A). After peak-normalizing the data for each gene, we plotted the relative-expression data from WT and *RelA<sup>TA/TA</sup>* MEFs and BMDMs in order of induction peak time in WT MEFs and subsequent hierarchical clustering (Figure 7B). We found that most gene-activation events were diminished in both mutant MEFs and BMDMs. We evaluated the phenotype by plotting the percentage of expression in *RelA<sup>TA/TA</sup>* cells relative to the WT peak expression at the same time point for each gene (Figure 7C). In MEFs, most genes were TA dependent (28/37), and most of those (25/28) were

Figure 4. The ReIA C-Terminal Portion Is Required for TNF Induction of All NF-KB Target Genes

<sup>(</sup>A) Schematic illustrates the RelA variants to be tested: RelA C-term<sup> $\Delta$ </sup> (aa 1–325) and RelA TAD<sup> $\Delta$ </sup> (aa 1–428).

<sup>(</sup>B) Protein expression of RelA, IkBβ, IkBα, and actin as loading controls in the indicated, unstimulated cells assayed by immunoblotting.

<sup>(</sup>C) Analysis of nuclear NF-kB activity by EMSA with kB and NF-Y (loading control) probes of nuclear extracts prepared at the indicated times after TNF stimulation of genetically complemented cells shown in (B). The data are representative of two independent experiments.

<sup>(</sup>D) Line plots of mRNA expression for NF-κB target genes, Nfkbia and Cxc/10, in response to TNF in the same cells.

<sup>(</sup>E) PCA plot of all 104 NF- $\kappa$ B target genes in response to TNF in the same cells.

<sup>(</sup>F) Heatmap of the transcriptional response to TNF of the 104 target genes in the same cells. Relative induced expression is shown.

The data shown in (D), (E), and (F) are averaged RPKM from two independent polyA<sup>+</sup> RNA-seq experiments.

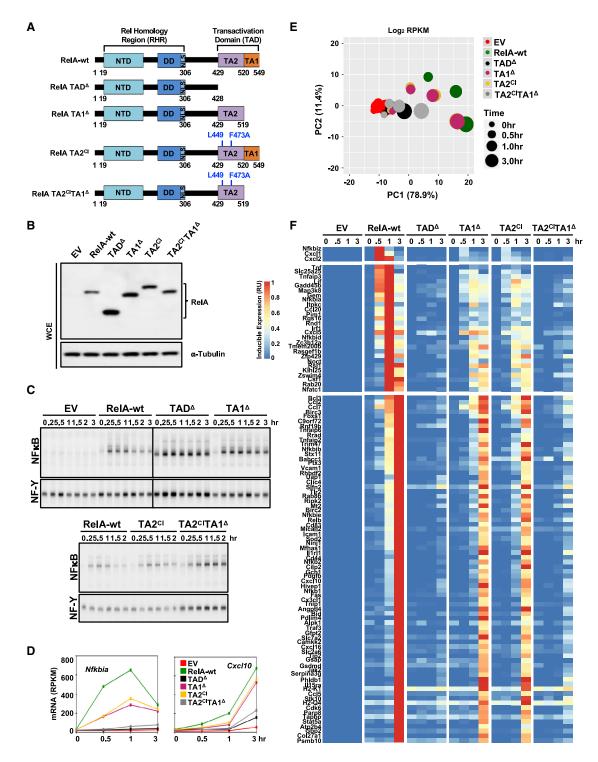


Figure 5. RelA Transactivation Domains TA1 and TA2 Both Contribute to the TNF Response of NF-κB Target Genes

(A) The schematic illustrates the RelA variants to be tested: a deletion mutant of TA1, a CBP-interaction mutant of TA2 (TA2<sup>CI</sup>) and a combination mutant. (B) Protein expression of RelA and  $\alpha$ -tubulin as loading control, in indicated unstimulated cells assayed by immunoblotting with antibodies specific to RelA and  $\alpha$ -Tubulin.

(C) Analysis of nuclear NF- $\kappa$ B activity by EMSA with  $\kappa$ B and NF-Y (loading control) probes of nuclear extracts prepared at the indicated times after TNF stimulation of genetically complemented cells shown in (B). The data are representative of two independent experiments.

(D) Line plots of mRNA expression for *Nfkbia* and *Cxcl10* genes in response to TNF stimulation in the same cells.

also TA dependent in BMDMs. In response to LPS, most genes were TA independent in both MEFs and BMDMs, given the strong activation of NF- $\kappa$ B-independent signaling pathways of IRF3/ISGF3 and MAPK p38. However, of the 154 genes that were identified as TA dependent in MEFs, ~90% showed an equivalent degree of TA dependence in BMDMs. These data suggest that regulatory strategies of ReIA target genes are generally conserved in different cell types when induced by the same stimulus.

We then asked whether regulatory strategies of NF-kB target genes may be stimulus specific. To that end, we identified 146 genes that were induced by both TNF and LPS in MEFs and 185 that were induced by both stimuli in BMDMs (Figure 7D). Heatmap visualization of the gene expression time courses revealed that most genes induced rapidly by TNF peaked later in response to LPS (Figure 7E, left and right panels). Examining their ReIA TA dependence by collapsing the data to the peak time point, we found that, of the 120 MEF genes that were TA-dependent in response to TNF, only 60% showed an equivalent degree of TA dependence in response to LPS, and 15% were entirely TA independent (Figure 7F, left and right panels). Similarly, of the 26 genes whose TNF induction was TA independent, half showed TA dependence in response to LPS. In BMDMs, the lack of equivalence was even more pronounced: only 25% showed an equivalent degree of TA dependence (or independence) in response to TNF and LPS, and more than 40% showed entirely the opposite regulatory requirements for RelA's TA domains.

We also assessed the 104 RelA target genes identified previously in the primary MEF RelA complementation system that were expressed in the knockin MEFs and BMDMs in response to TNF and LPS stimulations (Figure S5A). We found that all of those genes were induced in MEFs by >2-fold but not all of them were induced in BMDMs (grayed out rows marked by an asterisk), indicative of cell-type-specific epigenomes or enhancer landscapes. In response to TNF, induction of all 104 genes was almost entirely abrogated in the *RelA<sup>TA/TA</sup>* MEFs (left panel), whereas in response to LPS, a small subset of genes remained induced.

We wondered whether compensation by cRel, which was documented in  $Re|A^{-/-}$  MEFs (Hoffmann et al., 2003), was affecting our results. We thus bred the RelA<sup>TA</sup> knockin strain to a  $crel^{-/-}$  background and produced RNA-seq data from  $crel^{-/-}Re|A^{TA/TA}$  and  $crel^{-/-}$  MEFs in response to TNF and LPS stimulations. We found that all 104 target genes were induced by both TNF and LPS in  $crel^{-/-}$  control MEFs (Figure S5A). Interestingly, in response to LPS, those genes that showed induction in the mutant, by and large, also showed induction in the mutant by both TNF and LPS by log<sub>2</sub> fold change >2 (and maximum RPKM >1), we found 146 genes in WT MEFs; of which, 145 also satisfied these stringent criteria induced in  $crel^{-/-}$  MEF controls. Our results with

*crel*<sup>-/-</sup>*RelA*<sup>TA/TA</sup> and *RelA*<sup>TA/TA</sup> MEFs demonstrate that the lack of RelA TA dependence is generally not due to cRel compensation (Figure S5C).

The stimulus-dependent requirement of RelA TAs suggested that gene regulatory strategies are stimulus specific. To investigate whether that could be explained by the induction of distinct combinations of TFs, we performed motif-enrichment analysis. We found that regulatory regions of genes that were ReIA TA dependent in response to both TNF and LPS were highly enriched for κB sites (Figure S5C, right panel). In contrast, genes that were TA dependent in the TNF, but not in the LPS, condition, showed enrichment also of interferon response factor (IRF) and PU.1:IRF8 binding sites, akin to previously identified the IRF-NF-κB OR gate genes (Cheng et al., 2017). Further, the 26 genes that showed ReIA TA-independent induction in response to both TNF and LPS did not show enrichment to any stimulus-induced TFs. To further examine whether these TA-independent genes are also NF-kB independent for their transcriptional response, we looked at their TNF response in  $p53^{-/-}crel^{-/-}rela^{-/-}$  MEFs reconstituted with empty vectors and found that almost all showed substantial TNF induction (Figure S5D); whether the data for two outliers is reliable may require additional experiments, but generally, our results indicate that NF-kB's capacity to induce inflammatory-response genes depends on RelA's transactivation domain.

In sum, our transcriptomic analysis using newly developed *Re-IA<sup>TA/TA</sup>* mice revealed that regulatory strategies of RelA target genes were generally conserved between MEFs and BMDMs when the same stimulus was used but that, in either cell type, RelA TA dependence observed in response to TNF was not always correlated with dependence in response to LPS, which also induces IRF family members. These data indicate that some NF- $\kappa$ B target genes are capable of engaging distinct regulatory strategies to different stimuli depending on the availability of stimulus-induced TFs (Cheng et al., 2017, 2015; Ourthiague et al., 2015).

#### DISCUSSION

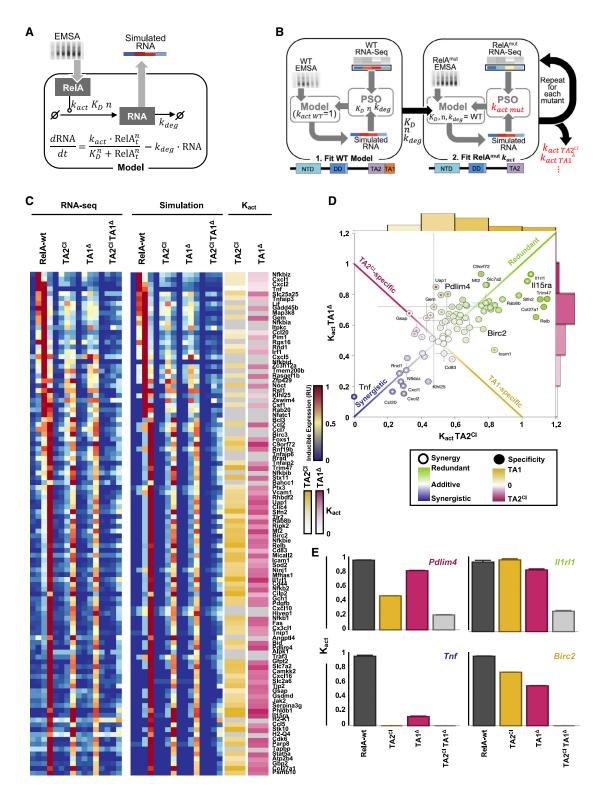
In this study, we reveal gene-specific regulatory strategies of endogenous RelA target genes in primary cells by probing their stimulus-induced expression with engineered RelA variants. We stringently identified target genes by both functional and physical binding criteria, developed an experimental system to test mutational variants in primary cells, and systematically analyzed both chromatin DNA recruitment and transcriptional trans-activation at single-gene resolution. A key transcriptional activation domain mutation was produced as a knockin mouse mutant line to examine other cell types and stimuli, and a mathematical modeling approach enabled a quantitative analysis to reveal gene-specific logic gates formed by the two TA domains.

We first showed that RelA recruitment and transcriptional activation of all endogenous NF- $\kappa$ B target genes induced by TNF are

<sup>(</sup>E) PCA plot of all 104 NF- $\kappa$ B target genes in response to TNF in the same cells.

<sup>(</sup>F) Heatmap of the transcriptional response of the 104 target genes in the same cells. Relative induced expression is shown.

The data shown in (D), (E), and (F) are the averaged RPKM from two independent experiments of EV, ReIA-wt, TAD<sup>Δ</sup>, and TA1<sup>Δ</sup> and 1 polyA<sup>+</sup> RNA-seq replicate of TA2<sup>CI</sup> and TA2<sup>CI</sup>TA1<sup>Δ</sup>.



#### Figure 6. A Math Model-Aided Analysis Reveals Gene-Specific Requirements for TA1 and TA2

(A) Schematic of the ordinary differential equation (ODE) used to obtain simulated mRNA dynamics from quantified NF- $\kappa$ B activity time courses. (B) Schematic of the particle swarm optimization (PSO) pipeline used to quantify the activation strengths ( $k_{act}$ ) for TAD mutants. First  $K_D$ ,  $n_{hill}$ ,  $k_{deg}$  are fit to ReIA-wt data with  $k_{act} = 1$ . The identified parameters are then maintained with the new  $k_{act}$  fit for each TAD mutant to obtain the remaining activation strength (see Method Details). dependent on DNA base-specific contacts. Akin to previous X-ray structural analysis of the NF- $\kappa$ B-DNA complex (Chen et al., 1998b), we observed that some ReIA binding events only contain half sites. Importantly, in our ReIA<sup>DB</sup> mutant analysis, the p50 dimerization partner may still contribute to DNA binding but that appears to be insufficient. Although the gene-expression response to TNF is rapid, future studies may address whether the dependence on DNA base-specific contacts also pertains to longer-term expression dynamics mediated by NF- $\kappa$ B.

Our studies further indicate that all endogenous target genes induced by TNF require the C-terminal region of RelA that harbors two transactivation domains TA1 and TA2. That is remarkable given that S276 was reported to play critical roles in recruiting CBP/p300 (Zhong et al., 1998), and knockin mutant mice harboring the S276A mutation showed striking animal phenotypes and alterations in the expression of many genes, including some known NF- $\kappa$ B target genes (Dong et al., 2008). Our analysis suggests that these mechanisms are insufficient for TNFinduced NF- $\kappa$ B target gene activation and may support the notion that the phenotype of S276 mutation may be due to alterations at larger time and epigenetic scales (Cheng et al., 2008).

By further probing target genes for the roles of the two C-terminal activation domains TA1 and TA2, we found remarkable gene specificity. Target genes did not differ very much in whether they were more highly regulated by TA1 versus TA2, but they differed in whether they required either just TA or required both TAs for gene activation. In other words, some NF- $\kappa$ B target genes allow TA1 and TA2 to function independently, forming a logical OR gate, and some NF- $\kappa$ B target genes require the synergistic function of TA1 and TA2, with the TAs forming a logical AND gate. These distinct regulatory strategies may be mediated by distinct mechanistic requirements for the recruitment of molecular co-activators. For example, genes that exhibit an OR gate logic, are activated sufficiently by recruiting CBP/p300 via TA2, but genes exhibiting an AND gate logic need not only recruit CBP/p300 but also additional co-activators via TA1.

The functionality of TA1 is thought to be regulated by PTMs, particularly phosphorylation, just as the transactivation potential of the NF- $\kappa$ B protein cReI is modulated by TNF-induced serine phosphorylation of S460 and S471 in a gene-specific manner (Starczynowski et al., 2005). In contrast, TA2 is thought to have intrinsic transactivation activity via a high-affinity interaction with CBP/p300. However, within TA2, S467 was also reported as a potential phosphorylation site (Buss et al., 2004b; Geng et al., 2009; Mao et al., 2009; Schwabe and Sakurai, 2005). To investigate whether S467 has a role in the TNF induction of NF- $\kappa$ B target genes in fibroblasts, we constructed the S467A variant within full-length ReIA, TA1-deleted ReIA, or the CBP-

interaction mutant TA2<sup>CI</sup> (Figure S6A). Gel-mobility shift analysis showed TA2  $^{S467A}$  did not alter the DNA-binding activity of NF- $\kappa B$ compared with each respective parent construct (Figure S6B; cf. Figure 5C), and protein expression levels of those RelA variants and the canonical  $I\kappa B\alpha$  and  $I\kappa B\beta$  were normal (Figure S6C). We then undertook polyA<sup>+</sup> RNA-seq analysis, and PCA revealed only minimal alteration in the TNF-induced gene expression response with S467A in the WT or TA2<sup>CI</sup> context (Figure S6D). Furthermore, in a heatmap with single-gene resolution (Figure S6E), we observed very little effect by the S467A mutation. Only chemokines Cxcl1, Cxcl2, and Ccl20, which are rapidly and highly induced, showed a slight reduction but no enhancement. Our data thus confirm that an intrinsic CBP/p300 interaction affinity (probed with the TA2<sup>CI</sup> mutation) is the primary mode of function of the TA2 domain. This contrasts with how TA1's functionality is enhanced by phosphorylation events mediated by coordinated kinases, such as CKII and IKKE (O'Shea and Perkins, 2008; Buss et al., 2004a; Wang et al., 2000).

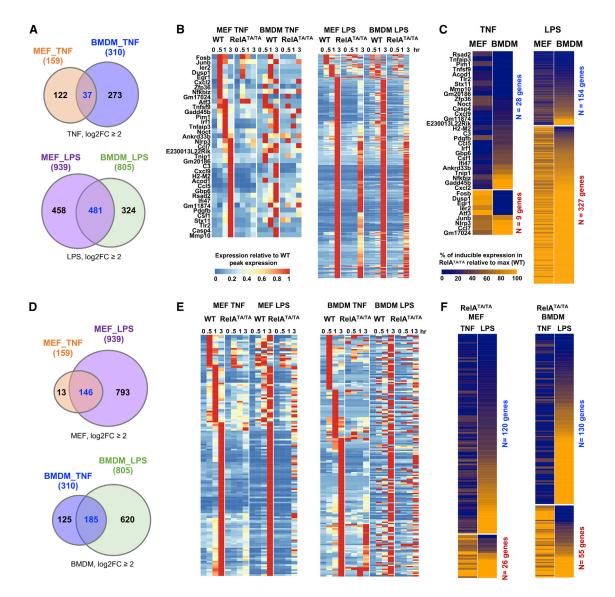
What are the implications of this regulatory distinction of TA1 versus TA2 for the transcriptional control of NF-κB target genes, which differ in how they employ TA1 and TA2? Considering NF-kB target genes that are regulated redundantly by TA1 OR TA2, we would expect them to respond to all inflammatory stimuli that activate the IKK-NF-κB axis because TA2 is effective for its induction, and regulated TA1 activity may merely provide some modulation. In contrast, NF-kB target genes that are regulated synergistically by TA1 AND TA2 will be strongly activated only by those inflammatory stimuli that also induce the phosphorylation of TA1 serines that potentiate its acidic activation function and recruit other necessary regulatory cofactors for the synergistic activation to enhance their transcription through ReIA (Blair et al., 1994; van Essen et al., 2009). Alternatively, TA1 phosphorylation may be a function of the microenvironmental context defined, thus rendering the activation of these gene's tissue context dependent. We note, for such genes controlled by an AND gate of TA1 and TA2, the role of TA2 is effectively to amplify the effect of phosphorylation-mediated regulation of TA1 in activity, rendering them more responsive to these PTMs then if they were regulated by only TA1.

To address why some genes may require the synergistic activity of two TAs, whereas others do not, we first analyzed the content of nucleosome-destabilizing CpG dinucleotides (Ramirez-Carrozzi et al., 2009) in promoter regions. We found that the top 25% target genes (11 genes) regulated synergistically by TA1 AND TA2 had a lower percentage of CG content within  $\pm 300$  bp from their TSS than the bottom 25% (Figure S7A), supporting a model in which a more stable nucleosome is more restrictive to gene activation.

<sup>(</sup>C) Experimental (left, RNA-seq) and simulated best-fit mRNA time-course (middle) heatmaps, along with identified  $k_{act}$  for TA2<sup>CI</sup> (yellow) and TA1<sup>Δ</sup> (pink).  $k_{act}$  is shown relative to RelA-wt with brighter colors indicating closer activity to RelA-wt (no effect of mutation) and white indicating complete loss of activity in the mutant ( $k_{act} = 0$ ). Gray indicating a fit with ln(*dist*) < -2.5 (see Method Details) was not found.

<sup>(</sup>D) Scatterplot of  $k_{act}$  for TA2<sup>CI</sup> and TA1<sup> $\Delta$ </sup> for 76 genes with a good fit in (C). Center color represents the effect of either a single mutation (from green  $k_{act} = 1$  with no change from ReIA-wt and redundancy with respect to a single mutation, to blue  $k_{act} = 0$  where either mutation abrogates gene induction and both domains work synergistically to achieve full gene activation). Border colors represent an off-diagonal effect in which a gene shows a specific loss of induction in TA2<sup>CI</sup> (pink) or TA1<sup> $\Delta$ </sup> (yellow). Gray lines indicate the standard deviation of  $k_{act}$  from three repeated runs of optimization pipeline.

<sup>(</sup>E) Bar graphs of  $k_{act}$  (relative to the mean ReIA-wt  $k_{act}$ ) for ReIA-wt, TA2<sup>CI</sup>, TA1<sup> $\Delta$ </sup>, and TA2<sup>CI</sup>TA1<sup> $\Delta$ </sup> mutants, shown for four example genes arranged to indicate their relative positions in (D). Error bars indicate standard deviations of  $k_{act}$  from three repeated runs of optimization pipeline.



#### Figure 7. A Knockin Mouse Reveals that the Dual TAD Requirement Pertains to Other Cell Types and Stimuli

(A) Venn diagrams display overlap in induced transcriptional response in MEFs and BMDMs. Induced genes satisfy two criteria:  $log_2$  fold-change  $\geq 2$  and maximum RPKM >1, by polyA<sup>+</sup> RNA-seq during a 3-h time-course analysis. In response to TNF, 159 genes are induced in WT MEFs and 310 are induced in WT BMDMs (left panel). In response to LPS, 939 genes are induced in WT MEFs and 805 induced genes in WT BMDMs (right panel).

(B) Heatmaps of relative expression of the induced genes in WT and RelA<sup>TA/TA</sup> mutant MEFs or BMDMs in response to TNF (left panel) or LPS (right panel). Gene names and data plotted in heatmaps are listed in Tables S2A and S2B for TNF and LPS, respectively.

(C) ReIA-TAD dependence of induced genes: percentage of peak expression in ReIA<sup>TA/TA</sup> mutant versus WT. Genes are rearranged by their TAD dependence in TNF stimulation and further re-arranged in each category by LPS response. Genes induced by TNF in MEFs and BMDMs (left panel). Gene names and data plotted in heatmap are listed in Table S2C. Genes induced by LPS in MEFs and BMDMs. Gene names and data plotted in heatmap are listed in Table S2D (right panel).

(D) Venn diagrams displays overlap in induced transcriptional response to TNF and LPS. In WT MEFs, 159 genes were induced by TNF and 939 by LPS (left panel). In WT BMDMs, 310 genes were induced by TNF and 805 were induced by LPS (right panel).

(E) Heatmaps of relative expression of TNF- versus LPS-induced genes in WT and RelATA/TA mutant MEFs (left panel) or BMDMs (right panel). Gene names and data plotted in the heatmap are listed in Tables S3A and S3B for MEFs and BMDMs, respectively.

(F) NF-kB dependence of induced genes: percentage of peak expression in RelA<sup>TA/TA</sup> mutant versus WT. Genes induced by MEFs by TNF and LPS (left panel). Gene names and data plotted in heatmap are listed in Table S3C. Genes induced by BMDMs by TNF and LPS (right panel). Gene names and data plotted in heatmap are listed in Table S3D.

(An alternative model is the co-regulatory function of GC-binding Sp1; Van Essen et al., 2009.) Interestingly, these genes also showed higher  $\kappa$ B motif binding z-scores (Figure S7B), possibly

leading to longer NF- $\kappa$ B residence times, which may allow both TA domains to be engaged in sequential activation mechanisms. Indeed, upon TNF stimulation, those genes showed higher RNA

polymerase II (Pol II) ChIP signals at 0.5 and 3 h (Figure S7C), indicative of higher levels of transcriptional induction.

Examining the types of genes that are regulated redundantly, versus synergistically, by TA1 and TA2, we are struck that many genes that provide for negative regulation of inflammation, such as II15ra, IL1rl1, Trim47, SIfn2, or RelB fall into the former category. For those genes, TA redundancy means that they constitute an inflammatory core response that includes provisions for inflammatory resolution. In contrast, the latter category includes genes that are key initiators of an inflammatory response, such as TNF, Ccl20, Ccl2, and Cxcl1. For these genes, TA synergy means that their expression is activated only in response to a subset of inflammatory stimuli or when tissue-environmental context provides for the co-stimulatory signal that TA1 requires.

The here-described paradigm of NF- $\kappa$ B RelA-responsive gene expression being either redundantly or synergistically mediated by TA1 and TA2 should prompt a range of further studies that extend past work on the signals and pathways that control TA1 phosphorylation and the molecular mechanisms that determine whether a target gene requires the dual TA1/TA2 functionality. We may imagine that the involvement of differential co-activators, mediator complexes, nucleosome movements, or other complex chromatin interactions or recruitment or release of RNA polymerase may have a role in determining diverse regulatory logics.

More broadly, the present study suggests that the structurefunction relationship of key TFs provides an informative probe to dissect the diverse gene regulatory strategies that govern their dozens and hundreds of target genes. Quantitative datasets produced by next-generation sequencing allow a focus on endogenous genes that may be effectively, quantitatively evaluated not only bioinformatically (which evaluates average behavior, assuming commonalities) but also with gene-specific resolution by mathematical models of the gene-expression process to reveal regulatory diversity. Thus, we hope that our study provides an analysis blueprint for future studies; indeed, advances of CRISPR/Cas9 technology that enable the engineering of variants into the endogenous gene locus is powering studies of endogenous gene regulatory circuits at single gene resolution.

#### **STAR**\***METHODS**

Detailed methods are provided in the online version of this paper and include the following:

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#### SUPPLEMENTAL INFORMATION

Supplemental Information can be found online at https://doi.org/10.1016/j. celrep.2020.01.108.

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#### **AUTHOR CONTRIBUTIONS**

K.A.N. and A.H. designed the study. K.A.N. performed the experiments with assistance from E.Y.H.C. S.M. and A.T. performed the computational modeling. K.A.N., S.M., and A.H. wrote the paper. K.A.N., K.K., J.D.-T., Z.C., R.S., and A.P. processed the RNA-seq and ChIP-seq data. K.A.N., K.K., J.D.-T., A.P., Z.C., R.S., S.M., G.G., and A.H. analyzed and interpreted the data.

#### **DECLARATION OF INTERESTS**

The authors declare no competing interests.

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### **STAR**\***METHODS**

#### **KEY RESOURCES TABLE**

AGENT or RESOURCE	SOURCE	IDENTIFIER
tibodies		
bbit polyclonal anti-RelA	Santa Cruz Biotechnology	sc-372; RRID: AB_632037
at polyclonal anti-RelA	Santa Cruz Biotechnology	sc-372G; RRID: AB_632037
bbit polyclonal anti-RelA	Santa Cruz Biotechnology	cat# sc-109; RRID:AB_632039
bbit polyclonal anti-IκBα	Santa Cruz Biotechnology	cat# sc-371; RRID:AB_2235952
bbit polyclonal anti-IκBβ	Santa Cruz Biotechnology	cat# sc-945; RRID:AB_631696
bbit anti-p50 serum	BioBharati LifeScience (BBL), Kolkata, India	Cat#BB-AB0080
use monoclonal anti-tubulin	Santa Cruz Biotechnology	cat#sc-5286; RRID:AB_628411
at polyclonal anti-Actin	Santa Cruz Biotechnology	cat# sc-1615; RRID:AB_630835
bbit polyclonal anti-Histone 3	Abcam	cat# ab1791; RRID:AB_302613
bbit monoclonal anti-p84	Abcam	cat# ab131268; RRID:AB_11156907
emicals, Peptides, and Recombinant Proteins		
S	Sigma, B5:055	cat# L2880
rine TNF	R&D Systems	cat# 410-MT
rine IL-1β	R&D Systems	cat# 401-ML-CF
Glutamine	Corning	cat# 25-005-CI
nicillin-Streptomycin Solution	Corning	cat# 30002CI
nercaptoethanol	ThermoFisher	cat# 21985023
y(deoxyinosinic-deoxycytidylic)	Sigma-Aldrich	cat# P4929
l (polyethylenimine)	Polysciences	cat# #23966-2
ybrene	Santa Cruz Biotechnology	cat# 134220
sticidin	InvioGen	cat# ant-bl
romycin	InvioGen	cat# ant-pr
ISF (Phenylmethylsulfonyl fluoride)	Sigma-Aldrich	cat# P7626
T (Dithiothreitol)	Fisher Scientific	cat# BP172-5
thanol-free Formaldehye solution	ThermoFisher Scientific	cat# 28908
G (disuccinimidyl glutarate)	ThermoFisher Scientific	cat# 20593
TA-free protease inhibitors	ThermoFisher Scientific	cat# 78439
oteinase K	Sigma-Aldrich	cat# P2308
reLink Rnase A	ThermoFisher Scientific	cat# 12091-021
Izol	ThermoFisher Scientific	cat# 15596026
estained Protein marker	BioPioneer	cat# P-001M
tical Commercial Assays		
lent QuikChange II Site-Directed Mutagenesis Kit	Agilent Technologies	cat# 200523
easy Mini Kit	QIAGEN	cat# 74104
ect-zol RNA Microprep Kit	Zymo Research	cat# R2060
NA-seq Library Kit	Kapa Biosystems	cat# KK8421
A-seq Library Kit With RiboErase	Kapa Biosystems	cat# KK8483
BNEXT Ultra DNA Library Prep Kit for Illumina	New England BioLabs	cat# E7370L
DNA BR assay Kit	ThermoFisher Scientific	cat# Q32853
DNA HS assay Kit	ThermoFisher Scientific	cat# Q32854
Pure XP beads	Beckman Coulter	cat A63881
nabeads Protein G	ThermoFisher Scientific	cat# 1004D

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Continued		
REAGENT or RESOURCE	SOURCE	IDENTIFIER
SuperSignal West Femto Maximum Sensitivity Substrate	ThermoFisher Scientific	cat# 34095
Deposited Data		
Reference SuperSeries for all sequencing data in this study	NCBI Gene Expression Omnibus	GEO: GSE132540
Experimental Models: Cell Lines		
primary mouse embryonic fibroblasts (MEFs)	This study	N/A
Platinum-E (Plat-E) cells	(Morita et al., 2000)	N/A
Experimental Models: Organisms/Strains		
Mouse: C57BL/6: All murine embryonic friboblasts	This study	N/A
Mouse: C57BL/6: WT and RelA <sup>TA/TA</sup>	This study	N/A
Oligonucleotides		
NF-Y EMSA probe (5'-GATTTTTCCTGATTGGTTAAA-3'; 5'-ACTTTTAACCAATCAGGAAAAA-3')	This Lab and this study	N/A
κB EMSA probe (5'-GCTACAAGGGACTTTCCGCTGGGG ACTTTCCAGGGAGG-3')	This Lab and this study	N/A
Recombinant DNA		
pBABE-puro vector plasmid DNA	(Morgenstern and Land, 1990)	Morgenstern and Land (Addgene plasmid # 1764; RRID:Addgene_1764)
Software and Algorithms		
Epoch Spectrophotometer System	Biotek	N/A
Qubit 2.0 fluorometer	ThermoFisher Scientific	N/A
ImageQuant TL v8.1	GE Healthcate	N/A
Image Lab v6.0	Bio-Rad	N/A
ImageJ v1.50i	NIH, USA	N/A
ChemiDoc XRS+ Imaging System	Bio-Rad	N/A
Amersham Typhoon Scanner	GE Healthcare	N/A
Mathworks MATLAB	MathWorks, Inc.	R2014a
ChIPseeker v1.18.0	(Yu et al., 2015)	N/A
deepTools2	(Ramírez et al., 2016)	N/A
HOMER	(Heinz et al., 2010)	N/A
Enrichr	(Chen et al., 2013; Kuleshov et al., 2016)	N/A
IGV (Integrated Genomics Viewer)	(Robinson et al., 2011)	N/A
R (v3.6.1)	N/A	http://www.r-project.org/
Wilcox.test function	R program	N/A

#### LEAD CONTACT AND MATERIALS AVAILABILITY

Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Alexander Hoffmann@ucla.edu). All plasmids generated in this study are available from the Lead Contact upon request.

#### EXPERIMENTAL MODEL AND SUBJECT DETAILS

#### Mice

Wild-type and RelA, cRel, p53 gene-deficient C57BL/6 mice were maintained in pathogen-free conditions at the University of California, Los Angeles. The animal protocol for this study were approved by the Institutional Animal Care and Use Committee and by the University of California, Los Angeles Division of Laboratory Animal Medicine. Targeted Neo deleted RelA transactivation domain knock-in mutant mice were generated by ingenious Technology Lab (iTL, https://www.genetargeting.com). Wild-type primary MEFs were generated by crossing wild-type to wild-type mice at 8 weeks of age. p53<sup>-/-</sup>crel<sup>-/-</sup>rela<sup>-/-</sup> primary MEFs were generated by crossing p53<sup>-/-</sup>crel<sup>-/-</sup>rela<sup>+/-</sup> male mouse with p53<sup>-/-</sup>crel<sup>-/-</sup>rela<sup>+/-</sup> female mouse at 8 weeks of age. Wild-type or RelA<sup>TA/TA</sup> primary MEFs were generated by crossing RelA<sup>TA/+</sup> (heterozygous allele) male mouse with RelA<sup>TA/+</sup> female mouse at 8 weeks of age.

#### **Primary Cell Culture**

Wild-type or mutant primary MEFs were generated from E11.5-13.5 embryos of mixed gender and cultured in DMEM supplemented with 10% bovine calf serum (BCS), 1% penicillin-streptomycin and 1% L-Glutamine. BMDMs were made by isolating  $5 \times 10^6$  bone marrow cells from mouse femurs of WT or *RelA*<sup>TA/TA</sup> C57BL/6 mice following red blood cell lysis and seven-day culturing with 30% L929-conditioned medium.

#### **Cell Lines**

Platinum-E (Plat-E) retroviral packaging cell line, a modified cell line derived from HEK293T (Morita et al., 2000), were cultured in DMEM with 10% FBS supplemented with 1% penicillin-streptomycin and 1% L-Glutamine, blasticidin (10  $\mu$ g/mL) and puromycin (1  $\mu$ g/mL).

#### **METHOD DETAILS**

#### **Construction of mutant RelA plasmids**

The pBABE-puro plasmid vector containing ReIA was constructed by ligating the polymerase chain reaction (PCR)-amplified coding region of murine ReIA (amino acids 1 to 549) restricted with EcoRI and Sall. Agilent QuikChange II Site-Directed Mutagenesis Kit (Agilent Technologies) was used for all ReIA point mutation and deletion variants. DNA binding mutant (ReIA<sup>DB</sup>) within amino-terminal were mutated by a triple substitution at residues Arg35, Tyr36, and Glu39 to Ala (R35A, Y36A, R39A). Mutagenesis of the carboxyl-terminal region for C-term<sup>Δ</sup>, TAD<sup>Δ</sup>, and TA1<sup>Δ</sup> were performed by displacing residues Pro326, Ala429, and Ser520, respectively, with a STOP codon sequence. All site-specific mutations were verified by Sanger sequencing analysis and sequencing analyses of the resulting ReIA mutants showed that the targeted sites were the only changes in the DNA sequence.

#### **Genetic complementation of MEFs**

For transfection, Plat-E cells were plated on 10-cm plates 16-hr the day before transfection at 50% confluent in DMEM supplemented with 10% fetal calf serum, 1% penicillin-streptomycin and 1% L-Glutamine. Cells were transfected using 300  $\mu$ L of Opti-MEM medium (ThermoFisher Scientific) and polyethylenimine (PEI; 1  $\mu$ g/ $\mu$ L in 1xPBS pH4.5, Polysciences #23966-2) with 7  $\mu$ g of retroviral construct DNA, pBABE-puro EV control or ReIA expressing constructs (4:1 ratio of PEI ( $\mu$ L):plasmid DNA ( $\mu$ g)). Transfection complex (Opti-MEM medium, PEI reagent, plasmid DNA) were incubated for 20-min at room temperature then added drop-wise to Plat-E cells for 6 hours. Transfected media was replaced with fresh DMEM media containing 10% fetal calf serum, 1% penicillin-streptomycin and 1% L-Glutamine. Cells were further incubated for a total of 48-hr post-transfection and prior to collecting viruses. Viruses-containing supernatant were filtered through a 0.45  $\mu$ m filter and used to infect  $p53^{-/-}crel^{-/-}rela^{-/-}$  MEFs with the addition of 4  $\mu$ g/mL Polybrene. 48-hr post-infection of cells with viruses the stably transduced cells were selected with 2  $\mu$ g/mL puromycin for a total of 72 hours. Post selection with puromycin, puromycin-containing medium was removed and cells are passaged twice for recovery prior to being expanded in culture for experiments. pBABE-puro empty vector without the *RelA* gene fragment was used as a negative control, to maintain a stable retrovirally transduced RelA knockout cell line, meanwhile pBABE-puro containing full-length RelA (RelA-wt) was used as a positive RelA cell line control.

#### Western Blotting

For whole cell extracts,  $3 \times 10^{6}$  cells were lysed with RIPA buffer containing 1mM PMSF and 1mM DTT followed by lysing with 1x SDS-PAGE sample buffer containing 5%  $\beta$ -mercaptoethanol. Protein extracts were separated by SDS-PAGE before transfer to nitrocellulose membranes and subjected to western blotting. Nuclear and cytoplasmic extracts were performed with standard methods as described previously (Hoffmann et al., 2002; Werner et al., 2005). Western blots were probed with antibodies listed in the Key Resources Table and were visualized using SuperSignal West Femto and West Pico (1:10 mixture) Chemiluminescent reagents to detect chemiluminescence released by HRP-labeled secondary antibodies. The resulting proteins were visualized by ChemiDoc XRS+ Imaging Systems (Bio-Rad) and Image Lab (Bio-Rad). Western blots of resulting proteins were quantified using ImageJ software (NIH, USA).

#### Electrophoretic mobility shift assay (EMSA)

EMSA was carried out with standard methods as described previously (Hoffmann et al., 2002; Werner et al., 2005). In brief, 2.5  $\mu$ L total normalized nuclear extracts were incubated for 15-min with 0.01pmol of P<sup>32</sup>-labeled 38bp double-stranded oligonucleotide containing two consensus  $\kappa$ B sites (5'-GCTACAAGGGACTTTCCGCTGGGGACTTTCCAGGGAGG-3'; or with NF-Y loading control (5'-GATTTTTCCTGATTGGTTAAA-3'; 5'-ACTTTTAACCAATCAGGAAAAA-3') in binding buffer [10mM Tris-Cl (pH 7.5), 50mM NaCl, 10% glycerol, 1% NP-40, 1mM EDTA, 0.1mg/mL Poly(deoxyinosinic-deoxycytidylic)], in a final reaction of 6  $\mu$ L. The reaction mixtures were run on a non-denaturing 5% acrylamide (30:0.8) gel containing 5% glycerol and 1X TGE buffer [24.8mM Tris, 190 mM glycine, 1mM EDTA] at 200 V for 2 hours. The gel was visualized by Amersham Typhoon Scanner (GE Healthcare Life Sciences) and analyzed in ImageQuant TL software, in which the NF-Y loading control gel was used to normalize for loading variability.

#### Immunoprecipitation

Whole cell extracts (WCE) were lysed with RIPA buffer containing 1mM PMSF and 1mM DTT. Anti-RelA antibody (Santa Cruz Biotechnology, sc-372G) was conjugated to prewashed magnetic protein-G beads (Life Technologies Dynabeads) for 30-min at room temperature followed by addition unstimulated WCE in RIPA buffer containing 1mM PMSF and 1mM DTT and incubation overnight ( $\sim$ 16-hr). The beads were then washed thoroughly with 1X TBS-T buffer and IP samples were eluted with 1X SDS-sample buffer containing 5%  $\beta$ -mercaptoethanol. Samples were resolved on SDS-PAGE and western blotting with antibodies specific for anti-RelA, anti-I $\kappa$ B $\alpha$ , anti-I $\kappa$ B $\beta$ , and anti-p50.

#### **RNA** isolation and sequencing (RNA-seq)

MEF cells at ~80% confluence were serum-starved by overnight incubation in Dulbecco's Modified Eagle's Medium supplemented with 0.5% bovine calf serum (BCS), 1% penicillin-streptomycin and 1% L-Glutamine prior to stimulation. For chromatin-associated RNA-seq (caRNA-seq), nascent RNA transcripts were prepared from the chromatin fraction (Tong et al., 2016) using TRIzol according to the manufacturer's instruction (ThermoFisher Scientific) and purified using Direct-zol RNA Microprep Kit (Zymo Research cat#R2060). RNA libraries were prepared from ribo-depleted using KAPA Stranded RNA-Seq Kit with RiboErase (KAPA Biosystems, cat#KK8483) with 400ng of starting total RNA material. For polyA+RNA-seq analysis, total RNA was isolated with the QIAGEN RNeasy Mini Kit according to the manufacturer's instructions, quantified using Epoch Spectrophotometer System (Biotek), and purified from 1 µg of starting total RNA material using oligo (dT) magnetic beads before fragmenting at high temperature with divalent cations. Complementary DNA libraries were generated using KAPA Stranded mRNA-Seq Kit (KAPA Biosystems, cat#KK8421), and quantitation was performed using Qubit 2.0 fluorometer using dsDNA BR assay kit #Q32853. Sequencing was performed on Illumina HiSeq 2000 and HiSeq 4000 with single-end 50-bp sequencing, according to manufacturer's recommendations and prepared by Broad Stem Cell Research Center core facility at the University of California, Los Angeles.

#### **RNA-seq data analysis**

Reads were aligned with STAR to Gencode mouse mm10 genome and RefSeq genes and featureCounts were used to obtain aligned raw counts. Only uniquely mapped reads with a mapping quality score of  $\geq 20$  were kept for further analysis, using samtools. Read counts were normalized for library size and transcript length by conversion to RPKM and gene below the maximum RPKM < 1 were excluded from downstream analysis. DESeq2 was used identify induced genes for subsequent analysis using the following criteria:  $\geq 2$ -fold increase in expression at any one time point over basal with FDR threshold of 0.01. Principal components were calculated with prcomp package and plotted with ggplot. caRNA-seq and polyA+RNA-seq heatmaps were plotted using pheatmap package. HOMER (Heinz et al., 2010) was used to assess for enrichment of *de novo* and known transcription factor binding motifs for NF $\kappa$ B dependent genes with promoter sequences 1 kb upstream and 0.3 kb downstream of the transcription start site. An in-depth description of this software can be found at homer.ucsd/edu/homer. Gene ontology analysis in biological processes for NF $\kappa$ B target genes were performed using Enrichr (Chen et al., 2013; Kuleshov et al., 2016). The 5 most enriched GO terms were selected for NF $\kappa$ B dependent genes.

#### Chromatin immunoprecipitation and sequencing (ChIP-seq)

MEF cells (8 × 10<sup>6</sup> cells per plate) were serum-starved overnight with 0.5% BCS medium, then stimulated with 10ng/mL TNF at indicated time points. For ChIP, cells were double cross-linked with 100mM disuccinimidyl glutarate/PBS solution (DSG, ThermoFisher Scientific #20593) for 30-min followed by 1% methanol-free Formaldehye/PBS solution (ThermoFisher Scientific #28908) for 15-min. Cross-linked cells were quenched with 125mM Glycine for 5 min and washed twicewith cold PBS followed by snap freezing with dry ice. The cell pellets were thawed and lysed in Lysis Buffer 1, on ice. Cells were briefly sonicated with Diagenode Bioruptor 300 sonication system (medium power, 15 s ON/15 s OFF, 2 cycles) in Diagenode 1.5mL TPX microtubes (100 µl-max 300 µl/tube). After centrifugation, cell pellets were lysed in Lysis Buffer 2 and incubated for 10 min at room temperature. Following centrifugation, cell nuclear pellets were lysed in Lysis Buffer 3. Nuclear lysates were sonicated with Diagenode Bioruptor 300 sonication system (low power, 30 s ON/30 s OFF, 12 cycles) in Diagenode 1.5mL TPX microtubes. Sonication was stopped every 4 cycles for incubation on ice for 1 min, gentle inversion and pulse-spin. Sonicated nuclear supernatant containing DNA fragments were consolidated with the same sample into a single 1.5 mL polypropelene tube. The lysates were centrifuged at max speed for 10 min at 4°C. The supernatants were transferred to 2 mL no-stick microtubes (Phenix Research cat# MH-820S) with 3 volumes of Dilution buffer and 5 µg anti-RelA antibody (Santa Cruz Biotechnology, sc-372), incubated overnight at 4°C. Next day, antibody-chromatin complexes were incubated with 30 µL magnetic protein G beads (Life Technologies Dynabeads protein G #1004D) for 5 hours at 4°C. Chromatin-immunoprecipitates were washed 3 times (4 min wash at 4°C) with each of the following buffer in this order: low-salt wash buffer, high-salt wash buffer, LiCl buffer, and TE buffer. ChIP DNA was eluted in elution buffer overnight at 65°C. 1% inputs and ChIP DNA fragments were subjected to reverse cross-linking, RNase A digestion (50 µg), Proteinase K digestion (50 µg), and purification with AMPure XP beads (Beckman Coulter). Input DNA samples were quantified with dsDNA BR assay kit #Q32853, and ChIP DNA samples were quantified with dsDNA HS assay kit (Q32854). Quantitation was performed using Qubit 2.0 fluorometer. ChIP-Seq DNA libraries were prepared from 5ng of Inputs or ChIP DNA using NEBNext Ultra DNA Library Prep Kit for Illumina (New England BioLabs, # E7370L).

#### **ChIP Buffer composition**

Lysis Buffer 1: 50mM HEPES-KOH (pH 7.6), 140mM NaCl, 1mM EDTA, 10% Glyercol, 0.5% NP-40, 0.25% Triton X-100 [with freshly added 1X EDTA-free protease inhibitors].

Lysis Buffer 2: 10mM Tris-CI (pH 8.0), 200mM NaCI, 1mM EDTA, 0.5mM EGTA [with freshly added 1X EDTA-free protease inhibitors].

Lysis Buffer 3: 10mM Tris-Hcl (pH 8.0), 100mM NaCl, 1mM EDTA, 0.5mM EGTA, 0.1% Na Deoxycholate, 0.5% N-lauroylsarcosine sodium salt, 0.2% SDS [with freshly added 1X EDTA-free protease inhibitors].

Dilution Buffer: 10mM Tris-Cl (pH 8.0), 160mM NaCl, 1mM EDTA, 0.01% SDS, 1.2% Triton X-100 [with freshly added 1X EDTA-free protease inhibitors].

Low Salt Wash Buffer: 50mM HEPES-KOH (pH 7.6), 140mM NaCl, 1mM EDTA, 1% Triton X-100, 0.1% Na Deoxycholate, 0.1% SDS [with freshly added 0.5X EDTA-free protease inhibitors].

High Salt Wash Buffer: 50mM HEPES-KOH (pH 7.6), 500mM NaCl, 1mM EDTA, 1% Triton X-100, 0.1% Na Deoxycholate, 0.1% SDS [with freshly added 0.5X EDTA-free protease inhibitors].

LiCl Buffer: 20mM Tris-HCl (pH 8.0), 250mM LiCl, 1mM EDTA, 0.5% Na Deoxycholate, 0.5% NP-40

TE Buffer: 10mM Tris-HCI (pH 8.0), 1mM EDTA

Elution Buffer: 10mM Tris-HCI (pH 8.0), 1mM EDTA, 1% SDS

#### **ChIP-seq data analysis**

Sequencing reads were aligned to the mouse mm10 genome and RefSeq genes using Bowtie 2 (Langmead and Salzberg, 2012) and filtered using Samtools. Uniquely mapped reads were used to identify peaks for each sample individually with MACS2 version 2.1.0 using default settings except for FDR of 0.01. Differential RelA binding events were plotted as heatmap using plotHeatmap from deepTools2 (Ramírez et al., 2016). ChIP-seq peak annotation for genomic locations were plotted as pie chart using ChIPseeker (Yu et al., 2015). For mapping of  $\kappa$ B elements to NF $\kappa$ B target genes, any TNF-inducible RelA ChIP-seq peaks within ± 10kb from gene TSS were annotated to  $\kappa$ B elements (unique half and full  $\kappa$ B DNA sequences were annotated within the mm10 genome) and were mapped to each RelA ChIP-seq peak centered at 500bp window (±250bp from each peak of  $\kappa$ B sequence) on every gene using Bedtools intersect. Full-length  $\kappa$ B elements were defined by the consensus sequence 5'GGRNNNNNYCC-3' for unique 9, 10, or 11bp DNA sequence; where R is a A or G, Y is a T or C, and N is any nucleotide.  $\kappa$ B half sites were defined by the consensus sequence 5'GGR or YCC-3' DNA sequence.  $\kappa$ B motifs were extracted from UCSC mm10 genome using Biostrings and BSgenome packages. Mapping of  $\kappa$ B motifs and RelA ChIP-seq peaks were visualized by ggplot2 geom\_segment. Scatterplots and boxplots of RelA ChIP-seq data were visualized by ggplot. Wilcox.test function in R was used to find the statistical significance of reduced versus non-reduced RelA peaks (Mann-Whitney U-test). Integrative Genomics Viewer (IGV) was used to acquire RelA ChIP-seq tracks for example genes (Robinson et al., 2011).

#### **GC content analysis**

GC sequence information was obtained from UCSC annotation for mouse mm10 genome using getSeq package in R with Granges objects. GC sequences are analyzed for  $\pm$  300 bp from each gene TSS. Percentage of GC were plotted as bar graphs using ggplot2 (v3.2.1) with Tidyverse. Wilcox.test function in R (Mann-Whitney U-test) was used to find the statistical significance of GC content.

#### **Computational Modeling**

An ODE model was constructed representing the rate of change of mRNA for each gene.

$$\frac{d\text{RNA}}{dt} = \frac{k_{act} \cdot \text{RelA}_t^n}{K_D^n + \text{RelA}_t^n} - k_{deg} \cdot \text{RelA}$$

 $k_{act}$  is the mRNA synthesis rate that depends on the activation strength of RelA.  $K_D$  is the dissociation constant which quantifies the nuclear abundance of RelA activity that achieves half-maximal gene induction.  $k_{deg}$  is the degradation rate of the mRNA that relates to the half-life with the identity  $t_{1/2} = \ln(2)/k_{deg}$ .  $n_{hill}$  is the Hill coefficient that describes ultra-sensitivity in gene activation, potentially the result of the cooperative effect of multiple  $\kappa$ B sites, or multiple-sequential mechanistic steps that are not explicitly represented in this model (e.g., NF $\kappa$ B binding, recruitment of PIC components, promoter opening, initiation, RNA Pol II CTD phosphorylation, etc. RelA is a time-dependent variable obtained by quantifying RelA DNA-binding activity from EMSA and linearly interpolating between discrete time points. Basal mRNA for a given parameter set was obtained by analytically solving the ODE with RelA fixed at the basal value:

$$\mathsf{RNA}_{0} = \frac{k_{act} \cdot \mathsf{RelA}_{0}^{n}}{k_{deg} \cdot (K_{D}^{n} + \mathsf{RelA}_{0}^{n})}$$

Induced time-course response was obtained using ode23s in MATLAB (The MathWorks, Inc.). The distance between experimental and modeled mRNA time courses was quantified using a combination of Pearson correlation and MSE to take into account both dynamics and absolute values (dist = (1 - Pearson) + MSE). As  $K_D$ ,  $n_{hill}$ ,  $k_{deg}$  are assumed to be gene-specific properties, unaffected by TAD mutations these were first fit to WT (RelA-wt) data using particle swarm optimization (PSO) to minimize the distance between

modeled mRNA time-course and measured RNA-seq (50 particles, terminating at either 100 epochs or distance below 0.001). As the RNA-seq time-course did not capture a decrease in mRNA levels for late-induced genes,  $k_{deg}$  could not be fit but was assumed to be equivalent to an 8 hour half-life. Following the fit to the WT data  $K_D$ ,  $n_{hill}$ ,  $k_{deg}$  were fixed for data from mutant cells and a new  $k_{act}$  was obtained for each TAD mutation using the same optimization approach.

#### **QUANTIFICATION AND STATISTICAL ANALYSIS**

Statistical analyses were carried out using Excel or R (version 3.6.1). Where applicable, statistical significance are reported in the Figures and corresponding Figure Legends. Western blotting were quantified using ImageJ software and data are presented as mean + SD. All comparisons in sequencing data were analyzed using Wilcox.test function in R (Mann-Whitney U-test).

#### DATA AND CODE AVAILABILITY

All sequencing data presented in this publication have been deposited to the NCBI Gene Expression Omnibus (GEO) and accessible under SuperSeries accession number GSE132540, https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE132540. All quantified ReIA DNA-binding activity as ReIA concentration for the model and all values for model parameters for each 3 replicate model runs are presented in Table S5.

Cell Reports, Volume 30

## **Supplemental Information**

## Dissecting the Regulatory Strategies of NF-κB

### **RelA Target Genes in the Inflammatory Response**

### **Reveals Differential Transactivation Logics**

Kim A. Ngo, Kensei Kishimoto, Jeremy Davis-Turak, Aditya Pimplaskar, Zhang Cheng, Roberto Spreafico, Emily Y. Chen, Amy Tam, Gourisankar Ghosh, Simon Mitchell, and Alexander Hoffmann

## Figure S1

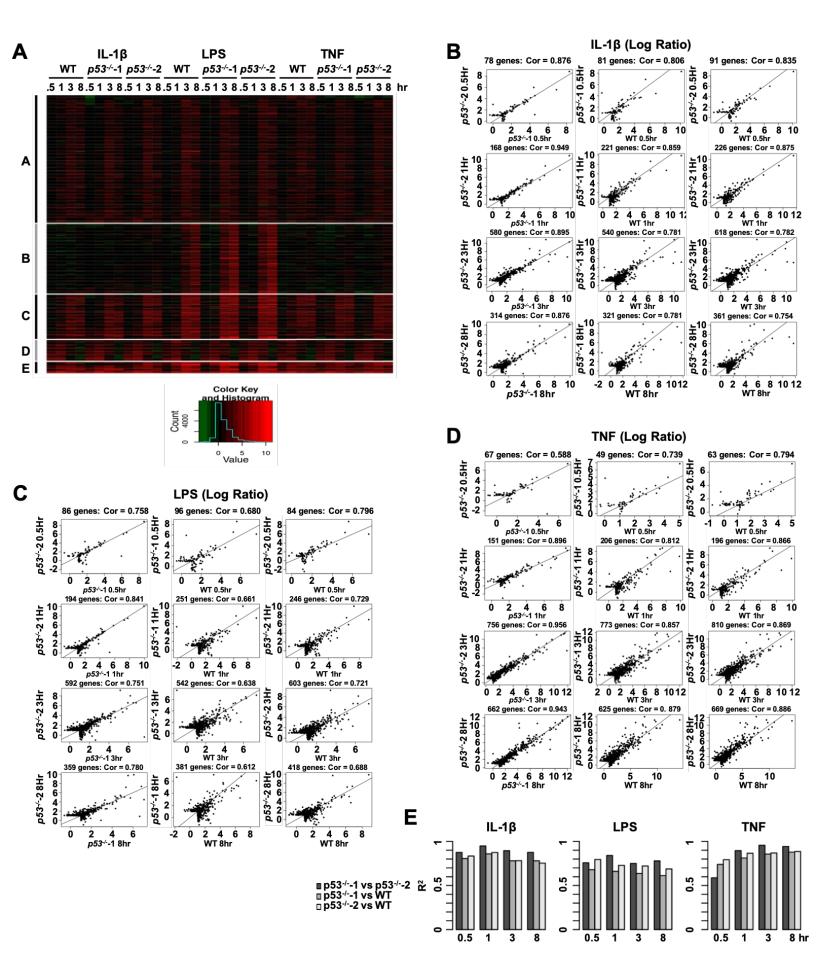


Figure S1. p53 deficiency does not affect TNF-induced gene expression, Related to Figure **2.** (A) Heatmap visualization of upregulated genes in response to IL-1 $\beta$  (10ng/mL), TNF (10ng/mL), or LPS (100ng/mL) stimulations at indicated times in WT or p53<sup>-/-</sup> MEFs. Green to red indicates low to high expression levels, respectively. One biological replicate of WT and two biological replicates of  $p53^{-7}$  MEFs are shown. Genes with  $\geq 100$  normalized counts in at least one condition and an induction  $\geq 4$  were sorted into five groups via K-means clustering. (B) Scatterplots between significantly upregulated genes in all genotypes at all time points of IL-1ß stimulation are plotted, with number of genes and R<sup>2</sup> value indicated. Rows are 0.5, 1, 3 and 8hr respectively. Columns are  $p53^{-1}-2$  vs.  $p53^{-1}-1$ ,  $p53^{-1}-1$  vs. WT, and  $p53^{-1}-2$  vs. WT, respectively. We restricted our analysis to genes that were upregulated by at least 2-fold in one of the two conditions compared. (C) Scatterplots between significantly upregulated genes in all genotypes at all time points of LPS stimulations are plotted, with number of genes and R<sup>2</sup> value indicated. (D) Scatterplots between significantly upregulated genes in all genotypes at all time points of TNF stimulations are plotted, with number of genes and R<sup>2</sup> value indicated. (E) Summary of correlations between different stimuli conditions where bar plots of the R<sup>2</sup> values from panels B-D are shown.

## Figure S2

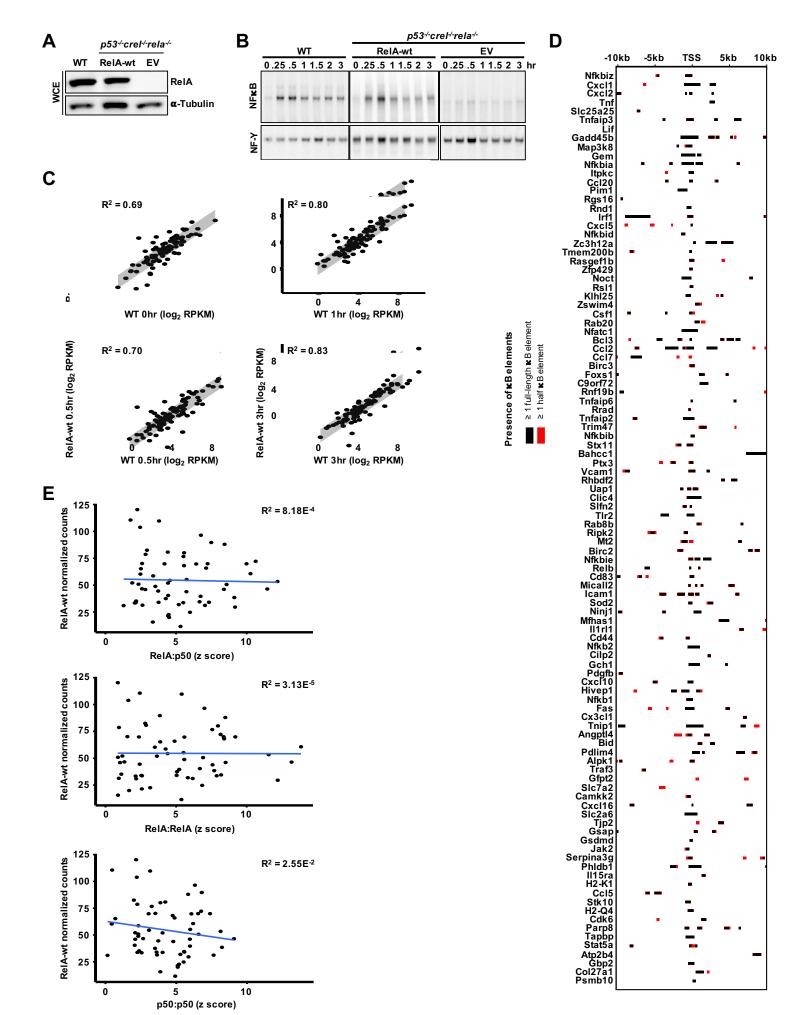
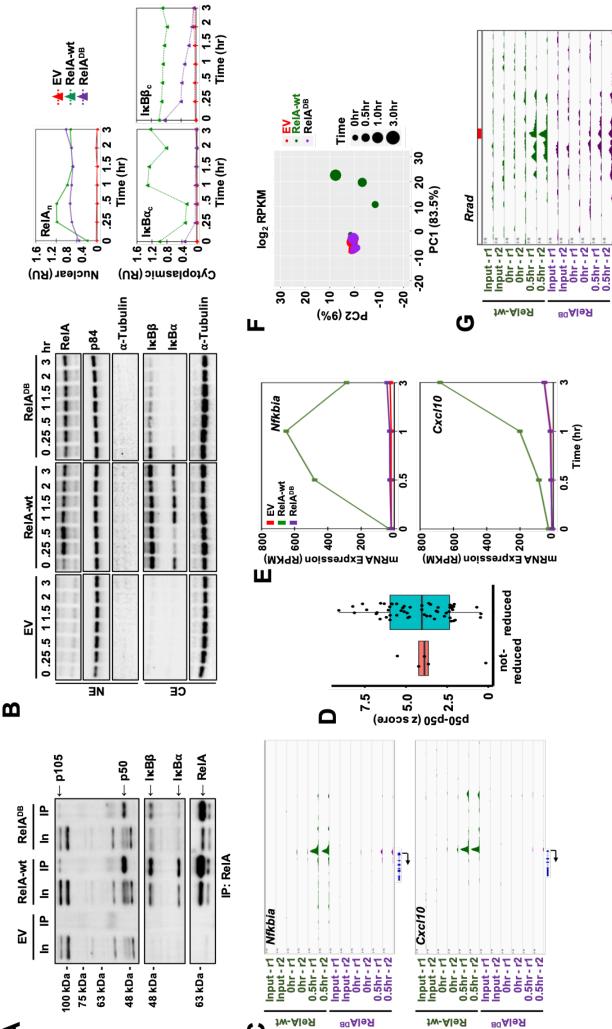


Figure S2. Retroviral transduction of ReIA in p53<sup>-/-</sup>crel<sup>-/-</sup> MEF provides a suitable complementation system for studying NF $\kappa$ B RelA target genes, Related to Figure 2. (A) Western blotting of RelA levels and  $\alpha$ -Tubulin as loading control in unstimulated WT MEFs and p53<sup>-/-</sup>cref<sup>-/-</sup>rela<sup>-/-</sup> MEFs reconstituted ReIA-wt and empty pBABE-puro (EV). (B) Analysis of nuclear NFκB DNA-binding activity by Electrophoretic Mobility Shift Assay (EMSA) for κB DNA and NF-Y (loading control) probes of nuclear extracts prepared at indicated times after TNF stimulation from same cells as (B). (C) Scatter plots for all 113 identified genes with polyA+ RNA-seg showing their RPKM in log<sub>2</sub> for each time point (0, 0.5hr, 1hr, and 3hr) in response to TNF between WT MEF cells and p53<sup>-/-</sup>crel<sup>-/-</sup>rela<sup>-/-</sup> MEF reconstituted with RelA-wt. R<sup>2</sup> values of 0.69 to 0.83 are found across all time points and outliers were removed to produce the list of 104 target genes in subsequent analyses. (D) A map of the NFkB binding sites (kB DNA sequences) within each of the 234 ReIA ChIP-seq peaks identified with an FDR <0.05 and associated with the 104 NF $\kappa$ B target genes. Full kB elements refer to 9, 10, and 11 bp sequences conforming to the consensus: 5'-GGR(N<sub>3-5</sub>)YCC-3', where R = A or G; Y = C or T; N = any nucleotide (A, C, G, or T). Half  $\kappa$ B elements refer to 5'-GGR-3' and 5'-YCC-3'. (E) Correlation between ReIA peak size and relative affinity of KB site sequence. Normalized counts of ReIA ChIP-seq peaks retrieved from ReIA ChIPseg data with RelA-wt expressing MEFs are plotted against PDBMA-determined z-scores of strongest kB binding site sequences for ReIA:ReIA, ReIA:p50, and p50:p50 dimer retrieved from(Siggers et al., 2012).



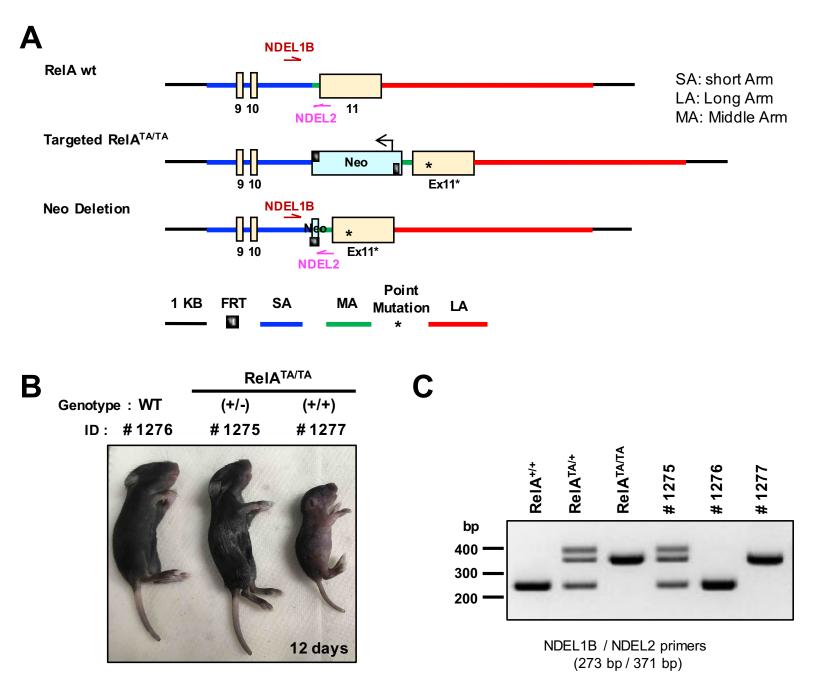


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Figure S3. High affinity DNA binding by RelA is required for all TNF-induction of NFκB target genes, Related to Figure 3. (A) RelA DNA binding mutant shows normal interactions with p50,  $I\kappa B\alpha$  and  $I\kappa B\beta$  as detected by ReIA immunoprecipitation using WCE from unstimulated cells followed by immunoblotting for antibodies against ReIA,  $I\kappa B\beta$ ,  $I\kappa B\alpha$ , and p105/p50. (B) Nuclear extracts (NE) and cytoplasmic extracts (CE) from TNF-stimulated MEFs were analyzed by immunoblotting for antibodies against ReIA,  $I\kappa B\beta$ , and  $I\kappa B\alpha$ , with p84 (nuclear loading control) and  $\alpha$ -Tubulin (cytoplasmic loading control). Quantified western blots for nuclear ReIA, and cytoplasmic I $\kappa$ B $\beta$  and I $\kappa$ B $\alpha$  protein expression are shown on the right. (C) Genome browser tracks of RelA binding events in reconstituted RelA-wt and RelA<sup>DB</sup> cells for known NFkB target genes, Nfkbia and Cxcl10, in response to 0.5hr of TNF stimulation. Data is representative of two independent experiments. (D) Correlation between ReIA peak dependence on ReIA's high DNA affinity and PBM-determined z-scores of strongest KB binding site sequences for ReIA:ReIA. RelA:p50, and p50:p50 dimers retrieved from (Siggers et al., 2012). Of the seven 10-bp KB site sequences within non-reduced ReIA peaks, the five with the strongest z-scores were plotted. (E) Plots of polyA+RNA-seq data for Nfkbia and Cxcl10 genes shown in RPKM in response to TNF at indicated times in WT and RelADB-reconstituted in p53<sup>-/-</sup>cref<sup>/-</sup>rela<sup>-/-</sup> MEFs. (F) PCA plot of the 104 NFkB-dependent genes in response to TNF at indicated times using log<sub>2</sub> of RPKM. (G) Genome browser tracks of ReIA binding events for Rrad gene in reconstituted ReIA-wt and ReIA<sup>DB</sup> mutant cells.

# Figure S4



**Figure S4. Generation of a RelA Transactivation Domain mutant knock-in mouse strain, Related to Figure 7.** (A) Schematic of the knockin strategy, first targeting the RelA gene with a mutant allele containing the CI mutation in TA2 and deletion of TA1, as well as a Neo gene that is flanked by FRT sites, then deleting Neo with FRT. (B) Photo of 12 day-old littermate mice of indicated genotypes (WT, *RelA<sup>TA/-</sup>*, and *RelA<sup>TA/TA</sup>*) prior to isolation of bone-marrow. (C) Confirmation of genotype. PCR product using primer set NDEL1B and NDEL2 with genomic DNA from tail DNA isolated from indicated pups was used to screen mice. PCR product for wild-type band showed at 273 bp, mutant band at 371 bp, visualized by 2% agarose gel. Genotyping results for mouse IDs corresponds to the mice in (B).

## Figure S5

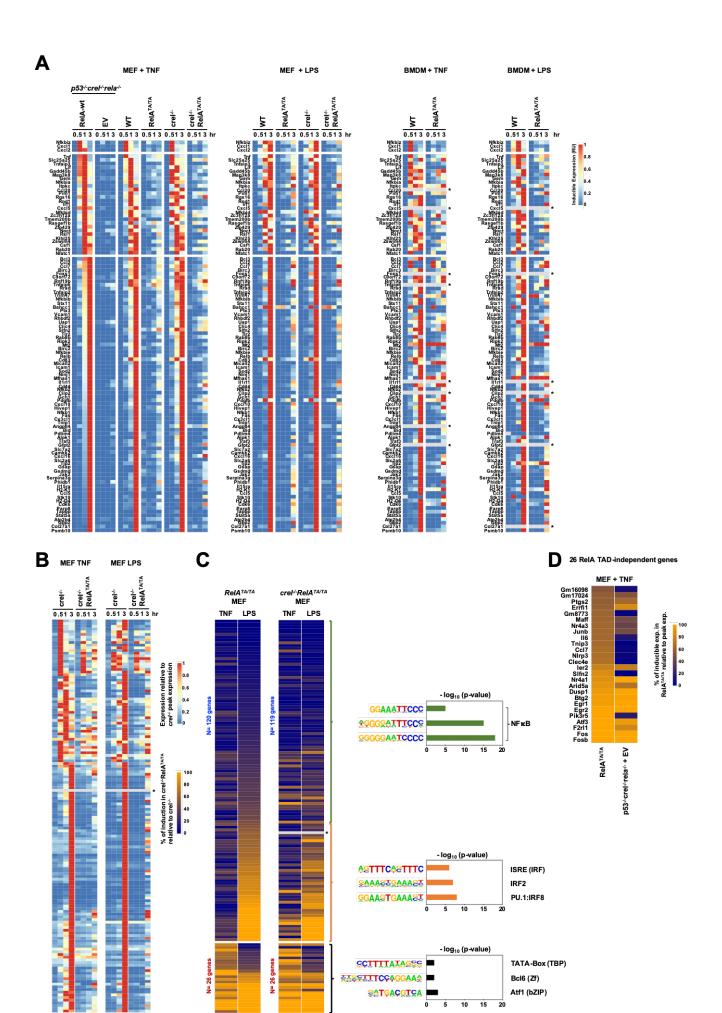
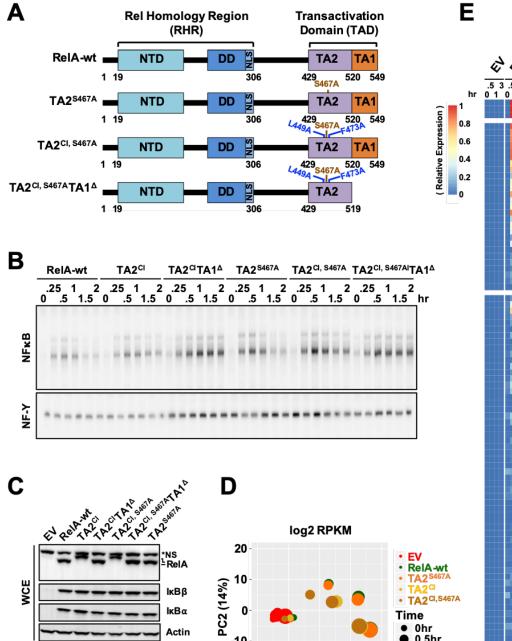


Figure S5. Lack of ReIA-TAD-dependence in the transcriptional response of MEFs to TNF or LPS is not due to cRel compensation, Related to Figure 2 and Figure 7. (A) RNA-seq analysis of 104 target genes, identified in Figure 2, from TNF or LPS stimulated MEFs or BMDMs in WT, RelA<sup>TA/TA</sup>, crel<sup>-/-</sup>, and crel<sup>-/-</sup>RelA<sup>TA/TA</sup>. Blue to red indicates low to high relative inducible expression. Asterisk marked next to BMDM data that are graved out indicates genes that were not induced with the  $log_2FC \ge 1$  cut-off. (B) polyA+RNA-seq heatmaps for the relative expression of 145 genes in crel<sup>-/-</sup> MEFs in response to TNF and LPS. Gene names and data plotted in heatmap are listed in Table S4. (C) Heatmap for ReIA dependence of TNF- and LPS-induced genes in MEFs: percentage of peak expression in (Left panel) RelATA/TA mutant vs. WT, and (*Right panel*) crel<sup>-/-</sup>RelA<sup>TA/TA</sup> mutant vs. crel<sup>-/-</sup>. Blue to orange indicates low to high percentage of inducible expression relative to WT or crel<sup>-/-</sup> control and low to high percentage of inducible expression indicates high to low ReIA TAD dependence. Genes were first clustered by TAD dependence or not in TNF response and re-arranged within each cluster by TAD dependence in LPS response. Gene names and data plotted in heatmap are listed in Table S4. Top results of transcription factor motif enrichment analysis are shown for the gene groups by TNF- and LPSdependent, TNF-dependent and LPS-independent, and TNF- and LPS-independent. (D) Heatmap for ReIA dependence of the 26 TAD-independent genes in TNF response, indicated in (C), in RelA<sup>TA/TA</sup> MEFs and complemented p53<sup>-/-</sup>crel<sup>-/-</sup>rela<sup>-/-</sup> MEFs with empty pBABE vector (EV). Genes were re-arranged based on TAD dependence in TNF response.

## Figure S6



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PC1 (79.6%)

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\*NS is non-specific

0.5hr .

🕽 1.0hr 3.0hr

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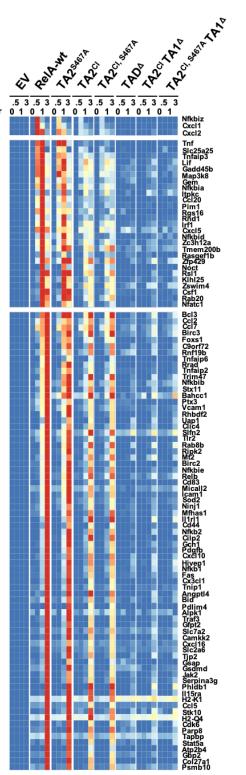
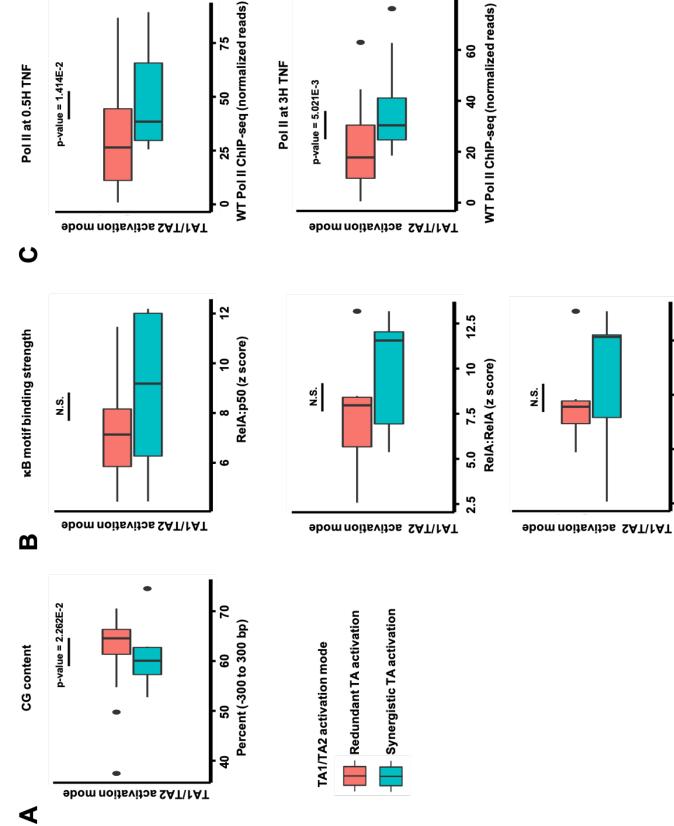


Figure S6. The RelA TA2 domain functions primarily via intrinsic affinity for CBP/p300, Related to Figure 5 and Discussion. (A) Schematic of the RelA variants involving mutation of the phosphorylation site S467 in murine RelA sequences. (B) Analysis of nuclear NF $\kappa$ B activity by EMSA of nuclear extracts prepared at indicated times after TNF stimulation of genetically complemented fibroblasts of indicated genotype. (C) Protein expression of RelA, I $\kappa$ B $\beta$ , I $\kappa$ B $\alpha$ , and Actin in unstimulated cells as assayed by immunoblotting. (D) PCA plot of the transcriptional TNF response of all 104 NF $\kappa$ B target genes at indicated times and cell variants. (E) Heatmap of relative induced expression in response to TNF stimulation of the 104 target genes in same cell variants, as analyzed by polyA+RNA-seq.





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p50:p50 (z score)

Figure S7. Synergistic TA1/TA2 activated genes require higher  $\kappa$ B motif binding strength and more RNA Pol II binding to their promoters, Related to Figure 7. Comparison of GC content,  $\kappa$ B motif binding strengths, and RNA Pol II recruitment for top 25% genes based on their model k<sub>act</sub> values that are from either synergistic (11 genes) or redundant (12 genes) TA1/TA2 activity. (A) Comparison of GC content from ±300 bp from gene TSS. (B) Comparison of  $\kappa$ B motif binding strength (z-scores) derived for ReIA:p50, ReIA:ReIA, and p50:p50 dimers retrieved from Siggers et al. 7 genes from each category with  $\kappa$ B motif z-scores are shown. No significant pvalues were determined with  $\kappa$ B motif binding strength in z-scores between the two categories. (C) Comparison of RNA Pol II ChIP-seq normalized reads for -100 bp to 50 bp from each gene TSS. N.S., not significant. p-values were determined by Mann-Whitney U-test.