

Response Element Composition Governs Correlations between Binding Site Affinity and Transcription in Glucocorticoid Receptor Feed-forward Loops^{*[5]}

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Background: Feed-forward loops are utilized in glucocorticoid signaling and can bestow temporal control to gene regulation.

Results: Cooperation with KLF15 enhances low affinity glucocorticoid receptor binding site activity in coherent feed-forward loops controlling amino acid catabolism.

Conclusion: Feed-forward response element composition contributes to temporal diversity of transcriptional regulation by glucocorticoids.

Significance: Cooperative feed-forward regulatory control may underpin glucocorticoid-induced metabolic side effects.

Combinatorial gene regulation through feed-forward loops (FFLs) can bestow specificity and temporal control to client gene expression; however, characteristics of binding sites that mediate these effects are not established. We previously showed that the glucocorticoid receptor (GR) and KLF15 form coherent FFLs that cooperatively induce targets such as the amino acid-metabolizing enzymes *AASS* and *PRODH* and incoherent FFLs exemplified by repression of *MT2A* by KLF15. Here, we demonstrate that GR and KLF15 physically interact and identify low affinity GR binding sites within glucocorticoid response elements (GREs) for *PRODH* and *AASS* that contribute to combinatorial regulation with KLF15. We used deep sequencing and electrophoretic mobility shift assays to derive *in vitro* GR binding affinities across sequence space. We applied these data to show that *AASS* GRE activity correlated ($r^2 = 0.73$) with predicted GR binding affinities across a 50-fold affinity range in transfection assays; however, the slope of the linear relationship more than doubled when KLF15 was expressed. Whereas activity of the *MT2A* GRE was even more strongly ($r^2 = 0.89$) correlated with GR binding site affinity, the slope of the linear relationship was sharply reduced by KLF15, consistent with incoherent FFL logic. Thus, GRE architecture and co-regulator expression together determine the functional parameters that relate GR binding site affinity to hormone-induced transcriptional responses. Utilization of specific affinity response

functions and GR binding sites by FFLs may contribute to the diversity of gene expression patterns within GR-regulated transcriptomes.

In response to numerous physiologic stimuli, glucocorticoid signaling is activated in vertebrates by the release of corticosteroid hormones, which bind to the glucocorticoid receptor (GR)² (1). Upon ligand binding, GR translocates to the nucleus and regulates gene expression to control myriad aspects of cell and organism physiology, including glucose production, lipid storage, and amino acid catabolism (2, 3). Key physiologic processes that are modulated by GR signaling require tight control that extends beyond a simple on/off switch enabled by ligand release (4). Reflecting this, GR regulates gene expression both through direct association with glucocorticoid response elements that harbor sequences with varying similarity to canonical high affinity palindromic GR binding sites (5) and through tethering with other transcription factors in a process that does not necessarily require the presence of a canonical, palindromic GR binding site (GBS) (6–8). Regulatory regions that utilize GR binding sites in combination with binding sites for other factors that contribute to the transcriptional response to hormone, often through physical interaction with GR, have been alternately referred to as either glucocorticoid response units or glucocorticoid response elements (GREs) with the latter term

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² The abbreviations used are: GR, glucocorticoid receptor; GBS, GR binding site; dex, dexamethasone; seq, sequencing; Spec, specificity; GRE, glucocorticoid response element; FFL, feed-forward loop; DBR, differential binding region; PWM, position weight matrix; PEPCK, phosphoenolpyruvate carboxykinase; MEF, mouse embryonic fibroblast; qPCR, quantitative PCR; KLF, Krüppel-like factor; KBS, KLF binding site; GBR, GR binding region; ChIP-seq, ChIP followed by deep sequencing; AASS, amino adipic semialdehyde synthase; PRODH, proline dehydrogenase.

appearing more frequently in recent literature (9, 10). Control of GR activity through GREs is exemplified by a well characterized GRE that regulates the expression of *PEPCK*, which encodes a key enzyme in gluconeogenesis. A combination of physical interactions between GR and co-regulatory transcription factors and GR binding sites allows the glucocorticoid response at *PEPCK* to integrate multiple non-ligand signals and is implicated in conferring tissue specificity to hormone signaling (11–13). More recent genome-wide studies of GR occupancy within chromatin support a model in which GR binding and activity are frequently controlled through combinatorial interactions with other factors (5, 7, 14). Relatively few studies, however, have dissected the molecular basis for GRE function to the level of mechanistic detail that is available for *PEPCK* regulation, and the role that specific GR binding sequences play in determining GR occupancy and transcriptional responses in combination with other transcription factors is not fully understood.

We recently characterized novel GRE subtypes that control the transcriptional responses of feed-forward loops (FFLs) comprising GR and the GR-induced transcriptional factor KLF15, which is a major regulator of amino acid catabolism (15, 16). FFLs, which are now recognized as a dominant motif in gene regulation (17–19) and are increasingly implicated in hormone responses (20–22), are formally defined as factor X (in this case GR) regulating the expression of factor Y (in this case *KLF15*) with both factors exerting simultaneous control over the expression of downstream targets. FFLs can adopt eight possible configurations depending on whether constituent factors enhance or repress their targets within the loop (23); different FFL configurations endow client gene expression with distinct transcriptional dynamics and expression properties (24, 25). We previously showed that GR and KLF15 form two of the most widely used types of FFLs: the type I coherent FFL in which GR and KLF15 both induce the expression of shared target genes and the type I incoherent FFL in which KLF15 represses GR-mediated induction of FFL targets. GREs regulating the expression of genes encoding the amino acid-metabolizing enzymes AASS and *PRODH* mediated coherent feed-forward regulation by GR and KLF15, and GR occupancy was enhanced by KLF15 expression at these loci. In contrast, a GRE within the *MT2A* locus, which was strongly induced by GR alone, exhibited reduced activity and GR occupancy when KLF15 was expressed in combination with hormone. The molecular basis for distinct transcriptional outputs resulting from individual GR-KLF15 feed-forward GREs and the role of GR binding sites within these loci, however, were not determined.

In this study, we used site-directed mutagenesis to define response elements within GREs that contribute to coherent (*i.e.* cooperative) feed-forward regulation of AASS and *PRODH* by GR and KLF15 in comparison with the *MT2A* GRE in which KLF15 antagonizes GR action. Immunoprecipitation was used to determine whether GR and KLF15 physically interact. Electrophoretic mobility shift assays using a semidegenerate pool of oligonucleotides and deep sequencing of bound and unbound GR-DNA complexes (Spec-seq) was used to derive a position weight matrix for GR-DNA binding energies (26). Application

of this matrix to GR binding regions identified using chromatin immunoprecipitation (ChIP)-seq in conjunction with binding site swaps further defined the role of GR binding site sequence in determining GR-KLF15 GRE transcriptional outputs. We propose a model in which the role of GR binding site affinity in mediating transcriptional responses to glucocorticoid is constrained by GRE architecture, which determines both threshold affinity requirements and response magnitudes.

Experimental Procedures

Cell Culture and Reagents—Beas-2B cells were grown in high glucose DMEM containing L-glutamine and supplemented with 10% fetal bovine serum (FBS; Hyclone) and 1% penicillin-streptomycin. Wild type and *Klf15*^{-/-} mouse embryonic fibroblasts (MEFs) were grown in the same basal medium described above and supplemented with 10% FBS, 1% penicillin-streptomycin, and 1% nonessential amino acids in minimum essential medium. All cells were maintained in 5% CO₂ at 37 °C. Dexamethasone (dex; D1756) was purchased from Sigma and prepared using sterile 100% ethanol as vehicle. The full-length KLF15 expression plasmid (pcDNA-KLF15) and the KLF15-expressing adenovirus (Ad-KLF15) and Ad-GFP control have been described previously (15, 27) as have the truncated KLF15 expression constructs in the pcDNA vector (28) that were kindly provided by Dr. Claudia Noack. Primary antibodies for co-immunoprecipitation included mouse anti-KLF15 (ab81604) from Abcam; rabbit anti-GR (M-20; sc-1004), rabbit anti-GR (H-300; sc-8992X), and mouse anti-GR (G-5; sc-393232) from Santa Cruz Biotechnology; normal rabbit IgG (12370MI) from Fisher; and mouse anti-GAPDH (G8795) from Sigma. Secondary antibodies were ECL sheep anti-mouse IgG-HRP (95017-332) and ECL donkey anti-rabbit IgG-HRP (95017-330) obtained from VWR. For the MEF ChIP followed by deep sequencing (ChIP-seq) experiment and independent validation via ChIP-qPCR, anti-GR (N-499; a gift from Dr. Keith Yamamoto) and anti-GR (IA-1; a polyclonal rabbit antibody raised against human GR amino acids 84–112 (QPDLKAVSLMGLYMGETETKVMGNDLG); a gift from Dr. Miles Pufall), respectively, were used.

Plasmids—The pAASS and p*PRODH* luciferase reporter constructs have been described (15). The p*MT2A* reporter used in the present study contains a smaller (482-bp) region of the *MT2A* locus that exhibited similar activity to the construct described previously (15). All reporters were generated in the pGL3-Promoter vector (Life Technologies). Site-directed mutagenesis of putative GR and KLF binding sites, identified as having ≥95% core binding sequence similarity to the consensus binding site using MatInspector (29) (Genomatix), was performed using the QuikChange II site-directed mutagenesis kit from Agilent Technologies as instructed by the manufacturer. All mutated sequences were verified by sequencing and further analyzed by MatInspector to confirm they were no longer recognized as binding sites for their cognate transcription factor. The sequences of primers used for site-directed mutagenesis, putative GR and KLF binding sites, and mutations introduced into those sites are presented in [supplemental Tables S1 and S2](#). Transfections were performed as described previously (15).

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Whole Cell Extract Preparation and Co-immunoprecipitation—For endogenous co-immunoprecipitation experiments, Beas-2B cells were grown to confluence on three 15-cm dishes. Cells were treated with 100 nM dex in serum-free medium for 4 h to stimulate GR and KLF15 activation (15) after which whole cell extracts were prepared as described previously (30). Protein concentration was quantified using the Protein Assay Dye Reagent Concentrate from Bio-Rad, and samples were aliquoted and stored at -80°C until further use. Protein extracts (500 μg) were precleared by adding Protein A/G-agarose resin slurry (Thermo Scientific Pierce) and incubating for 30 min at 4°C on a rotator. The resin was pelleted by brief centrifugation after which the supernatant was transferred to a fresh tube and combined with antibodies against GR or IgG. Protein A/G-agarose resin slurry was then added, and reactions were incubated for 2 h at 4°C on a rotator. Resulting immune complexes were pelleted and washed. Immunoprecipitated proteins were separated by SDS-PAGE and then transferred to PVDF membranes (Hybond-P, GE Healthcare). Membranes were immunoblotted with antibodies against KLF15, GR, or GAPDH (negative control) as indicated in Fig. 2. Chemiluminescence detection was performed using the ECL Prime Western blotting detection system (GE Healthcare).

ChIP—MEFs were grown to confluence in 10-cm dishes and treated with 1 μM dex or vehicle in fresh complete medium for 1 h. ChIP was performed as described previously (15) with the following modifications. Cross-linking was performed by adding methanol-free 16% formaldehyde directly to the culture medium to a final concentration of 1% and incubating for 5 min at room temperature on a rocker. Samples were sonicated with a Diagenode Bioruptor at high power in 30-s bursts separated by 30-s incubations in ice water for a total of 23 min. qPCR analysis of DNA obtained by ChIP was performed using Fast SYBR Green qPCR Master Mix (Life Technologies) as described (15). Relative GR occupancy of a putative target region was calculated on a \log_2 scale and defined as the difference between the C_T value for the specific target region relative to the geometric mean of C_T values for three negative control regions. Amplification of diluted input DNA established that control and experimental primer efficiencies were well matched (generally <0.5 cycle difference). ChIP-qPCR experiments were performed in biologic quadruplicate and repeated at least once with qualitatively similar results. p values were calculated using t tests as indicated in figures. The primer sequences used are in [supplemental Table S3](#).

ChIP-Sequencing—A minimum of 1 ng of DNA from ChIP samples was used to prepare libraries using the Nugen Ovation Ultralow System V2 1–16 Part Number 0344 according to the manufacturer's instructions. Samples were run on an Illumina HiSeq using 1×50 bp end reads. The quality of the ChIP-seq FASTQ sequence files was assessed using the FASTQC software. The genomic locations of these sequences were determined by mapping them to the mouse genome (mm9) using Bowtie2 (31). Peak calling of enriched ChIP regions was performed using MACS2 software by setting the narrow peak range to 300. The resulting peaks were converted to BigWig format for visualization in the UCSC Genome Browser using utility tools implemented by the "HOMER" group. The consis-

tency of replicated sample peaks was qualified using the Irreproducible Discovery Rate algorithm implemented in R (32). Differential binding analysis of transcription factor occupancy with ChIP-Seq was performed using an R Bioconductor package, "DBChIP" (33), and the statistically significant binding sites were annotated using an R Bioconductor package, "ChIP-seeker" (34). Data have been deposited in the Gene Expression Omnibus (GSE69947).

Adenoviral Transduction—MEFs were plated in 10-cm dishes so they would be confluent at the time of dex treatment. Cells were transduced with Ad-KLF15 or Ad-GFP as a control at a multiplicity of infection of 50. Approximately 17 h later, cells were treated with 1 μM dex or vehicle in fresh complete medium for 1 h and then assayed by ChIP-qPCR as described above (15).

Spec-seq—Spec-seq was performed as described previously (35) with modifications as detailed below. An initial experiment was performed using the putative consensus sequence AGAACA GGG TGTTCT, randomized library 1 (AGAACN NSN NGTTCT; diversity = 512), randomized library 2 (AGAANN GGG NNNTCT; diversity = 1024), randomized library 3 (AGAACA GGG TGNNNN; diversity = 256), and randomized library 4 (AGAACA GGGC NNNTCT; diversity = 64). The initial total library diversity was ~ 1853 with a library composition of 10% positive control sequence + randomized libraries 1–4 + 5% negative control sequence. A fifth library containing 2304 sequences based on DDNACW KKN KGTTCT where D = "not C," N = "any base," W = "A or T," and K = "G or T" was subsequently prepared and analyzed using similar ratios of control sequences. Binding conditions for electrophoretic mobility shift assay (EMSA) were 100 ng of fluorescein amidite-labeled dsDNA + 0/0.5/1/2/4 μM GR DBD protein for each lane and $1 \times$ NEB buffer 4. GR DBD was prepared as described previously (36). The EMSA was performed using a 9% 33:1 acrylamide gel and Tris borate-EDTA buffer and run at 200 V for 30 min at 0°C . The 2 μM protein lane was used for deep sequencing. Sequence data have been deposited in the Gene Expression Omnibus (GSE69386). Bound/unbound fractions resulting from EMSA of these libraries and conditions were used to generate position weight matrices (PWMs) as described. The GR PWM that was generated through this analysis was used to define relative binding energies using the patser program (37). Derived binding affinities are proportional to the exponential function of the calculated energies.

Results

Characterization of GR and KLF15 Binding Sites within the *PRODH*, *AASS*, and *MT2A* Glucocorticoid Response Elements—We previously characterized composite GREs that conferred coherent (*AASS* and *PRODH*) and incoherent (*MT2A*) feed-forward transcriptional regulation by GR and KLF15 (15). Sequence analysis using MatInspector revealed that these GREs contain at least one putative binding site for GR and several (two to four) putative sites for KLF15, but the function of these sites is not known. To define the requirement of these putative GR binding sites/response elements (which we will refer to as GBSs) for GR-KLF15 combinatorial regulation of

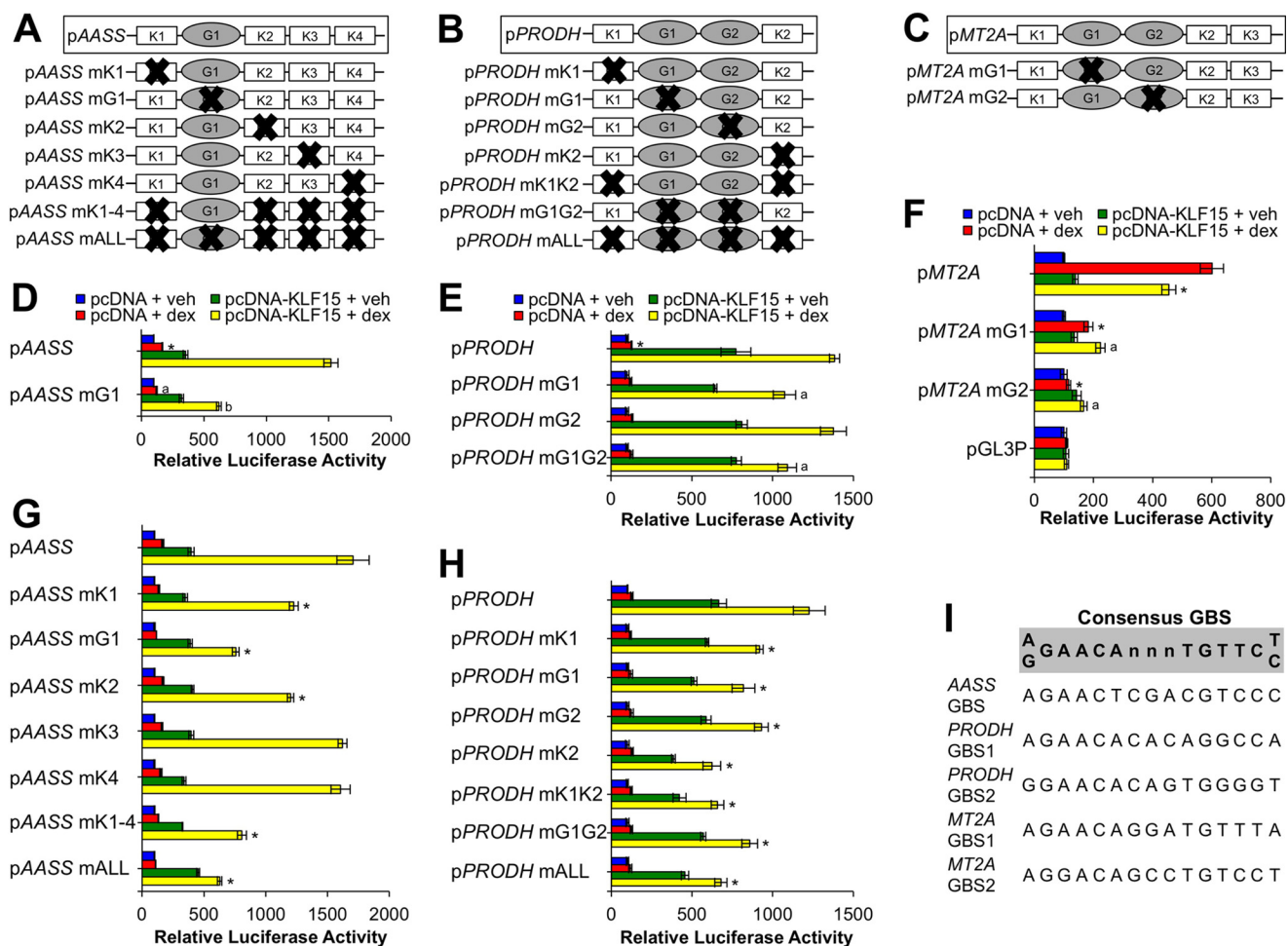


FIGURE 1. Role of GR and KLF15 binding sites in feed-forward glucocorticoid response elements that regulate *AASS*, *PRODH*, and *MT2A*. A–C, schematic diagrams illustrating glucocorticoid response elements of GR-KLF15 feed-forward targets used to generate luciferase reporters. Relative locations of putative GR (G) and KLF15 (K) binding sites are shown; mutated sites are denoted by “X” as appropriate. D–H, luciferase activity of the indicated wild type or mutant reporters transfected into Beas-2B cells together with a KLF15 expression plasmid (pcDNA-KLF15) or empty vector control (pcDNA) prior to treatment with dex or vehicle (veh) for 8 h. Bars indicate mean reporter activation (+S.D.) relative to activity in pcDNA + vehicle-treated samples. The parent pGL3-Promoter (pGL3P) vector is included in F as a control. Statistical comparisons for each panel are as follows. D, **p* ≤ 0.05 versus pAASS pcDNA + veh; a, *p* ≤ 0.05 versus pAASS pcDNA + dex; b, *p* ≤ 0.05 versus pAASS pcDNA-KLF15 + dex. E, **p* ≤ 0.05 versus pPRODH pcDNA + veh; a, *p* ≤ 0.05 versus pPRODH pcDNA-KLF15 + dex. F, **p* ≤ 0.05 versus pMT2A pcDNA + veh; a, *p* ≤ 0.05 versus pMT2A pcDNA-KLF15 + dex. G, **p* ≤ 0.05 for all compared with pAASS pcDNA-KLF15 + dex. H, **p* ≤ 0.05 for all compared with pPRODH pcDNA-KLF15 + dex. I, 15-mer nucleotide sequences of putative GR binding sites identified within glucocorticoid response elements of *AASS*, *PRODH*, and *MT2A* loci. A consensus GR binding site sequence is shown for comparison (60).

pAASS, pPRODH, and pMT2A, we used site-directed mutagenesis to disrupt the indicated GBS(s) (Fig. 1, A–C and I, and supplemental Table S1) and transfected these mutant reporter constructs into Beas-2B cells in combination with a KLF15 expression plasmid (pcDNA-KLF15) or control vector (pcDNA). Reporter activity was then assayed after 8 h of dex (100 nM) or vehicle treatment (see supplemental Table S1 for sequences of GR binding sites and introduced mutations). Consistent with our prior work, the wild type GR-KLF15 coherent feed-forward GRE constructs pAASS (Fig. 1D) and pPRODH (Fig. 1E) showed a small induction with dex treatment, a stronger (~5–10-fold) induction in the presence of pcDNA-KLF15, and a greater than additive (~15-fold) induction with dex + KLF15 co-treatment. Surprisingly, pAASS mG1, which contains a mutation in the only GBS identified within the AASS GRE, exhibited only a modest reduction in the basal response to dex and a significant, yet incomplete abrogation of combinatorial induction by dex + KLF15 (Fig. 1D). A similar pattern of

mildly decreased dex responsiveness and reduced induction by dex + KLF15 was observed for the pPRODH mutants harboring either single (mG1 and mG2) or double (mG1G2) GBS mutations (Fig. 1E). These data indicate that the putative GBSs tested contribute to, but are not absolutely required for, combinatorial regulation of AASS or PRODH by GR and KLF15, supporting a model in which GR can cooperate with KLF15 without occupying a canonical GBS match. In contrast, whereas the previously described incoherent GR-KLF15 feed-forward MT2A reporter exhibited strong induction by dex that was diminished in the presence of pcDNA-KLF15, both of the MT2A GBSs were essential for proper co-regulation by GR and KLF15 (Fig. 1F). Specifically, responses to dex and to dex + KLF15 treatment were dramatically reduced in the pMT2A mG1 construct and completely lost in pMT2A mG2. In addition, neither dex nor KLF15 substantially changed the expression of the parent pGL3P construct (Fig. 1F), establishing that the effects of both GR and KLF15 are specific to the cloned response elements.

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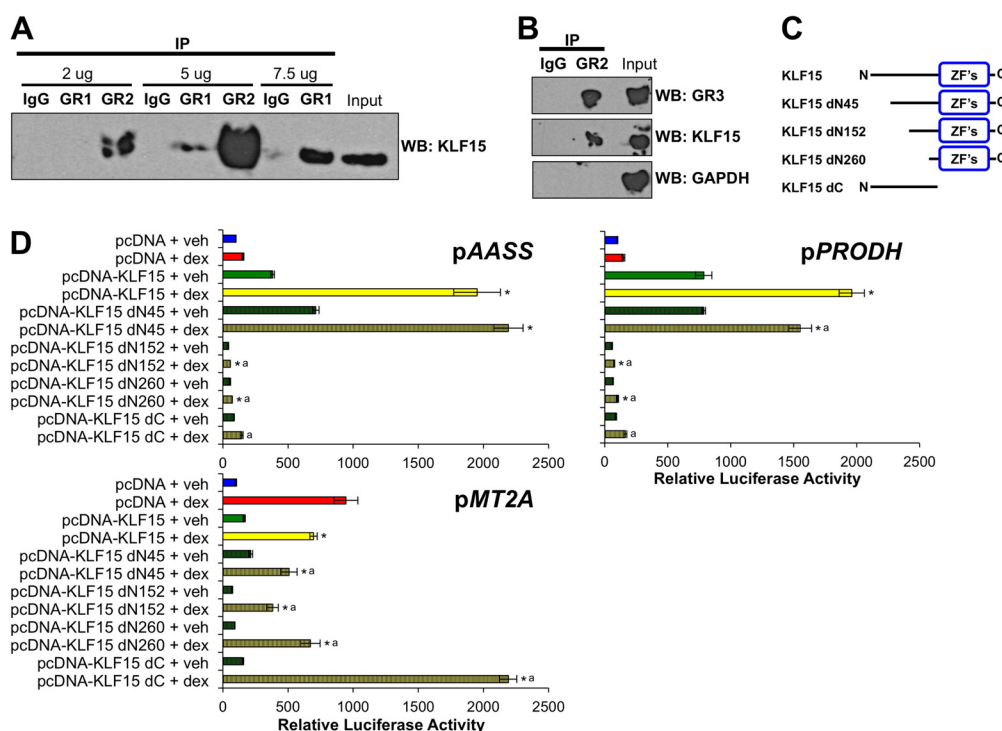


FIGURE 2. KLF15 physically interacts with GR and utilizes distinct functional domains for cooperation versus repression of GR. *A* and *B*, co-immunoprecipitation (IP) of GR and endogenous KLF15 in Beas-2B cells treated with dex and serum-deprived for 4 h. *A*, whole cell extracts were immunoprecipitated with increasing concentrations of anti-GR (M-20; GR1), a second anti-GR (H-300; GR2), or IgG as a nonspecific control as indicated and then probed with anti-KLF15 by Western blotting (WB). *B*, whole cell extracts were immunoprecipitated with GR2 antibody or IgG and then probed by Western blotting with anti-KLF15, anti-GR (G-5; GR3) as a positive control, or anti-GAPDH as a negative control as indicated. *C*, schematic diagram of full-length and mutated KLF15 expression constructs. “ZF’s” indicates the three C-terminal Cys₂-His₂ zinc finger domains. *D*, relative luciferase activity of pAASS, pPRODH, or pMT2A reporters transfected into Beas-2B cells in combination with full-length or mutated KLF15 expression plasmids or the parent pcDNA vector as indicated. Cells were subsequently treated with dex or vehicle (veh) for 8 h, and luciferase activity was measured. Bars indicate mean reporter activity (+S.D.) relative to activity in the pcDNA + vehicle-treated samples. Each footnoted bar was compared statistically according to the following: *, $p \leq 0.05$ versus pAASS pcDNA + dex; a, $p \leq 0.05$ versus pAASS pcDNA-KLF15 + dex; D, top right, *, $p \leq 0.05$ versus pPRODH pcDNA + dex; a, $p \leq 0.05$ versus pPRODH pcDNA-KLF15 + dex. D, bottom, *, $p \leq 0.05$ versus pMT2A pcDNA + dex; a, $p \leq 0.05$ versus pMT2A pcDNA-KLF15 + dex.

Thus, the GBS requirements differ between the tested coherent and incoherent GREs with mechanisms that do not involve the tested GBSs contributing to coherent feed-forward function of the AASS and PRODH GREs.

We asked next whether interactions between KLF15 and its cognate binding sites within the AASS and PRODH GREs were required for response element function. We generated a series of pAASS and pPRODH reporters containing mutations of each KLF binding site (KBS) individually or all KBSs together both with and without disruption of the GBSs within each GRE (Fig. 1, A, B, G, and H). We assayed the activity of these mutant reporters following treatment with dex, pcDNA-KLF15, or dex + KLF15 as described above. Individual KBS mutations in pAASS exerted minimal or no effect on the responses to either dex or pcDNA-KLF15. Whereas the pAASS mK3 and mK4 mutants also exhibited induction that mirrored the parent construct with dex + KLF15 co-treatment, the pAASS mK1 and mK2 mutants exhibited a consistent, albeit incomplete abrogation of activity stimulated by dex + KLF15 (Fig. 1G). Surprisingly, even the pAASS constructs harboring mutations in all four KBSs (mK1–4) or mutations in all four putative KLF15 sites and the GBS (mALL) displayed some degree of cooperative induction in the presence of dex + KLF15 although substantially less than that exhibited by the wild type reporter (Fig. 1G). Similarly, the PRODH GRE was resilient to the introduction of

mutations in the putative KBSs. As shown in Fig. 1H, mutating KBSs individually, together, or in combination with the GBSs resulted in reduced but not absent co-activation by dex + KLF15. Taken together, the binding site mutation analysis suggests that KLF15 and GR are able to interact with the AASS and PRODH GREs both through typical response elements, but neither GR nor KLF15 appear to require a recognizable binding site to accomplish the majority of the regulation they confer. Our data are also consistent with a potential physical association between GR and KLF15.

KLF15 Physically Interacts with GR and Exhibits Distinct Functional Domain Requirements for Coherent and Incoherent Feed-forward Loops—To examine whether GR associates with KLF15 as suggested by the reporter activity assays, we performed co-immunoprecipitation experiments in Beas-2B cells treated with dex (100 nM) and serum-deprived for 4 h to stimulate GR and endogenous KLF15 activation (15). GR was immunoprecipitated from whole cell extracts with increasing concentrations of GR1 (M-20) or GR2 (H-300) anti-GR antibodies and then probed for KLF15 expression by Western blotting. Fig. 2A illustrates a concentration-dependent increase in KLF15 detection that was observed in samples immunoprecipitated with either of the GR antibodies but not by an IgG control antibody, consistent with a physical interaction between GR and KLF15. Additional experiments in which whole cell ex-

tracts were immunoprecipitated with GR2 and then probed with GR3 (G-5) anti-GR or anti-KLF15 antibodies confirmed the presence of both GR and KLF15 in the precipitated complex, whereas the negative control, GAPDH, was not detected (Fig. 2B). Thus, endogenous GR and KLF15 either interact directly or are both present within a multicomponent cellular complex, in either case supporting a model in which molecular association between the two factors contributes to FFL function.

To gain insight into which functional domain(s) of the KLF15 protein may be important for GR-KLF15 combinatorial regulation, we assessed the ability of mutant KLF15 constructs (Fig. 2C), including a series of N-terminal deletions and a truncated C-terminal protein that lacks the zinc finger DNA binding domain (28), to properly co-regulate the wild type pAASS, p*PRODH*, and p*MT2A* reporters after co-transfection into Beas-2B cells and treatment with dex (100 nM) for 8 h. As shown in Fig. 2D (top), the KLF15 dN45 construct was able to cooperatively induce pAASS and p*PRODH* reporter activity to a similar extent as the full-length protein, whereas further deletion of the N-terminal region, which has previously been shown to harbor an activation domain (38), eliminated transcriptional induction of the AASS and *PRODH* GREs both with and without dex treatment. Indeed, the constructs lacking the activation domain appeared to exhibit gain of function repressive activity in which they reduced the basal and dex-induced activity of the *PRODH* and AASS constructs. Similarly, all of the N-terminal deletions were capable of combinatorial repression of p*MT2A* activity, whereas deletion of the C terminus eliminated KLF15 function in both the coherent and incoherent GREs. Taken together, these data indicate that the zinc finger domain is necessary and sufficient for transcriptional repression, whereas KLF15 activation domain function depends on promoter context and is required for cooperation between GR and KLF15.

Binding Site Sequence Does Not Determine GR-KLF15 Cooperation—The above data support a model in which architectural features of the *PRODH* and AASS GREs mediate cooperative interaction between GR and KLF15, presumably through enabling activity of the N-terminal activation domain of KLF15. To determine whether the specific sequences of the GBSs within *PRODH* and AASS confer activation potential to KLF15, we performed a series of swaps between the GBSs we had defined within the *PRODH*, AASS, and *MT2A* feed-forward GREs as well as a GBS within a well characterized intronic GRE for *FKBP5* that closely matches the consensus GR binding sequence (39). These additional luciferase reporters are identical to their wild type counterparts except that the native GBS sequence has been replaced as closely as possible with a functional GBS of a distinct co-regulated gene (GBS swaps; see Fig. 3, A, C, and E, and Table S2). We assayed activity of these constructs by transfection and treatment with vehicle or dex (Fig. 3, B, D, and F) and found that replacing the GBSs within the AASS and *PRODH* GREs with either (or both for *PRODH*) of the *MT2A* GBSs or the *FKBP5* GBS maintained cooperation between GR and KLF15, indicating that the specific GBS sequences within the AASS and *PRODH* GREs do not determine GR-KLF15 cooperativity. In contrast, neither the AASS nor *PRODH* GBSs were repressed by KLF15 in the context of

the *MT2A* GRE, although the level of induction from the AASS GBS was much lower than the wild type site, and the *PRODH* GBSs had minimal or no detectable activity when used to replace the two *MT2A* GREs. In contrast, substitution of the *MT2A* GBS2 with the *FKBP5* GBS resulted in hyperactivation of the construct. Inspection of the sequences of the various GBSs characterized in Figs. 1 and 3 indicates that the *PRODH* and AASS GBSs only weakly match the consensus GR binding sequence (see Fig. 1J), whereas the *MT2A* GBS2 is a more robust match with the *FKBP5* GBS (AGAACA GGG TGTCT), aligning even more closely with the consensus, suggesting that site affinity characteristics may contribute to the function of the *MT2A* GRE.

GR ChIP-seq Defines Additional Binding Regions That Mediate Conditional GR Activity—The observation that weak matches for the consensus GR binding site function in cooperation with KLF15 in the AASS and *PRODH* GREs is congruent with prior observations in which conditional (e.g. cell-specific or requiring a tethering factor) GR binding regions (GBRs) frequently utilize lower affinity or non-canonical GBSs (40). To define the characteristics of GBSs that mediate conditional hormonal responses in greater detail, we used a GR antibody to perform ChIP-seq in MEFs isolated from wild type (WT) and *Klf15*^{-/-} mice. ChIP samples were prepared in duplicate from WT and *Klf15*^{-/-} MEFs treated with either vehicle control (EtOH) or 1 μM dex for 1 h. Samples derived from WT MEFs treated with EtOH were combined because of limiting starting material; the remainder of the samples were prepared as independent libraries and subjected to deep sequencing. Approximately 19–27 million reads were obtained per sample, base call accuracy was >99.9% for 97% of base reads, and 97% of sequence reads mapped to the mouse genome. GBRs were identified using MACS2, and *r* values between samples were computed. Strong concordance (*r* ~ 0.9) was observed between biologically equivalent dex-induced samples (e.g. WT dex treatment samples 1 and 2), indicating good technical reproducibility. In contrast, *r* values between WT and *Klf15*^{-/-} cells treated with dex were ~0.8, indicating greater biologic variability in GR binding between the two different MEF lines. Substantial variability was also present in a filtered data set of autosomal binding sites in the upper 80% of read counts that exhibited at least a 2-fold occupancy increase with dex treatment. 10,565 peaks met these criteria in wild type cells, whereas there were 17,639 such sites in *Klf15*^{-/-} cells with an overlap of 7482 (Fig. 4A). Despite the variability, application of Centrimo (41), a tool within the MEME software suite (42), to the WT, *Klf15*^{-/-}, and intersection ChIP-seq data sets identified putative GR binding motifs within 49, 42, and 52% of occupied regions, respectively; a *de novo* match for the consensus GR binding logo (Fig. 4B) was also identified from the WT data set using the MEME-ChIP tool (43). Taken together, these results indicate that the binding patterns defined by ChIP-seq reflect GR occupancy within the tested cell types.

To rigorously define specific GBRs with cell type-conditional occupancy patterns, we applied differential binding analysis, which allows high confidence identification of peaks that are statistically different between multiple ChIP-seq data sets. Using differential binding analysis to compare the dex-treated

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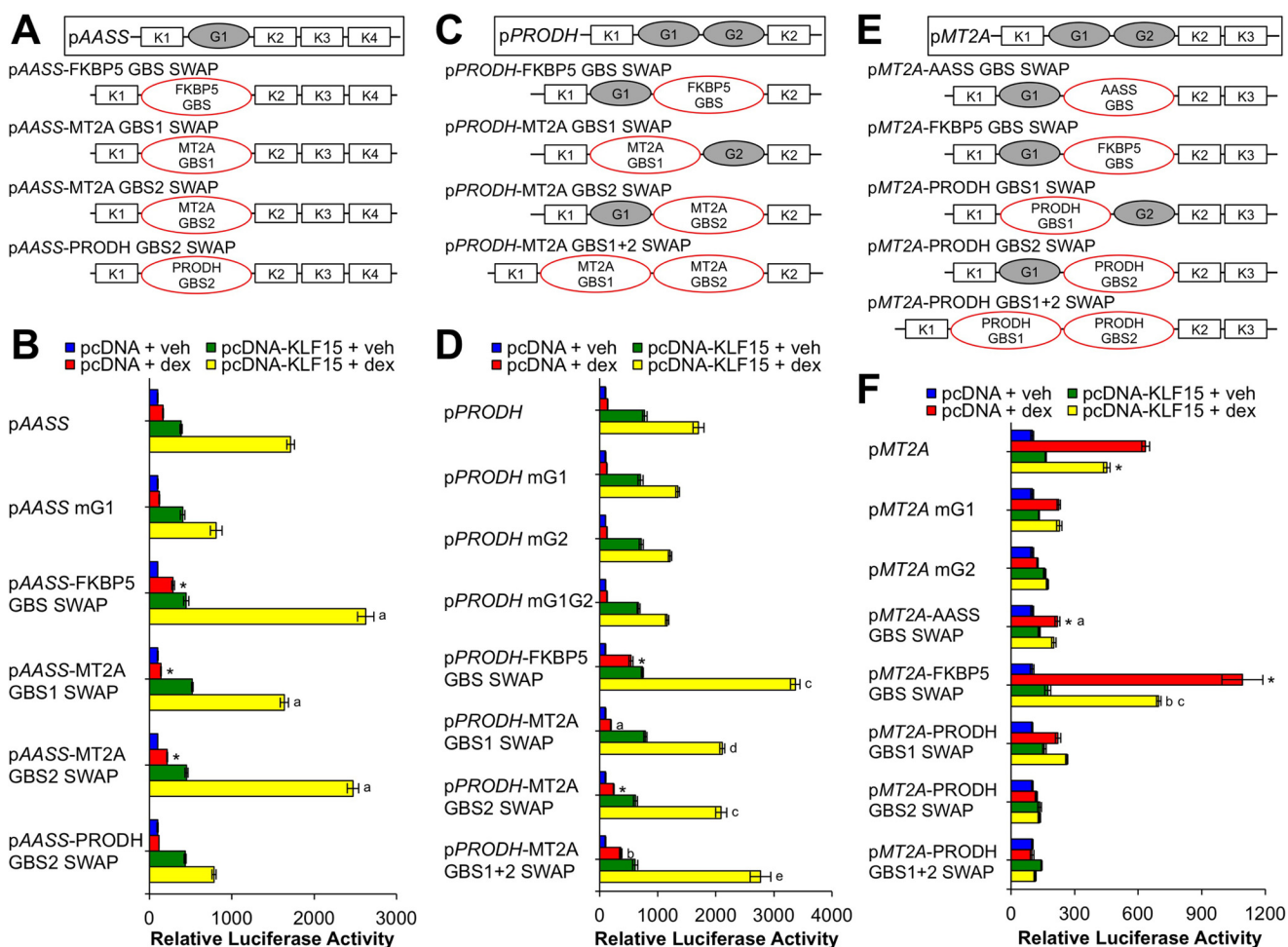


FIGURE 3. GR binding site sequence is not sufficient to determine cooperative interaction between GR and KLF15. A, C, and E, schematic diagrams of GBS swap reporters in which the wild type GBS sequence was mutated to match the GBS(s) of the gene indicated in the red ellipse(s). Luciferase activity of pAASS (B), pPROD H (D), and pMT2A (F) wild type or GBS swap reporters transiently transfected into Beas-2B cells in combination with pcDNA-KLF15 or pcDNA control before treatment with dex or vehicle (*veh*) for 8 h is shown. Bars indicate mean reporter activation (+S.D.) relative to activity in pcDNA + vehicle-treated samples. B, *, $p \leq 0.05$ versus pAASS mG1 pcDNA + dex; a, $p \leq 0.05$ versus pAASS mG1 pcDNA-KLF15 + dex. D, *, $p \leq 0.05$ versus pPROD H mG2 pcDNA + dex; a, $p \leq 0.05$ versus pPROD H mG1 pcDNA + dex; b, $p \leq 0.05$ versus pPROD H mG1G2 pcDNA + dex; c, $p \leq 0.05$ versus pPROD H mG2 pcDNA-KLF15 + dex; d, $p \leq 0.05$ versus pPROD H mG1 pcDNA-KLF15 + dex; e, $p \leq 0.05$ versus pPROD H mG1G2 pcDNA-KLF15 + dex. F, *, $p \leq 0.05$ versus pMT2A pcDNA + dex; a, $p \leq 0.05$ versus pMT2A mG2 pcDNA + dex; b, $p \leq 0.05$ versus pMT2A-FKBP5 GBS swap pcDNA + dex; c, $p \leq 0.05$ versus pMT2A pcDNA-KLF15 + dex.

WT and *Klf15*^{-/-} ChIP samples, we identified a total of 1088 autosomal peaks with differential binding; 781 of these exhibited at least a 2-fold increase in GR occupancy in one of the two cell types. Examples of peaks with increased, decreased, and equivalent GR occupancy in WT compared with *Klf15*^{-/-} cells as visualized in the UCSC Genome Browser are shown in Fig. 4C. We focused our subsequent analysis on differential GBRs with increased occupancy in WT versus *Klf15*^{-/-} MEFs, a pattern that is similar to the regulation of AASS and PROD H by GR and consistent with cooperation between GR and factors that are differentially expressed in WT versus *Klf15*^{-/-} cells. 324 of 781 differentially occupied, dex-inducible sites exhibited greater than 2-fold higher occupancy in WT versus *Klf15*^{-/-} cells after dex treatment. ChIP-qPCR analysis validated that increased GR occupancy in WT cells in comparison with the *Klf15*^{-/-} cells was stable and reproducible at multiple sites identified through ChIP-seq (Fig. 5, A and B). Restoring KLF15 expression via a KLF15-expressing adenovirus (Ad-KLF15), however, did not alter the pattern of GR occupancy at tested sites that exhibited decreased occupancy in *Klf15*^{-/-} cells, sug-

gesting that differential binding was unlikely to be a direct consequence of *Klf15* deficiency.

Affinity Characteristics of Differential GR Binding Regions Determined through Spec-seq—A recent report on cell type-specific estrogen receptor and GR binding sites concluded that GBRs that exhibit “yes/no” cell type specificity generally harbor extremely low affinity GBSs (40). To determine affinity characteristics of the differential GBRs (false discovery rate <0.05) we had identified, we first performed Spec-seq analysis for GR. Spec-seq is a technique that probes a targeted subset of sequence space using EMSAs and deep sequencing to define a PWM for a transcription factor (in this case GR) that includes both positive and negative energies for each residue within the derived binding logo (26, 35). Spec-seq-derived matrices can be used to accurately estimate relative energies of interactions between specific transcription factors and DNA with binding affinity proportional to the inverse of the natural log of the predicted energy. As starting material for this analysis, we used a relatively high affinity GBS found within the *FKBP5* locus as a standard and libraries of partially degenerate matches for the

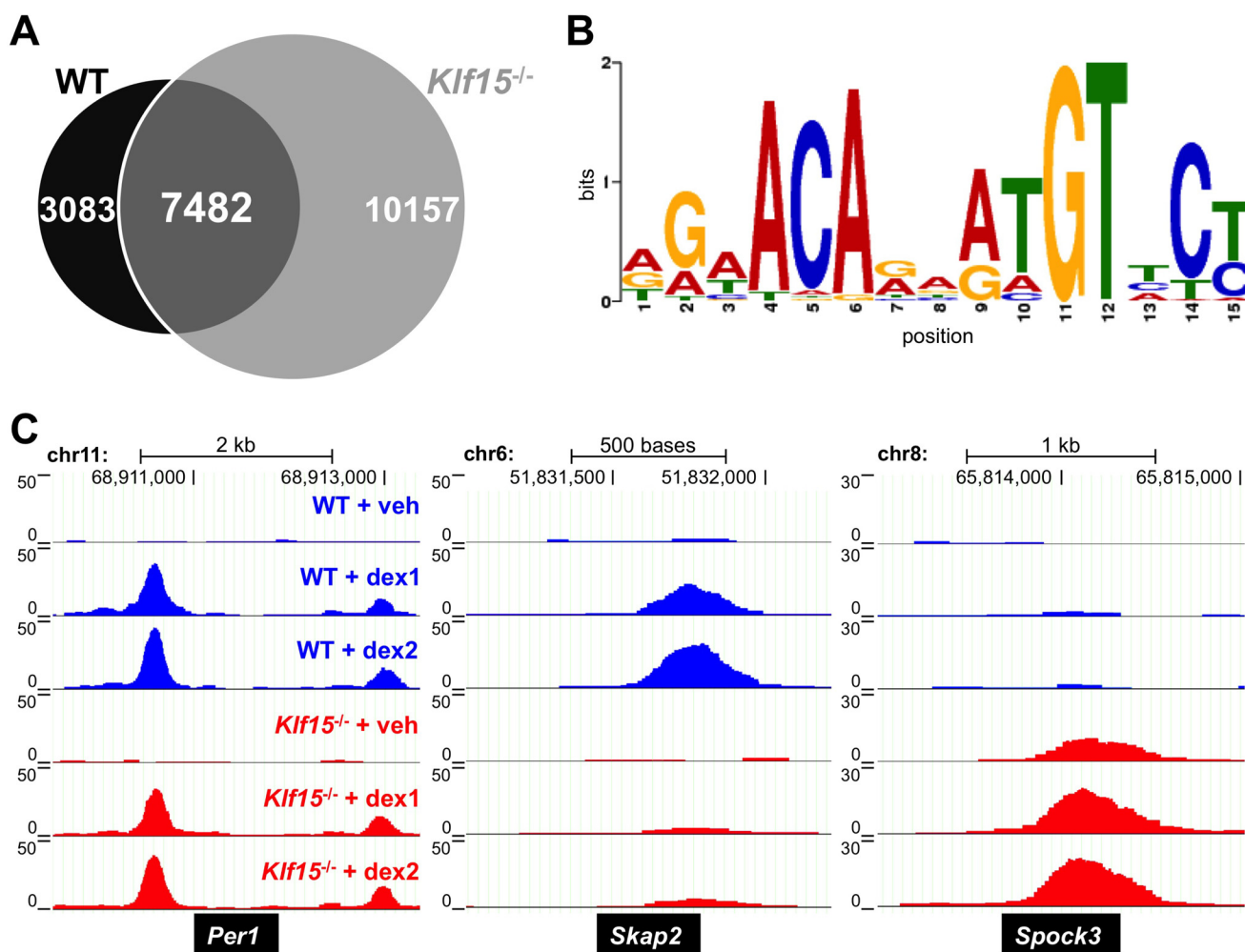


FIGURE 4. Genome-wide characterization of dex-induced GR occupancy in wild type and *Klf15*^{-/-} cells. *A*, Venn diagram depicting binding sites identified by GR ChIP-seq within the upper 80% of read counts that exhibited at least a 2-fold increase in GR occupancy with 1-h dex (1 μ M) treatment compared with vehicle (*veh*). Sites meeting these criteria in wild type MEFs are indicated by the *black* circle, whereas those in *Klf15*^{-/-} MEFs are indicated by the *light gray* circle. Sites shared by both cell types are represented in *dark gray*. *B*, GR binding logo generated through analyzing GBRs from WT MEFs with MEME-ChIP. *C*, examples of GR ChIP-seq peaks with equivalent (*left*), increased (*middle*), and decreased (*right*) GR occupancy in wild type compared with *Klf15*^{-/-} MEFs as visualized in the UCSC Genome Browser. Chromosome number and approximate chromosomal locations of peaks are indicated at the *top* of each panel, whereas the corresponding gene symbols are provided in *black* boxes below each panel. The *vertical* scale on the *left* of each panel indicates normalized occupancy as measured by reads per million reads. *chr*, chromosome.

FKBP5 GBS, including specific sequences from several GBRs identified in our ChIP-seq experiment. EMSA was performed on these libraries using a purified preparation of the GR DNA binding domain, and ratios of bound to unbound fractions were determined for each sequence within the library through quantitative sequencing. Complementary sequences contained within the libraries (*i.e.* oligonucleotides that were included in the library in both forward and reverse directions) exhibited highly correlated bound/unbound ratios and derived energies (Fig. 6*A*) as would be expected for interactions between homodimeric GR and DNA. Regression analysis using all sequences with two or fewer mismatches to the *FKBP5* consensus sequence was used to generate an energy PWM (44) that is shown in Table S4; the corresponding logo is depicted in Fig. 6*B*. Energies calculated using the PWM closely matched actual experimental data for those sequences ($r^2 = 0.95$), indicating that the additivity assumption of the PWM provides a good approximation of the actual binding energies.

We applied the new GR PWM to derive affinities of the GBSs within the *AASS*, *PRODH*, and *MT2A* GREs relative to the maximal predicted affinity (Fig. 6*C*). We found that the *AASS* and *PRODH* GBSs have lower affinity than the *MT2A* GBS2 with calculated affinities of the two *PRODH* GBSs calculated to be ~ 20 -fold less than *MT2A* GBS2 and $\sim 0.8\%$ of maximal possible affinity, whereas the *AASS* GBS affinity was about 3-fold less than *MT2A* GBS2 and $\sim 5\%$ of maximal affinity. These affinity data support a model in which low to moderate affinity GR binding sites contribute to the function of coherent GR-KLF15 response elements.

To determine GBS requirements for conditional GR binding regions more generally, we applied the new PWM for GR to interrogate 301-bp regions at the center of each of the 324 differentially bound sites with at least 2-fold greater occupancy in WT *versus* *Klf15*^{-/-} MEFs after dex treatment. Of these, 181 harbored sites with affinity greater than 1% (*i.e.* $e^{-4.6}$) of the maximal possible affinity for the PWM logo. A graph of the

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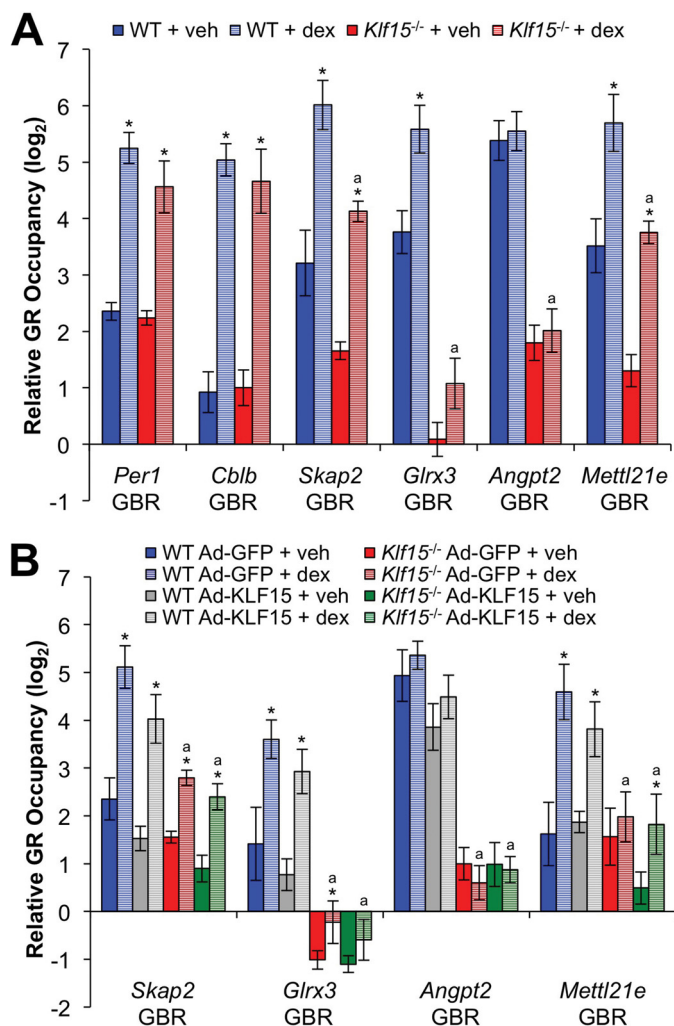


FIGURE 5. Independent validation of differentially occupied GR binding regions identified by ChIP-seq. *A*, ChIP-qPCR analysis of GR occupancy within the indicated genes in wild type and *Klf15*^{-/-} MEF cells treated with dex (1 μ M) or vehicle (*veh*) for 1 h. Relative GR occupancy was calculated as the difference between the C_T value for the indicated target and the geometric mean of C_T values for three negative control regions not associated with GR occupancy. Bars indicate means (+S.D.) expressed on a log₂ scale. *, $p \leq 0.05$ versus respective vehicle-treated control; *a*, $p \leq 0.05$ versus WT + dex. *B*, ChIP-qPCR analysis of GR occupancy within the indicated genes in wild type and *Klf15*^{-/-} MEFs infected with a KLF15-overexpressing (Ad-KLF15) or control (Ad-GFP) adenovirus for ~17 h prior to 1-h treatment with dex (1 μ M) or vehicle. GR occupancy is expressed as described for *A*. *, $p \leq 0.05$ versus respective vehicle-treated control; *a*, $p \leq 0.05$ versus WT Ad-GFP + dex.

distribution of affinities for the entire set relative to maximal predicted affinity is shown in Fig. 6D; the average affinity site is indicated by the vertical red line and was ~1.5% of maximal affinity. We also calculated the maximal affinity GBS within random 301-base pair sequences created by shuffling the set of 324 DBRs and graphed this affinity distribution. Comparison of these distributions shows that the average maximum affinity GBS within the native DBR sequences is higher than in randomized DNA, with the higher average largely attributable to a greater percentage of sites within the native sequence sites with affinities greater than ~1.5% of maximal possible affinity. We also compared the calculated maximal affinity GBS found within each of ~7500 GBRs that are shared between the WT and *Klf15*^{-/-} MEFs with maximal affinity sites found within

shuffled sequences (Fig. 6E). The affinity distributions for these shared sites were strikingly similar to the distributions for sites from binding regions with differential occupancy between WT and *Klf15*^{-/-} MEFs (Fig. 6, compare *E* with *D*). This suggests that binding site affinity is not a primary determinant of differential GR occupancy in WT versus *Klf15*^{-/-} cells.

Context-dependent Correlation between GBS Affinity and Transcriptional Activity—To determine directly the relationship between GR DNA binding affinity and activity within the GR-KLF15 feed-forward GREs, we performed additional GBS swaps into both pAASS and pMT2A to create an affinity series. For this analysis, we chose two additional sites identified within our ChIP-seq data set with calculated affinities between the strong MT2A GBS and the PRODH GBSs. Relative affinities of these and the GBSs used in the previously created swap constructs are shown in Fig. 7A; the affinity of the pPRODH GBS2, which was the lowest affinity site that we tested in our mutational analysis, was set at 1. We tested each of these constructs in luciferase assays (Fig. 7, B and E) and subsequently graphed the resulting relative luciferase activities as a function of the common log of the relative affinity of the specific GBS present in each swap construct (Fig. 7, C and F). Calculation of the Pearson correlation coefficient and linear fitting showed that binding site affinity was moderately ($r^2 = 0.73$) but significantly ($p < 0.05$) correlated with AASS GRE transcriptional output with dex treatment alone. The addition of KLF15 increased the slope of the linear relationship but did not substantially alter the strength of correlation. For the MT2A GRE, the correlation between affinity and output was much stronger ($r^2 = 0.890$) with dex treatment alone. As was the case for AASS, the addition of KLF15 modulated the slope but not the strength of correlation, although in this case (consistent with an incoherent FFL), the slope was reduced by KLF15. Taken together, these data indicate that correlations between GR binding site affinity and the transcriptional output of GR-KLF15 FFLs are governed by both response element architecture and KLF15 expression.

Discussion

Glucocorticoids can both induce costly metabolic programs and regulate normal circadian physiologic rhythms, but the basis for differential gene expression responses to hormone have not been fully established. Here we show that GR-controlled coherent feed-forward regulation of AASS and PRODH, both of which encode enzymes involved in amino acid metabolism, utilizes low to moderate affinity GR binding sites and a presumptive physical interaction between GR and KLF15 to enable combinatorial regulation. As KLF15 is expressed at very low levels in many cell types and tissues prior to induction by GR, this architecture is congruent with “and” regulatory logic in which control of AASS and PRODH expression by GR through the tested GREs depends on the presence of both ligand-activated GR and time-dependent accumulation of KLF15. These data provide a mechanistic explanation for the distinct timing properties we observed previously for targets of the GR-KLF15 axis where genes that required KLF15 for maximal induction by GR, such as PRODH, exhibited a relative delay in peak expression in comparison with KLF15-repressed targets. Feed-forward response elements that utilize low affinity GR binding

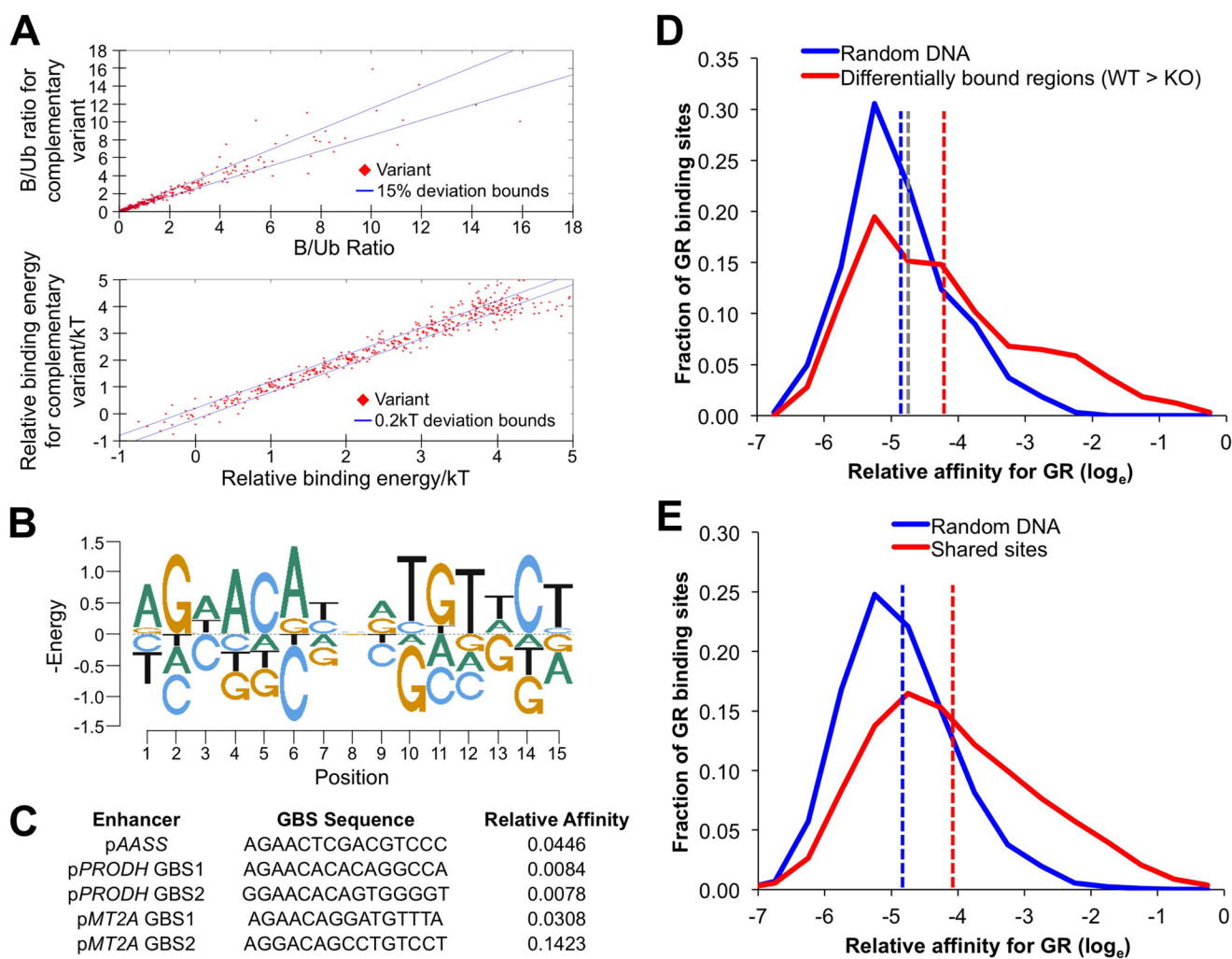


FIGURE 6. Derivation and application of a refined position weight matrix for GR using Spec-seq. *A*, correlation of bound and unbound fractions (*top* graph) and derived energies (*bottom*) for complementary oligonucleotides included within a representative library of binding sites analyzed for GR binding by EMSA and sequencing. *B*, energy logo derived from an oligonucleotide pool of known and putative GR binding sites and semidegenerate sequences that illustrates the preferred binding sequence identified for GR. The *heights* of each *letter* are the energies (in *kT* elements) for each base adjusted so the sum for each position is 0. The energy scale is negative so the preferred sequence (lowest energy) is on *top*, and the bases are in order from highest (*top*) to lowest (*bottom*) affinity. *C*, relative binding affinities of native GR binding site sequences in the glucocorticoid response elements mediating pAASS, pPRODH, and pMT2A feed-forward regulation. *D*, graphs fitted to relative calculated affinities for the peak affinity GR binding site identified within each of the 324 differentially bound regions (*red*) and shuffled sequences (*blue*) as described in the text. The *red dashed line* indicates mean relative affinity of native DNA sites, the *blue dashed line* indicates mean relative affinity of shuffled sites, and the *gray dashed line* is the calculated affinity of the PRODH GBS that is required for full activity of the PRODH GRE. *E*, similar to *D* above except that the relative calculated affinities for the peak affinity GR binding site within each of the ~ 7500 peaks that overlap between WT and *Klf15*^{-/-} MEFs and shuffled sequences are depicted.

sites in combination with requisite cooperation between GR and GR-induced transcription factors may thus enable both graded and time-dependent gene expression responses to hormone.

Although FFLs have only recently been recognized as a regulatory paradigm for GR, relationships among GR binding site affinity, sequence, and transcriptional responses have been intensely studied for years. Proposed associations between these parameters include the notion that binding site affinity correlates directly with transcriptional responses to glucocorticoids (45). Others have proposed that allosteric interactions between GR and individual GBSs (10, 36) or interactions between GR and other DNA-associated factors (40, 46, 47) decouple GR activity at specific GBSs from *in vitro* binding affinity. Our data support a hybrid paradigm in which both binding site affinity and tethering between GR and other factors

are key determinants of the GR response. Specifically, for the MT2A GRE, we observed a striking correlation ($r^2 = \sim 0.897$, $p < 0.001$; see Fig. 7F) between affinity and output over an ~ 60 -fold range of calculated GR binding affinities and ~ 15 -fold range in measured activities. Whereas the slope of the linear relationship was altered by the addition of KLF15, the coefficient of correlation was essentially unchanged. Thus, even in the context of a very strong correlation between binding site affinity and the transcriptional response, the activity of additional factors, in this case KLF15, can dramatically impact the transcriptional response to GR activation.

The correlation between transcriptional output and binding site affinity for the AASS GRE albeit still highly significant ($r^2 = \sim 0.737$, $p < 0.05$) was substantially weaker than the correlation observed for MT2A. An additional difference in the relationship between affinity and response between the two GREs was

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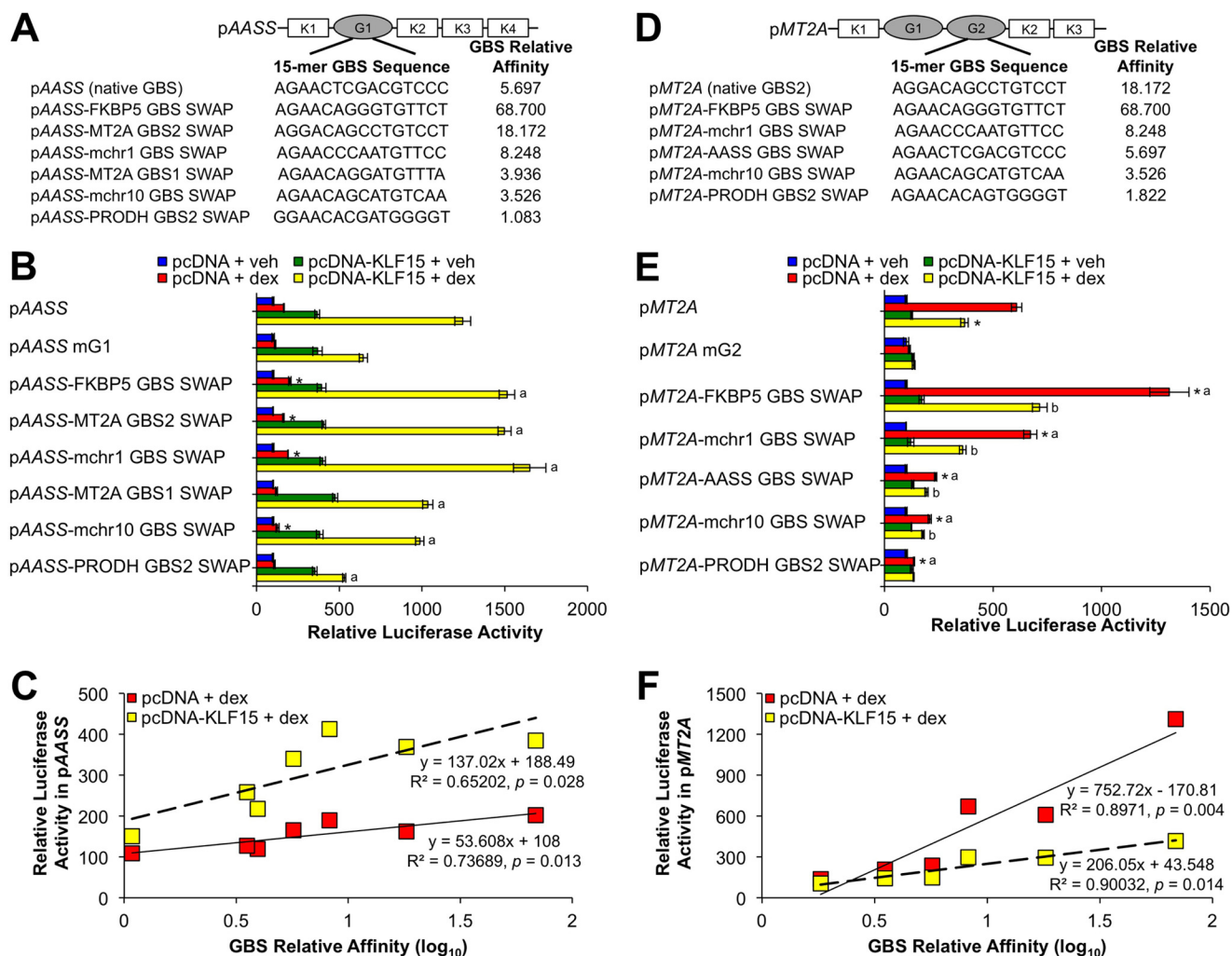


FIGURE 7. GR binding site affinity correlates with transcriptional output in a context-dependent manner. *A* and *D*, 15-mer nucleotide sequences and corresponding relative affinities of GR binding sites swapped into the indicated sites of pAASS (*A*) and pMT2A (*D*) reporters by site-directed mutagenesis to generate GBS swap constructs. *B*, luciferase activity of pAASS wild type, mG1, and GBS swap reporters transiently transfected into Beas-2B cells in combination with pcDNA-KLF15 or pcDNA control prior to 8 h of treatment with dex or vehicle (*veh*). Bars indicate mean reporter activation (\pm S.D.) relative to activity in pcDNA + vehicle-treated samples. $^* p \leq 0.05$ versus pAASS mG1 pcDNA + dex; $^{\circ} p \leq 0.05$ versus pAASS mG1 pcDNA-KLF15 + dex. *C*, scatterplot of pAASS wild type and GBS swap reporter activations obtained in *B* following treatment with pcDNA + dex (relative to pcDNA + vehicle) or pcDNA-KLF15 + dex (expressed relative to pcDNA-KLF15 + vehicle) as a function of the relative affinity (on a \log_{10} scale) of the GBS contained within that construct. *E*, reporter activity of pMT2A wild type, mG2, and GBS swap constructs in Beas-2B cells transfected and treated as described for *B*. $^* p \leq 0.05$ versus pMT2A pcDNA + dex; *a*, $p \leq 0.05$ versus pMT2A mG2 pcDNA + dex; *b*, $p \leq 0.05$ versus respective activity with pcDNA + dex. *F*, scatter plot of pMT2A wild type and GBS swap reporter activations obtained in *E* as a function of the relative affinity (on a \log_{10} scale) of the GBS contained within that construct as described for *C*.

that maximal transcriptional activity of the AASS GRE occurred when a GBS of intermediate affinity was substituted into the locus, whereas for MT2A, transcriptional activity increased throughout the range of tested GBS affinities. Thus response element composition can specify both the coefficient of correlation relating affinity to transcriptional output and the affinity threshold required for peak activity. The mechanisms underlying these properties of the AASS and MT2A GREs and whether these observations can be generalized to other GREs remain to be determined.

Whereas functional roles for both KLF15 and GR binding sites within the AASS and PRODH GREs were clearly established by our extensive mutational analysis, our data do not fully explain how GR and KLF15 associate with these response elements to enable cooperative induction. Specifically, combinatorial disruption of the entire set of putative GR and KLF15 binding sites identified by sequence scanning with Matinspec-

tor did not completely abrogate induction of either GRE by dex + KLF15. This raises the possibility that GR and/or KLF15 can associate with additional DNA binding factors that also interact with these regulatory regions. Alternatively, additional binding sites for GR and/or KLF15 may be present within the AASS and PRODH GREs that were not recognized by Matinspector. In that regard, interrogation of these response elements using our new PWM identified several additional putative GBSs with calculated affinities that were similar to the GBSs already analyzed within the PRODH GRE; functional analysis of these sites, which are delineated in supplemental Fig. S1, is underway. Further characterization of KLF15 binding preferences both *in vitro* and *in vivo* may similarly facilitate the identification of additional putative KLF binding sites within these loci.

The inability of exogenous KLF15 to restore the GR binding pattern we observed in *Klf15*^{-/-} MEFs to the WT pattern sug-

gests that multiple mechanisms contribute to establishing GR binding regions within MEFs and presumably other cell types. These potentially include sex-mediated effects on GR binding as well as stable alterations in the expression of compensatory transcription factors and chromatin structure caused by *Klf15* deficiency. The importance of cellular context in modulating GR-KLF15 function is further highlighted by the absence of prominent GR binding in WT MEFs within the endogenous *AASS* and *PRODH* loci (see the data set submitted to Gene Expression Omnibus (GSE69947)), which we have shown are regulated and occupied by GR and KLF15 in several other cell types (15, 48). Thus, although binding site affinity can contribute to transcriptional regulation by GR, this effect is subordinate to the overall regulatory context, which may confer (or prohibit) GR access to specific regulatory sites irrespective of the underlying binding site sequence.

Analysis of site affinities within ChIP-seq data further supports a model in which both site affinity and regulatory context determine the GR response. Indeed, based on the PWM for GR that we derived from Spec-seq, ~40% of randomly shuffled 301-bp sequences contain a GBS with an affinity greater than ~0.8% of the maximal possible site affinity, similar to the affinity of the GBSs within the *PRODH* locus. Thus, sites that are capable of mediating responses to GR occur frequently within random DNA, indicating that their activity is likely tempered/controlled by additional factors. Interestingly, these data contrast with prior studies where the average calculated peak GR binding affinity within native 100-bp regions that were occupied by GR specifically in A549 cells appeared to be <0.1% of maximal affinity (40). Variations between algorithms that interrogate DNA using highly specified motifs *versus* identifying sequence matches using the Spec-seq-defined PWM for GR, which reduces mismatch penalties through assigning biochemically derived energy differences for all four bases at each position within the logo, likely accounts for these differences. Although the Spec-seq logo was generated based on *in vitro* EMSA analysis performed with a purified preparation of the GR DNA binding domain, the calculated affinity range for biologically active GBSs using this logo was ~125, which appears more plausible than much larger operational affinity ranges obtained by others (40); the close match of affinity to output that we observed also suggests that the calculated relative binding affinities reflect biologic properties of the sites.

The affinity distributions derived from random DNA sequences in comparison with GR-occupied regions suggests a model in which there is both positive and negative selection for GR binding site sequences and their function. Inspection of the affinity distributions in Fig. 6, C and D, shows that a subset of GBRs contain GBSs that rarely occur in random DNA, indicating as reported by others a strong positive selection for a subset of GR binding sites within the GR cistrome (40, 49). In contrast, the middle portion of the GBR peak affinity distribution has significant overlap with sites found in shuffled DNA, although the frequency of sites with affinities between ~1 and 10% of maximal affinity (*i.e.* $e^{-4.5}$ – $e^{-2.2}$) is modestly higher within GBRs than random DNA, suggesting a component of positive selection for such sites. As sequences with calculated affinities within this range can mediate responses to GR, evolutionary

pressure likely extends to DNA in the neighborhood of randomly occurring low-moderate affinity GR binding sequences, potentially resulting in the selection of nearby sequences that enable the activity of cis-acting activators or repressors of GR.

Although in our affinity studies we selected for GR dimer-bound sequences, there has recently been compelling evidence to suggest that GR associates with chromatin and regulates transcription as a monomer. Two recent studies used “ChIP-exo” in which exonuclease digestion is used to generate footprints from immunoprecipitated chromatin to identify regions potentially occupied by monomeric GR within genomic DNA (50, 51) exemplified in the study from Starick *et al.* (51) by the discovery of a combinatorial site for monomeric GR and TEA Domain (TEAD) transcription factors. Interestingly, the calculated affinity of the GR dimer for the native 15-base sequence, GGAATG GAA TGTTCT, which encompasses several putative GR/TEAD “composites,” was ~3.5% of the maximal possible affinity for the GR dimer. This is well within the range of affinities that were functional in our transfection-based assays of GR activity. But is GR working as a monomer or dimer at these sites? Although the presence of a potential transcriptionally active binding site for the dimer at the location of these footprint-protected GR “half-sites” does not preclude monomeric occupancy by GR, a statistical mechanical model in which the monomer and dimer states are in dynamic equilibrium could potentially reconcile these seemingly contradictory data. In this model, one half of the dimer has a greater overall dwell time with a half-site than the other, resulting in a preferential protection of that half-site from exonuclease digestion. Thus, dimeric GR may not appear as the dominant species at some genomic regions in the time regime of ChIP-exo. This model is bolstered by studies showing that the dynamics of genomic association influence the ChIP-exo footprint (52). An intriguing corollary to this model is that a combination of strong and weak half-sites, together comprising a low-moderate affinity site for a GR dimer, may allow greater positional freedom for dimeric GR to associate with other transcription factors. Alternatively, GR may occupy selected individual binding regions as either a monomer or as a dimer in a process that could vary between chromosomes within the same cell and/or depend on cellular context. In either case, it will be interesting to determine whether genomic regions in which GR occupancy had been previously attributed to GR tethering interactions with other factors or monomeric binding (53) harbor sequences with calculated affinity for GR that is greater than or equal to the affinity of *PRODH* GBS1.

Gene regulation through GR-driven FFLs utilizes sequence information from both GR binding sites and binding sites for the second component of the FFL, thus expanding the available information content that directs transcriptional response to hormone. In that regard, the utilization of submaximal affinity binding sites within the coherent GR-KLF15 FFLs we analyzed is strikingly reminiscent of elegant work by Granner and co-workers (9, 54, 55) in which low affinity GR binding sites and interactions between GR and lineage-restricted transcription factors were implicated in restraining regulation of gluconeogenesis by GR to the liver. Thus, within the context of a GRE, relatively weak matches for the consensus palindromic GR logo

appear to participate in both specifying the operational cell type and establishing the response dynamics of metabolic gene induction by GR. Although GREs and gene expression kinetics are subject to many additional layers of regulation beyond that enabled by the GBSs (56–59), our data support a model in which sites with submaximal binding affinity for GR are used both to optimize the utilization of potentially costly metabolic pathways and to endow clients of GR-driven FFLs with preferred expression dynamics. A molecular prediction based on this model is that GREs with time-dependent increases in occupancy following exposure to ligand contain GBSs of lower average affinity than GREs that achieve rapid peak GR binding; “slow occupancy” sites are also predicted to contain active sites for other factors that are themselves regulated by GR. Future studies that combine genome-wide investigation of the temporal properties of GR occupancy with detailed interrogation of specific time-dependent GREs can be used to test these hypotheses.

Author Contributions—S. K. S. designed, performed, and interpreted experiments and co-wrote the manuscript. Z. Z. designed, performed, and interpreted experiments. V. K. performed and interpreted experiments and reviewed the manuscript. L. Z. performed protein purification for Spec-seq and reviewed the manuscript. M. A. P. reviewed the manuscript and assisted in data interpretation. M. K. J. reviewed the manuscript. T. L. P. interpreted ChIP-seq data. G. D. S. designed and interpreted experiments and reviewed the manuscript. A. N. G. conceived the project, designed and interpreted experiments, and co-wrote the manuscript.

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