# Microbiota modulate transcription in the intestinal epithelium without remodeling the accessible chromatin landscape

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Microbiota regulate intestinal physiology by modifying host gene expression along the length of the intestine, but the underlying regulatory mechanisms remain unresolved. Transcriptional specificity occurs through interactions between transcription factors (TFs) and *cis*-regulatory regions (CRRs) characterized by nucleosome-depleted accessible chromatin. We profiled transcriptome and accessible chromatin landscapes in intestinal epithelial cells (IECs) from mice reared in the presence or absence of microbiota. We show that regional differences in gene transcription along the intestinal tract were accompanied by major alterations in chromatin accessibility. Surprisingly, we discovered that microbiota modify host gene transcription in IECs without significantly impacting the accessible chromatin landscape. Instead, microbiota regulation of host gene transcription might be achieved by differential expression of specific TFs and enrichment of their binding sites in nucleosome-depleted CRRs near target genes. Our results suggest that the chromatin landscape in IECs is preprogrammed by the host in a region-specific manner to permit responses to microbiota through binding of open CRRs by specific TFs.

## [Supplemental material is available for this article.]

Animal physiology is directed by interactions between factors encoded in the animal's genome and those encountered in its environment. The impact of these interactions on animal health is most evident in the intestine, where digestion and absorption of dietary nutrients occur in the presence of complex communities of microorganisms (intestinal microbiota). The identification of intestinal microbiota as prominent environmental factors shaping diverse aspects of intestinal and extraintestinal health and disease has fueled intense interest in defining the mechanisms underlying host-microbiota interactions (Sommer and Bäckhed 2013). The primary interface between animal hosts and their microbiota is the intestinal epithelium, which encounters dynamic environmental stimuli from microbiota along the length of the gut (Camp et al. 2009; Pott and Hornef 2012). As with other tissues, intestinal epithelial function is predicated on the ability to produce and maintain multiple cell types while also retaining the ability to respond to environmental stimuli, all using the same genome. Accordingly, the intestinal epithelium exhibits extensive functional specialization along its proximal-distal axis characterized by distinct gene expression programs and differences in cell-type abun-

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Article published online before print. Article, supplemental material, and publication date are at http://www.genome.org/cgi/doi/10.1101/gr.165845.113.

dance (van der Flier and Clevers 2009). Comparisons of mice reared in the absence of microorganisms (germ-free or GF) to those colonized with a normal microbiota have revealed that gene expression in the intestine is profoundly altered by the presence of a microbiota (Rawls et al. 2006; El Aidy et al. 2012; Larsson et al. 2012; Pott et al. 2012). Furthermore, comparisons of GF mice to those colonized by microbiota for variable lengths of time revealed that microbiota-induced alterations to host gene expression are temporally dynamic and require several weeks to reach homeostasis (El Aidy et al. 2012, 2013). Proper orchestration of these microbiota-induced gene expression programs in a tissue-specific context is essential for establishing host-microbe commensalism and sustaining host health. However, the regulatory mechanisms through which microbiota modify host gene expression in the intestinal epithelium remain unresolved.

Specification and tuning of gene transcription proceeds in part through coordinate interactions between transcription factors (TFs) and *cis*-regulatory DNA. *Cis*-regulatory regions (CRRs) harbor binding sites for multiple activating or repressing TFs and can be

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located proximal to the transcription start site (TSS), within gene bodies, as well as in intergenic regions distal to the TSS (Bulger and Groudine 2011). CRRs are generally distinguished by the low occupancy of nucleosomes on genomic DNA, which can be experimentally captured by hypersensitivity to DNase I cleavage (Boyle et al. 2008). DNase-seq is a high-throughput, quantitative method that generates genome-wide accessible chromatin profiles which strongly correlate with in vivo transcription factor occupancy and gene expression levels (Thurman et al. 2012). We reasoned that DNase-seq could be used to discover CRRs of various types (e.g., promoters, enhancers, silencers, locus control regions) that mediate host transcriptional responses to microbiota in epithelial cells along the length of the intestinal tract. We found that regional differences in gene transcription along the length of the intestine were accompanied by major alterations in the accessible chromatin landscape. Surprisingly, we discovered that commensal microbiota modify the transcriptional landscape in the intestinal epithelium without significantly impacting the accessible chromatin landscape. Instead, we find that open intestinal CRRs linked to microbiotaresponsive genes are enriched with binding motifs for microbiotaresponsive TFs. Our results suggest that the chromatin landscape in intestinal epithelial cells is "preprogrammed" by the host in a region-specific manner to permit transcriptional responses to environmentally acquired intestinal microbiota likely through differential binding of CRRs by specific TFs. This data extends support for the model that cell fate specification is associated with acquisition of a specific accessible chromatin architecture, which is subsequently utilized by cells to respond to a perpetually dynamic environment (John et al. 2011; Samstein et al. 2012). Cumulatively, this work provides a foundational approach and essential resource for understanding the role of the cis-regulatory genome in

# Results

#### RNA-seq reveals acute and chronic transcriptome alterations in response to microbiota in the mouse ileal and colonic epithelium

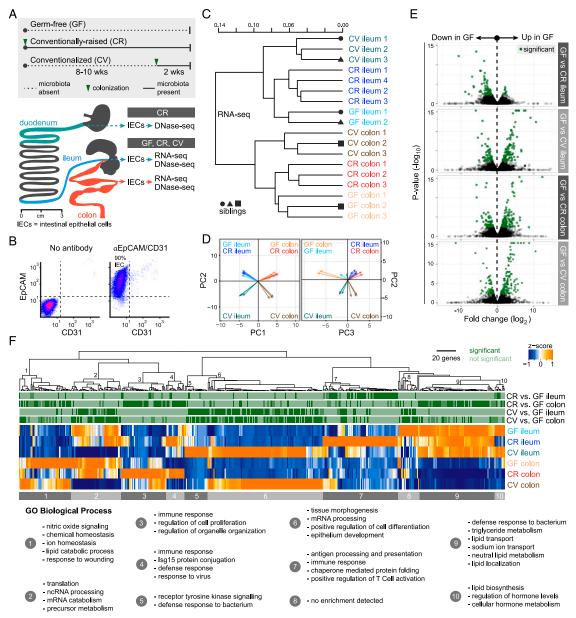
mediating host-microbe commensalism in the intestine.

To determine the genome-wide impact of microbiota on host gene transcription in the gut epithelium, we measured the messenger RNA transcriptome in intestinal epithelial cells (IECs) isolated from the ileum and colon of mice reared in the presence and absence of microbiota (Fig. 1; Supplemental Table S1). We compared three distinct microbial states in order to determine acute and chronic effects of microbiota on host transcription (Fig. 1A). Germfree (GF) mice were reared for 10-12 wk in the absence of any microbes. Conventionally raised (CR) mice were reared since birth in the presence of microbiota for 10-12 wk (chronic colonization). Conventionalized (CV) mice were reared under GF conditions for 8-10 wk and then colonized for two weeks with microbiota (acute colonization). Isolated IECs display uniform expression of the panepithelial cell surface marker EpCAM (Bjerknes and Cheng 1981; von Furstenberg et al. 2011) and lack the CD31 endothelial and immune cell surface marker (Fig. 1B). As expected, we observed robust differences between ileal and colonic IEC transcriptomes, supporting the significant physiological differences between these distinct tissues (Fig. 1C,D; Supplemental Figs. S1, S2; Supplemental Table S2). Biological replicates from each microbial state clustered together, a result consistent in both the ileal and colonic epithelium (Fig. 1C). We found that acute colonization (CV) has a larger impact on IEC gene expression than lifelong presence of microbiota (CR) in comparison to GF IEC transcriptomes, a finding supported by previous studies of temporal responses to microbiota (Fig. 1C,D; El Aidy et al. 2012, 2013). We determined a set of genes from CR and CV mice that were significantly different than GF in either the ileum or colon (Fig. 1E; Supplemental Table S3). Hierarchical clustering of these genes followed by Gene Ontology (GO) functional categorization revealed the impact of microbiota on distinct intestinal epithelial biological processes in each tissue (Supplemental Table S4). Consistent with previous studies (Rawls et al. 2006; El Aidy et al. 2012; Larsson et al. 2012; Pott et al. 2012), our RNA-seq data reveal that microbiota induce various aspects of immune response in both ileal and colonic IECs under both CR and CV conditions (Fig. 1F). Gene clusters involved in transport and metabolism of lipids and other nutrients were generally down-regulated by microbiota in both the ileum and colon. Together, our RNA-seq data revealed that gut microbiota elicit genome-wide alterations to host gene transcription in the intestinal epithelium, a response that varies depending on intestinal region and time post-colonization.

## Chromatin accessibility displays regional variation along the length of the GI tract and correlates with gene expression

We next sought to determine the feasibility of using DNase-seq to discover cis-regulatory regions (CRRs) that control epithelial transcriptional response to gut microbiota along the length of the intestine (Fig. 2). Because there is high endogenous DNase activity in the intestine (Fig. 2A; Lacks 1981), we developed a modified DNase-seq protocol (Song and Crawford 2010) using endogenous DNases to digest IEC chromatin (Fig. 2B). Using CR mice, we found that endogenous DNase activity identified duodenal, ileal, and colonic DNase hypersensitive sites (DHSs) that are highly reproducible (Supplemental Fig. S3), often evolutionarily conserved (Fig. 2C; Supplemental Fig. S4B), demarcate transcription start sites in promoter regions (Fig. 2D,E), and overlap both novel and previously described intestinal enhancers (Fig. 2E; Supplemental Fig. S4C-F; Madison 2002; Shen et al. 2012). In addition, DNase-seq in IECs identified accessible chromatin at biomarker genes associated with abundant and rare epithelial cell types including enterocytes, enteroendocrine cells, goblet cells, Paneth cells, and stem cells (Supplemental Fig. S5). These results confirm that our modified DNase-seq strategy effectively captures the IEC accessible chromatin landscape in the duodenum, ileum, and colon and exhibited hallmarks of previously described DNase-seq data sets that used exogenous DNase to digest chromatin.

Proximal-distal functional specialization along the intestinal tract is associated with widespread alterations in gene expression (Fig. 1; Supplemental Fig. S2), but the relationship with the accessible chromatin landscape was unknown. We compared DNaseseq in IECs isolated from the duodenum, ileum, and colon of CR mice (see Methods) in order to discover segment-specific cisregulatory regions (CRRs) along the length of the intestine (Fig. 2E; Supplemental Table S5). We identified 131,073 accessible chromatin regions that are shared between each segment of the intestinal tract (Fig. 2F). These "pan-intestine" DHSs are associated with a wide variety of genes that have known functions in intestinal epithelial cell biology including an enrichment near genes involved in nutrient transporter activity, adherens junctions, and intestinal morphogenesis (Supplemental Table S6). We identified 7211 DHSs that are common to both the epithelium of duodenum and ileum but absent from the colon (small intestine-specific). These DHSs are near genes enriched in GO Biological Process categories characteristic for small intestinal activities including me-



**Figure 1.** RNA-seq reveals transcriptome alterations in the presence and absence of microbiota in the mouse ileal and colonic epithelium. (*A*) Overview of experiments described in this study. Schematic of the mouse gastrointestinal tract showing the stomach (dark gray), duodenum (teal), jejunum (dark gray), ileum (blue), cecum (dark gray), and colon (red). Adapted from Stevens (1977). © 1933 by H.H. Dukes; © 1977 by Cornell University. Used by permission of the publisher, Cornell University Press. Approximately 6-cm sections of the duodenum, ileum, or colon were used for intestinal epithelial cell (IEC) isolation (see Methods). DNase-seq and RNA-seq were performed on intestinal epithelial cells (IECs, ~90% purity) isolated from the ileum and colon of germ-free (GF), conventionally raised (CR), and ex-GF conventionalized (CV) mice. DNase-seq was also performed on IECs isolated from the duodenum of CR mice. (*B*) Fluorescence-activated cell sorting of pooled duodenal and ileal IECs labeled with antibodies marking either epithelial cells (EpCAM) or endothelial cells/leukocytes/platelets (CD31) reveal that ~90% of cells were epithelial (EpCAM positive and CD31 negative). Similar results were obtained from colonic IEC preparations (data not shown). (*C*) Dendrogram of Jensen-Shannon divergence shows that RNA-seq replicates from GF, CR, or CV ileal or colonic IECs cluster. Note that anatomical location and environmental condition, rather than sibling relationship, drives the clustering. (*D*) Principal component analysis (PCA) confirms tissue type (PC1) and colonization state (PC2 and PC3) explains much of the variance observed in the RNA-seq data. Arrow tips denote sample position in PCA coordinates. (*E*) Volcon plot showing pairwise comparisons of RNA expression between GF versus CR and GF versus CV conditions for each tissue. Green dots represent genes that are significantly different (FDR < 0.05). (*F*) Hierarchical clustering of FPKM values for each gene cluster. See also Supplemental Tables S1, S3, and S4.

tabolism of steroids, peptides, lipids, and lipoproteins (Supplemental Table S6). In addition, we identified 2361, 2554, and 21,724 DHSs that are specific to the duodenum, ileum, or colon, respectively, with a false discovery rate (FDR) < 0.0001 (Fig. 2F,G).

These segment-specific DHSs are generally located in intergenic or intronic DNA (Fig. 2H, D), are enriched for whole intestine-specific H3K4me1 histone marks (enhancers) (Supplemental Fig. S4D–F), and are near genes enriched in diverse molecular functions and

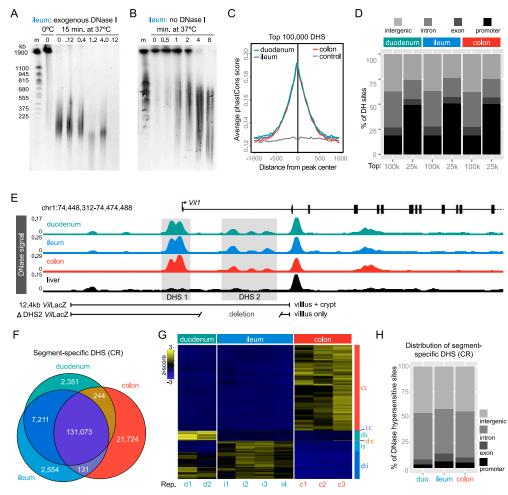


Figure 2. Endogenous DNase activity distinguishes open chromatin in mouse intestinal epithelial cells. (A) Pulse-field gel image of nuclei digested for 15 min at 37°C with increasing concentrations of exogenous DNase I. Note that high-molecular-weight (HMW) DNA is stable at 0°C; however, there is significant DNA digestion even with no addition of exogenous DNase when nuclei are incubated for 15 min at 37°C. (m) Yeast chromosome marker. (B) Endogenous DNase activity is detected within 30 sec after moving nuclei to 37°C, and by 8 min, most HMW DNA is digested. Patterns were consistent for duodenum, ileum, and colon (see Supplemental Fig. S4). The observed digestion pattern is similar to reported digestion patterns using exogenous DNase I (Song and Crawford 2010). For DNase-seq library preparation, nuclei digested for 2, 4, and 8 min were pooled to capture a range of DNase hypersensitivities. Libraries were prepared for duodenal, ileal, and colonic IECs. (Č) Average phastCons scores plotted for the top 100,000 DHSs from duodenal, ileal, and colonic IECs centered at the peak maximum. Nongenic DNA flanking ileal DNase hypersensitive sites (DHSs) was used to assess background conservation (control). (D) Feature distribution of the top 100,000 and 25,000 DHSs from each tissue. Note the increased representation of promoter-associated sites (<2 kb from annotated transcription start sites) in the 25,000 DHSs with the highest signal intensity. (E) DNase-seq signal tracks from conventionally raised (CR) duodenal, ileal, and colonic IECs at the villin 1 (Vil1) locus. Note strong peaks at the transcription start site (DHS 1) and within the first intron (DHS 2). A 12.4-kb region including both DHS 1 and DHS 2 drives IEC-specific crypt and villous expression in the duodenum, ileum, and colon (Madison 2002); however, DHS 2 is required for crypt expression. For comparison, DNase-seq signal from the liver is also shown. (F) Venn diagram enumerating differential DHSs along the length of the Gl tract. (G) Hierarchical clustering of differential DHSs across replicates of CR duodenal, ileal, and colonic IECs reveals open chromatin sites specific to each tissue. (cs) Colon-specific; (i:c) ileum and colon; (ds) duodenum specific; (d:c) duodenum and colon; (is) ileum specific; (d:i) duodenum and ileum. (H) Feature distribution showing that the majority of segment-specific DHSs are located in intergenic (>2 kb away from a gene body) or intronic regions of the genome. See also Supplemental Figures \$2-\$4 and Supplemental Tables \$4 and \$6.

biological processes specific to each intestinal segment (Supplemental Table S6). These data provide a genome-wide atlas of accessible chromatin in the intestinal epithelium of conventionally raised mice and indicate significant regional specialization of gene regulatory activity in IECs along the length of the intestinal tract.

We next compared the mRNA and accessible chromatin landscapes in CR ileal or colonic IECs to determine the correlation of segment-specific DHSs with gene expression. We identified 2773 transcripts that are differentially expressed between ileal and colonic IECs (Fig. 3A; Supplemental Fig. S2; Supplemental Table S2). We also identified numerous quantitative differences in DNase hypersensitivity between ileal and colonic IECs (Fig. 3B). Qualitatively, we found that many differentially expressed genes have one or more segment-specific DHSs nearby, which likely explains differences in gene expression observed between ileal and colonic IECs. For example, diacylglycerol O-acyltransferase 1 (*Dgat1*), an enzyme that catalyzes the formation of triglycerides in ileal enterocytes (Lee et al. 2010), is highly expressed in the ileum but not the colon (Fig. 3C). DNase-seq identified accessible chromatin in the first and third introns of *Dgat1* specific to the ileal epithelium (Fig. 3C). In contrast, the aquaporin 8 (*Aqp8*) gene encodes a water channel protein highly expressed in the colonic epithelium (Yang et al. 2005) and has a colon-specific DHS ~13 kb upstream of the transcription start site (Fig. 3C). Indeed, most genes (1897 out

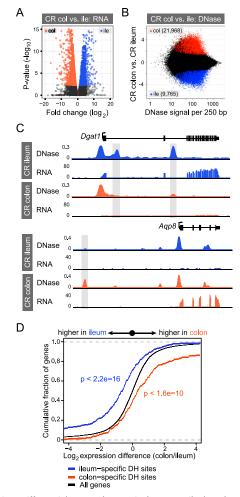


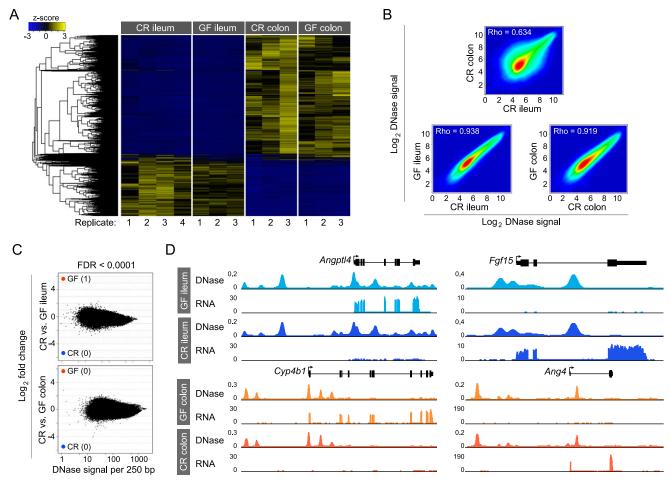
Figure 3. Differential open chromatin between ileal and colonic IECs correlates with differential gene expression. (A) Volcano plot showing pairwise comparison of RNA expression between conventionally raised (CR) ileal and colonic epithelium. Blue and orange dots represent genes more highly expressed in the ileum or colon, respectively (FDR < 0.05). (B) The fold difference in DNase signal intensity from CR ileal versus colonic IECs plotted against the average DNase signal observed in 250-bp windows. Significantly differential windows are highlighted in red and blue (FDR < 0.0001). (C) Representative signal track view highlighting two genes, diacylglycerol O-acyltransferase 1 (Dgat1) and aquaporin 8 (Aqp8), that exhibit differential open chromatin and transcript abundance in the ileum or colon. (D) Two-sided Kolmogorov-Smirnov goodness-of-fit test shows a positive relationship between the presence of a nearby tissuespecific DHS (within 2 kb of and including the gene body) and increased transcript abundance in that tissue. The y-axis shows the cumulative fraction of genes linked to a nearby tissue-specific DHS. Deviation from the null expectation that linked genes display a normal distribution centered on a fold change of 1 (black line) suggests that segment-specific DHSs are enriched near genes of higher expression in that tissue. See also Supplemental Figures S5 and S6.

of 2175; 87.2%) that are differentially expressed between the ileal and colonic IECs have a segment-specific DHS within their gene regulatory domain (see Methods; Figs. 3D, 5D). Additionally, we find that increased DNase hypersensitivity at the proximal promoter is best associated with increased gene expression (Supplemental Fig. S6A). However, the greatest number of differential DHSs associated with differential gene expression are within the gene body, and we speculate that many of these tissue-restricted DHSs are facilitating enhancer activity to promote nearby gene expression (Supplemental Fig. S6B). Collectively, these results integrate genome-wide RNA-seq and DNase-seq data to identify putative CRRs controlling segment-specific patterns of gene transcription in IECs underlying proximal-distal functional specialization along the intestinal tract.

#### Microbiota modulate gene expression without remodeling the intestinal epithelial accessible chromatin landscape

Our comparative analysis of accessible chromatin across intestinal segments suggested that DNase-seq could be used to identify CRRs that mediate intestinal epithelial responses to microbiota. To test the hypothesis that commensal microbiota modify IEC transcription through modification of the accessible chromatin landscape, we generated DNase-seq data sets from IECs isolated from the ileum and colon of GF mice and compared them to CR animals that had been exposed to microbiota from birth (Fig. 1A). Surprisingly, we discovered that the accessible chromatin landscape in IECs of GF and CR mice is nearly identical for both the ileum and colon (Fig. 4). Hierarchical clustering did not identify a significant subpopulation of DHS specific to GF or CR conditions in either the colon or the ileum (Fig. 4A). In accord, DNase signal intensities within GF and CR accessible chromatin in the ileum and colon were highly correlated with Spearman's rho of 0.938 and 0.919, respectively (Fig. 4B). This is in contrast to the correlation observed between CR ileum and CR colon (0.634), CR duodenum and CR colon (0.647), and CR duodenum and CR ileum (0.777) (Fig. 4B; Supplemental Fig. S7). We scanned the genome for differential DNase cleavage in GF and CR ileal or colonic IECs across 250-bp windows. Using the same FDR threshold (<0.0001) from our analysis that discovered thousands of differential DNase hypersensitive sites between intestinal segments in CR mice (Fig. 3B; Supplemental Fig. S7B), we found only one DHS that was significantly different between GF and CR conditions in either the ileum or colon (Fig. 4C). Loosening the FDR threshold 500-fold to FDR < 0.05, we identified only nine 250-bp windows (Supplemental Table S7) with significantly different DNase hypersensitivity between GF ileum and CR ileum and identified none in the colon (Supplemental Fig. S8). The nine DHSs reaching modest significance in the ileum were not near any gene known to be regulated by microbiota (Supplemental Table S7; Rawls et al. 2006; Donohoe et al. 2011; El Aidy et al. 2012; Larsson et al. 2012; Pott et al. 2012). Therefore, the differential transcript levels observed for many genes in GF and CR IECs (Fig. 1E; Supplemental Table S3) were not linked to any significant alteration in local chromatin accessibility. For example, angiopoietin-like 4 (Angptl4), known to be suppressed by microbiota in ileal IECs (Bäckhed et al. 2004; Camp et al. 2012), was corroborated by our RNA-seq analysis. However, the accessible chromatin landscape at this locus is identical in both the GF and CR ileum (Fig. 4D). A similar relationship was observed for other genes with known gene expression responses to microbiota, including fibroblast growth factor 15 (Fgf15) (Sayin et al. 2013), cytochrome P450, family 4, subfamily b, polypeptide 1 (Cyp4b1) (Larsson et al. 2012), and angiogenin, ribonuclease A family, member 4 (Ang4) (Hooper et al. 2003). These results revealed that mice, reared lifelong in the presence or absence of microbiota, have nearly identical IEC accessible chromatin landscapes.

Colonization of GF mice with microbiota is known to evoke dynamic temporal alterations in gene expression (El Aidy et al. 2012, 2013), raising the possibility that transcriptional responses to acute and lifelong colonization may utilize distinct regulatory



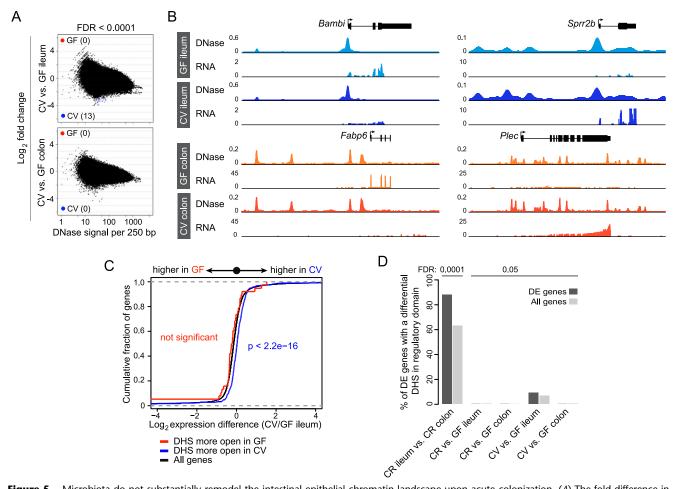
**Figure 4.** Life in the presence or absence of microbiota does not affect the intestinal epithelial accessible chromatin landscape. (*A*) Hierarchical clustering of differential DHSs across all replicates of conventionally raised (CR) versus germ-free (GF) ileal and colonic IECs. Note the similarity between GF and CR conditions for each tissue. (*B*) Density scatter plot showing the correlation of DNase-seq signal intensity for the top 100,000 DHSs for CR colon and CR ileum (*top*), GF ileum and CR ileum (*bottom left*), and GF colon and CR colon (*bottom right*). (*C*) The fold difference in DNase signal intensity plotted against the average DNase signal observed in 250-bp windows. Significantly differential DNase hypersensitive sites (see Fig. 3B). Comparing tissues in the presence or absence of microbiota reveals undetectable change in the open chromatin landscape in response to microbiota. (*D*) Representative signal track highlighting multiple genes in the ileum or colon that show differences in transcript abundance in the presence of microbiota but no change in the open chromatin landscape. (*Ang4*) angiogenin, ribonuclease A family, member 4. See also Supplemental Tables S3 and S7.

mechanisms. We therefore tested whether acute colonization with microbiota would alter IEC accessible chromatin by generating DNase-seq data sets from IECs isolated from the ileum and colon of mice raised GF for 8 wk, then conventionalized (CV) for 2 wk with microbiota. Again, despite a robust effect on the gene expression landscape (Fig. 1C-F), conventionalization with microbiota had minimal impact on the accessible chromatin landscape in either the ileum or colon (Fig. 5A,B). Loosening the FDR threshold (FDR < 0.05), we were able to identify regions of differential accessible chromatin in the ileum that are near microbiota-regulated genes (Supplemental Fig. S8A,B; Supplemental Table S8). DHSs more open in CV had a weak but significant correlation with differential gene expression in the ileum (Fig. 5C); however, the vast majority (91%) of microbiota-regulated genes in CV versus GF ileum did not have a differential DHS nearby (Fig. 5D). Visual inspection of many of the putatively differential DHSs revealed qualitatively minimal alterations in accessible chromatin (Supplemental Fig. S8C,D). Notably, there was no significant functional enrichment of genes

linked to nearby DHSs putatively differential in GF versus CV ileum (GREAT v2.0.2 default thresholds) (data not shown). In addition, we failed to identify any differential DHSs near microbiotaregulated genes in the colon (Fig. 5D). Indeed, we failed to observe any regions of substantial accessible chromatin differences in the presence or absence of microbiota in either the ileum or colon. This result was fundamentally different from results obtained in our between-tissue comparisons (Figs. 2E, 3B,C; Supplemental Figs. S4D–G, S7). Cumulatively, these data revealed that commensal microbiota modify the transcriptional landscape in the intestinal epithelium without remodeling the host's accessible chromatin landscape.

## Microbiota-regulated transcription factors have binding sites enriched in accessible chromatin near microbiota-responsive genes

Our results indicate that microbiota-induced modifications to the transcriptional landscape in the intestinal epithelium are achieved

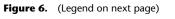


**Figure 5.** Microbiota do not substantially remodel the intestinal epithelial chromatin landscape upon acute colonization. (*A*) The fold difference in DNase signal intensity from conventionalized (CV) versus germ-free (GF) ileal or colonic IECs plotted against the average DNase signal observed in 250-bp windows. Significantly differential windows are highlighted in red and blue (FDR < 0.0001). (*B*) Representative signal track highlighting multiple genes in the ileum or colon that show differences in transcript abundance upon colonization with microbiota but no detectable change in the open chromatin landscape. (*Bambi*) BMP and activin membrane-bound inhibitor; (*Sprr2b*) small proline-rich protein 2B; (*Fabp6*) fatty acid binding protein 6; (*Plec*) plectin. See also Supplemental Tables S3 and S7. (C) Two-sided Kolmogorov-Smirnov goodness-of-fit test shows a weak relationship between the presence of a nearby tissue-specific DHS (within 2 kb of the gene body) and increased transcript abundance in the GF versus CV ileum comparison at FDR < 0.05. The *y*-axis shows the cumulative fraction of genes linked to a nearby tissue-specific DHS. Deviation from the null expectation that linked genes display a normal distribution centered on a fold change of 1 (black line) suggests that CV-specific DHSs are enriched near genes of higher expression in CV ileal IECs. (*D*) Percent of differentially expressed genes that have a differential DNase hypersensitive site within their regulatory domain at two cutoffs (FDR < 0.0001 and FDR < 0.05). See also Supplemental Figure S7 and Supplemental Table S8.

by a mechanism other than overt chromatin remodeling. We therefore tested the hypothesis that differential TF binding to sites within a tissue-restrictive accessible chromatin landscape could explain the observed differences in gene expression. First, we tested whether this hypothesis could explain the distinct transcriptional responses to acute (CV) and chronic (CR) microbiota exposure (Fig. 1; Supplemental Fig. S9A,C; Supplemental Table S3). Indeed, we found that many TFs that exhibit differential expression between CV and CR states (Supplemental Fig. S9C,D) have binding sites enriched within accessible chromatin near genes differentially expressed between CV and CR states (Supplemental Fig. S9E,F; Supplemental Tables S9, S10). For example, nuclear factor of activated T cells 5 (NFAT5) has previously been shown to regulate IEC differentiation (Wang et al. 2011, 2013), suggesting that a component of the initial response to microbes may be mediated through IEC turnover. Moreover, both JUN (also known as AP-1 in humans) (Hasselblatt et al. 2008) and early growth response 1 (EGR1) (Moon et al. 2007) have been implicated in the response to injury in the intestine and might mediate the initial response to microbiota during conventionalization (Mukherji et al. 2013).

When comparing our data with other published results, we did not find a robust set of genes that consistently discriminate CR and CV states (Supplemental Figs. S9, S10; Rawls et al. 2006; Donohoe et al. 2011; El Aidy et al. 2012; Larsson et al. 2012; Pott et al. 2012; data not shown). Differences related to experimental design (e.g., whole tissue vs. IEC), expression detection method (e.g., RNA-seq vs. microarray), mouse strain, microbial community composition, time post-colonization, diet, and tissue heterogeneity may explain differences between various CR and CV data sets. However, despite these differences, we were able to identify core sets of genes that were consistently regulated by the presence of microbiota in the ileum or colon (up- or down-regulated in both CR and CV compared with GF) (Supplemental Fig. S10; Supplemental Table S11). We combined these sets with our accessible

А		ileum: Identification of a core micro	biota resp	oonse	В	ileum: TF expressio	n	C ileum: TFI	3S prediction	
	i	i This study CR/GF			• Kif15	ii iii iv v vi		Beta-beta-alpha zinc finger	GLI3	
	ii				• K#15 Egr1 Zfp623 Zfp764 Tshz1 Zfp787 Zfp358 Zfp354a Zkscan14 Zkscan14			Helix-turn-helix	PBC3 PAX5 SOX2-TCF	
	iii		t al. 2012		Zfp787 Zfp358 Zfp354a		Beta-beta-alpha zinc finger		HNF1 PAX7 • CEBP	
	iv Rawls <i>et al.</i> 2006 CV/GF v Larsson <i>et al.</i> 2012 CR/GF vi El Aidy <i>et al.</i> 2012 CV/GF			Zkscan14 Sp5 Osr2			Leucine zipper	MAFF BACH2 PPARE		
				Zfp467 Tcf23 Srebf1		Holix bon holix	Nuc <b>l</b> ear receptor			
		-1	2		Arnt2 Mixipi Hes6		Helix-loop-helix	receptor	NUR77 HNF4a OCT4:SOX17	
		down-regulated up-regulated 941 genes 455 genes	-score		Pbx1 Zhx3 Satb2		Helix-turn-helix	other	MEF2c NF1 NRF1	
		ileum down (lower in presence of microbiota)			Pax8     Pou2f3     Fos				TCFL2 E-BOX MEF2a	
		GOTERM BP FAT	genes	piota) p-value	Dbp Hlf Tef		Leucine zipper		FOXH1 E2F FOXA2	
		Oxidation reduction	107	2.60E-27 2.40E-13	Tsc22d1 Creb3l3 Maf Nr1d2 Pparg			Winged-helix- turn-helix	FOXA1 FOXP1 RFX2	
		Fatty acid metabolic process Lipid biosynthetic process	38 40	9.40E-09	<ul> <li>Nr1d2</li> <li>Pparg</li> <li>Ppara</li> <li>Nr1i3</li> </ul>				X-BOX RFX1 RFX	
	₽	Coenzyme metabolic process Cofactor metabolic process	25 28	1.60E-07 3.60E-07	<ul> <li>Nr1i3</li> <li>Nr1d1</li> <li>Ppargc1a</li> <li>Nr3c2</li> </ul>		Nuclear receptor		EFL-1 NF1:FOXA1 GATA:SCL	
	DAVID	KEGG Pathway			Nr0b2		receptor	Zinc coordinating	GATA:DR4 GATA:DR4 GATA:DR8	
		Drug metabolism Metabolism of xenobiotics by P450	30 23	3.6E-17 9.6E-12	Nr2e3 Thrb Tcfcp2l1			Beta-beta-alpha zinc finger	CTCF YY1 BORIS Egr2 KLF4	
		Glutathione metabolism Retinol metabolism	18 18	3.3E-09 2.8E-07	Mier3		other	Bhr		
		PPAR signaling pathway	19	5.6E-07	Foxn3     Irf2     Rfx2		Winged-helix- turn-helix	Lieliu Jaan kaliu	MAX MYC CLOCK CBF1 AARE PHO2	
	ΡA	Molecular and Cellular Function			Foxq1     Pcgf2     Lmo4		Polycomb group	Helix-loop-helix	ARRE PHO2 ARNT:AHR	
		Energy production Lipid metabolism	63 207	6.18E-22 6.18E-22	Zfp655 Zmiz1		Other zinc coordinating	Helix-turn-helix	PAX7 GE:11 MYC PAX5	
		Small molecule biochemistry	319	6.18E-22	Nab2 Bnip3		i		PAX5 PAX7 NFkB:REL •	
		Molecular transport Vitamin and mineral metabolism	255 81	3.17E-19 7.51E-18	Lmo4 Dmrt3 Ztp655 Zmi21 Thap7 Nab2 Bnip3 Mpnd Cdr2 Trib3 Aff1		Transcriptonal		STAT1 NFkB:TP50 STAT3a STAT5 NFAT:AP1	
		ileum up (higher in presence o	f microhi	ota)			co-regulators	Ig fold		
		GOTERM BP FAT	genes	p-value	Pcbd1 Tsg101 Maml3 Hdac5 Grlf1			Leucine zipper	STAT3D NFKB:p65 STAT4 NF:E2	
		Immune response Positive regulation of immune system	73 40	5E-38 3.7E-24	Skil Sp100 Ikzf2		Alpha helix	Nuclear receptor	REVERB VDR	
	₽	Defense response	53	1.1E-21	Prdm1		Beta-beta-alpha zinc finger	p53	TP63 T1ISRE	
		Cell activation Leukocyte activation	40 37	3E-21 3.2E-20	kzf1 kzf3 Tbx21		BHR		ISRE IRF2 IRF1 ETS:RUNX	
	DAVID	KEGG Pathway			Barx2 Arid3a • Stat1 • Stat4		Helix-turn-helix		E2F1	
	_	Natural killer cell mediated cytotoxicity Graft-versus-host disease	27 16	7.8E-14 1E-09	Stat2     Nfatc2		lg fold	Winged-helix- turn-helix	E2F7 ETS •	
		Antigen processing and presentation	19	2.4E-09	Runx3     Runx1     Nfil3				HRE PU-1 E2F7 ELF5 ELF1 ETS1-distal E2F4 E2F4 E2F4	
		Cell adhesion molecules (CAMs) Hematopoietic cell lineage	24 18	4.3E-09 4.7E-09	Atf3 Batf2 • Ets1		Leucine zipper		E:L1 E2F4 ELK4	
		Molecular and Cellular Function	100		● Irf1 ● Irf8 Spib		Winged-helix- turn-helix	Zinc coordinating	ZBTB33 ZNF143	
	ΡA	Cellular development Cellular growth and proliferation	199 222	4.04E-77 4.04E-77	Gata4 Eaf2 Dtx1		Zinc coordinating Transcription	other	CTCF PH04	
	_	Cellular function and maintenance Cell-to-cell signaling and interaction	177 181	3.06E-66 2.68E-62	Ripk3 Ifi203		co-regulator		EBNA1 TCFCP2I1 GRHL2	
					lower expression	1 higher 1 expressio	in	enriched near down genes -1	1 up genes	
2=score or total expression 2=core of fold=enrichment ratio (down vs. up) (down vs. up)										
D E ileum: IPA upstream regulator ileum: ChIP-seq overlap										
-70 • Enriched in DHS near up-regulated genes					Ī			Enriched in DHS near up	-regulated genes	
Enriched in DHS near down-regulated genes				, ⊑ 15-			Enriched in DHS near down-regulated genes			
nent	one -60				Fold enrichment of the overlap count (Up in colonized fleum)					
richr	2 0 -50				m) da					
r en	og,	FIL2 poly fl:rC-RNA	ove ileu		STAT5b	. / .				
tu autoria and a static and a s					nrichment of the overla (Up in colonized ileum) ∮	S BRF	STAT3 POU2F2	FXR	CDX2 GR1	
ı reg		LIPS (E. Coli) IL1B			olon	STAT5a	IRF4	SREBE2		
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ıpstr				-₅ (C p		CEBPA CRXNACC1	SREBF1			
۲A L	<u>с</u>	8.0	•		ld ei	IALT	CLOCK			
_	رے 10-	NFATCZ NR113 (CAR)			Ъ	FOXA1	A2			
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				1	0	5	10	15		
IPA upstream regulator enrichment								of the overlap count	10	
		(Down in colonized ileum, I				(Down in colonized ileum)				
				Fiaure	6. (Legend o	n next page)				



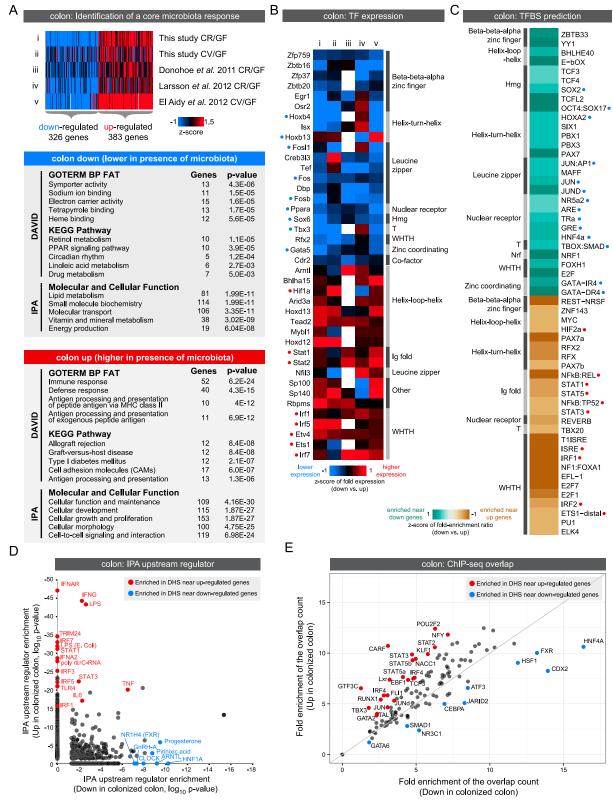
chromatin data to identify TFs that might mediate a consistent response to microbiota in either the ileum (Fig. 6) or colon (Fig. 7). We found that genes consistently up-regulated in the ileum and colon are significantly enriched for immune and inflammatory response GO categories, whereas genes down-regulated in the ileum and colon are enriched for diverse metabolic processes (Figs. 6A, 7A). We queried these groups of up- or down-regulated genes to identify TFs that are consistently regulated by microbiota across multiple studies (Figs. 6B, 7B). Next, we searched for TF binding sites (TFBSs) in DHSs within the regulatory domains of up- or down-regulated genes in either the ileum or colon (Figs. 6C, 7C; Supplemental Tables S12, S13). Strikingly, we found TFBS enrichment of many of the TFs that are themselves differentially regulated by microbiota (Figs. 6B,C, 7B,C). For example, DHSs near genes up-regulated in the ileum are enriched for motifs matching Interferon regulatory factors (IRFs), signal transducer and activator of transcription (STATs), and E-twenty-six (ETS) family members. Consistent with these observations, the TFs Stat4, Stat1, Stat2, Irf1, Irf8, and Ets1 are all up-regulated in the colonized ileum. In contrast, TFBSs for many nuclear receptors are enriched in accessible chromatin near genes down-regulated in colonized versus GF ileum. In accord, we find that nuclear receptors Pparg, Ppara, Thra, Thrb, Nr1h3, Nr1i3, Nr1d1, Nr1d2, Nr2e3, Nr3c2, and coactivator *Ppargc1a* all display decreased expression in the colonized ileum. Similar relationships between enriched TFs and their TFBSs were observed in the colon data (Fig. 7B,C). Finally, several of these TF expression-TFBSs enrichment correlations were validated using Ingenuity Pathway Analysis (IPA) upstream regulator prediction (Figs. 6D, 7D) and ChIP-seq data (Figs. 6E, 7E). Though most of the ChIP-seq experiments were performed in nonintestinal tissues (Supplemental Table S14), this in vivo binding data provides strong support for these predicted TFs to regulate microbiota response through DHSs identified in our study. Collectively, this analysis integrates accessible chromatin and transcriptome data to suggest specific transcription factors and target cis-regulatory regions that likely mediate the impact of microbiota on IEC transcription and physiologic function.

# Discussion

The ability of the intestinal epithelium to serve as an effective interface between animals and their microbial environment is achieved through orchestration of tissue-specific and microbiotainduced gene expression programs. This orchestration is fundamental to intestinal physiology and host-microbe commensalism, and the underlying mechanisms represent attractive therapeutic targets for promoting health. In order to understand how IECs interpret microbial inputs to regulate gene expression in a tissuespecific context, we generated a total of 20 DNase-seq and 18 RNAseq data sets from primary IECs isolated from multiple intestinal segments from CR, CV, and GF mice. We developed a modified DNase hypersensitivity assay allowing for the identification of segment-specific CRRs covering a range of abundant and rare IEC types whose loci were distinguished by accessible chromatin distinct from other tissues. These atlases of the IEC accessible chromatin and gene expression landscapes should be a valuable resource for researchers interested in (1) discovering molecular mechanisms controlling cell type-specific and microbiota-regulated gene transcription in different segments of the intestine, (2) discovering differential splicing and novel transcripts regulated by microbiota in the intestine, and (3) generating cell type- or tissuespecific transgenic constructs.

Previous studies in gnotobiotic mice have established that the commensal microbiota modify host physiology through impacting gene expression in the intestinal epithelium along the length of the intestinal tract (Bäckhed et al. 2004; Hooper 2004; Rawls et al. 2006; Donohoe et al. 2011; Vaishnava et al. 2011; El Aidy et al. 2012, 2013; Pott and Hornef 2012; Alenghat et al. 2013; Sayin et al. 2013). Here we observed that microbiota, although potent manipulators of host transcription, have essentially no impact on the accessible chromatin landscape in the ileal and colonic intestinal epithelia of healthy mice (see Supplemental Material). These results suggest a model in which chromatin accessibility is organized during intestinal development in a region-specific manner and maintained similarly in the presence or absence of microbiota (Supplemental Fig. S11). In accord, adult rodents reared in the absence of microbiota develop crypt-villus units and do not display major alterations in the frequency of IEC types (Kandori et al. 1996; Falk et al. 1998). Our results imply that intestinal epithelial cells utilize a strategy other than large-scale chromatin remodeling to respond to the complex activities of the microbiota. This also suggests that the distinct accessible chromatin landscapes of differentiated cells are restricted in their range of response to environmental variables. This supports recently published data showing that TFs utilize pre-existing chromatin landscapes to respond to extracellular cues following terminal differentiation programs (John et al. 2011; Samstein et al. 2012). Interestingly, the accessible and histone-modified chromatin landscape in intestinal stem cells was recently found to be very similar to their differentiated epithelial cell lineages in CR mice (Kim et al. 2014). Together, these findings suggest that a significant component of intestinal epithelial specification is the establishment of a chromatin envi-

Figure 6. Integrating gene expression and open chromatin data identifies candidate transcription factors regulating response to microbiota colonization in the ileum. (A) Integration of our data set with published studies comparing ileum gene expression in the presence and absence of microbiota reveals a set of genes consistently up- or down-regulated by microbiota across at least four studies. Significant functional enrichments are shown for each gene set (see Supplemental Fig. S9; Supplemental Table S11). (B) Heat map of known transcription factors (TFs; including DNA binding transcription factors and transcription cofactors) that consistently display differential RNA expression levels in response to microbiota across multiple experimental studies in the ileum. Relative expression levels are indicated, where white represents no data. TFs are annotated with their predicted DNA binding domain family. Highlighted with blue or red circles are TFs with motif (C) or binding support (E). (C) Transcription factor binding site (TFBS) prediction in DHSs within the regulatory domain of genes consistently differentially regulated by microbiota in the ileum (see Supplemental Tables S12, S13). Fold enrichments were calculated relative to a GC matched background (Guturu et al. 2013). Motifs are colored based on fold enrichment ratios between down and up gene sets. (Teal) Enriched in DHSs near down genes; (brown) enriched in DHSs near up genes. Highlighted with blue or red circles are motifs matching TFs with differential expression (B) or binding support (E). (D) Scatter plot showing P-values for IPA upstream regulator analysis for the ileum up and ileum down gene lists identifies TFs and other factors that have previously been shown to influence expression of genes within these lists. (E) Plot showing the overlap of ChIP-seq peaks from multiple TFs (measured in various tissues) (see Supplemental Table S14) with DHSs within the regulatory domain of genes either consistently up-regulated (y-axis) or down-regulated (x-axis) by microbiota in the ileum. Fold enrichments were calculated relative to a uniformly distributed null model. Highlighted are the TFs where the up/down fold ratio is at least one standard deviation away from the mean of all fold ratios.





ronment competent to maintain appropriate tissue-specific physiological function while also allowing appropriate tissue-specific responses to microbiota.

Based on our results, we predict that differential occupancy or activity of specific TFs within tissue-specific accessible chromatin may underlie much of the differential transcript abundance observed in GF versus CR or CV conditions (Supplemental Fig. S11). Some TF families implicated here, such as STAT and IRF, are known to integrate inflammatory stimuli to promote expression of immune response genes in the intestinal epithelium and mediate crosstalk with underlying mucosal immune cells (Jiang et al. 2009; Shulzhenko et al. 2011). Our results also identify TFs not previously implicated in microbiota responses. Strikingly, TFBSs for nuclear receptor TFs were enriched near down-regulated genes in both ileum and colon, with many nuclear receptor transcripts also being down-regulated by microbiota in these tissues. This association of nuclear receptors with microbiota-dependent reduction of host gene expression suggests an important role for this family of ligand-binding TFs (Markov and Laudet 2011). Furthermore, comparisons of GF animals to those raised under CV or CR conditions suggest specific TFs that might mediate acute or chronic responses to microbiota, respectively. Future studies will be needed to define the particular TF binding events that regulate gene expression though identified CRRs and to elucidate the upstream host-microbe signal transduction networks converging on these TFs and CRRs.

In this study, we focused on healthy mice reared GF or colonized with specific pathogen-free microbiota. Our results provide a framework for future exploration into how disease states, host genotype, microbiota composition, and other environmental challenges such as infection by pathogenic microbes, diet alterations, or drug exposures may impact the chromatin landscape in the intestinal epithelia. For example, human SNPs associated with inflammatory bowel diseases are enriched in putative cis-regulatory regions (Mokry et al. 2014), demanding improved understanding of how variation in the regulatory genome contributes to this and other human diseases. It will also be important to determine whether the hyporesponsiveness of the accessible chromatin landscape observed in IECs is shared by other cell populations, such as leukocytes, which may exhibit chromatin-based adaptations to particular microbial stimuli (Ganal et al. 2012). This work marks a significant step toward integrating transcriptional regulatory genomics with microbiota research to identify the mechanisms that underlie host-microbe commensalism in the intestine. Future investigations in appropriate gnotobiotic animal models will be required to interrogate the underlying regulatory logic that governs tissue-specific host transcriptional responses to intestinal microbiota.

# Methods

#### Mouse husbandry

All mice used in this study were in the C57BL/6 strain originally sourced from Jackson Laboratories and maintained in the National Gnotobiotic Rodent Resource Center (NGRRC) at the University of North Carolina (UNC) at Chapel Hill. Mice were reared under specific pathogen-free (conventionally raised or CR) conditions, germ-free (GF) conditions, or reared GF and colonized with a conventional microbiota from SPF mice for 14 d (conventionalized or CV). Production, colonization, maintenance, feeding, and sterility testing of GF mice were performed using the standard procedures of the NGRRC. Animals were housed on Alpha-dri bedding (Shepherd) and fed 3500 Autoclavable Breeder Chow (Prolab) or Picolab mouse diet 5058 (LabDiet) ad libitum. All experiments using mice were performed according to established protocols approved by the Institutional Animal Care and Use Committee at UNC at Chapel Hill. For additional information, see Supplemental Table S1.

## DNase hypersensitivity on IECs

IECs were isolated from the duodenum (anterior 5 cm of midgut), ileum (posterior 6 cm of midgut), and colon (6 cm of terminal hindgut) of 8- to 12-wk-old mice as described (Gracz et al. 2012). DNase hypersensitivity assays were performed as described (Song and Crawford 2010) with the following modifications using endogenous DNase activity to digest chromatin. Cells were gently lysed by adding 10 mL 0.1% Igepal in resuspension buffer (RSB; 10 mM Tris-Cl at pH 7.4, 10 mM NaCl, 3 mM MgCl<sub>2</sub>) containing  $1 \times$ Complete Protease Inhibitors. Isolated nuclei were incubated for 30 sec, 1 min, 2 min, 4 min, or 8 min at 37°C; and endogenous DNase activity was stopped by addition of 0.33 mL cold 50 mM EDTA, and stored on ice. Stabilization of nuclei in agarose plugs, determination of appropriate DNase digestion patterns, library preparation, and sequencing were performed as described (Song and Crawford 2010). See Supplemental Material for additional information.

#### RNA preparation and sequencing

Total RNA was isolated using TRIzol Reagent (Invitrogen) and further purified using the Qiagen RNeasy (Qiagen) kit according to the manufacturer's protocol. Two micrograms of total RNA were used for standard TruSeq library preparation with polyA selection

**Figure 7.** Integrating gene expression and open chromatin data identifies candidate transcription factors regulating response to microbiota colonization in the colon. (*A*) Integration of our data set with published studies comparing colon gene expression in the presence and absence of microbiota reveals a set of genes consistently up- or down-regulated by microbiota across at least four studies. Significant functional enrichments are shown for each gene set (see Supplemental Fig. S?; Supplemental Table S11). (*B*) Heat map of known transcription factors (TFs; including DNA-binding transcription factors and transcription cofactors) that consistently display differential RNA expression levels in response to microbiota across multiple experimental studies in the colon. Relative expression levels are indicated, where white represents no data. TFs are annotated with their predicted DNA binding domain family. Highlighted with blue or red circles are TFs with motif (C) or binding support (*E*). (C) Transcription factor binding site (TFBS) prediction in DHSs within the regulatory domain of genes consistently differentially regulated by microbiota in the colon (see Supplemental Tables S12, S13). Fold enrichments were calculated relative to a GC matched background. Motifs are colored based on fold enrichment ratios between down and up gene sets. (Teal) Enriched in DHSs near down genes; (brown) enriched in DHSs near up genes. Highlighted with blue or red circles are motifs matching TFs with differential expression (*B*) or binding support (*E*). (*D*) Scatter plot showing *P*-values for IPA upstream regulator analysis for the colon up and colon down gene lists identifies TFs and other factors that have previously been shown to influence expression of genes within these lists. (*E*) Plot showing the overlap of ChIP-seq peaks from multiple TFs (measured in various tissues) (see Supplemental Table S14) with DHSs within the regulatory domain of genes either consistently up-regulated (*y*-axis) or down-regulated (*x*-axis) b

(performed by the UNC High Throughput Sequencing Core) for mRNA Illumina sequencing using 2  $\times$  50-bp paired-end reads.

#### Bioinformatic analysis of RNA-seq data sets

RNA-seq reads were aligned to the mouse genome (NCBI37/mm9) using TopHat v2.0.8b (Trapnell et al. 2012; Kim et al. 2013), allowing for up to two mismatches with UCSC gene transcriptomeguided mapping but permitting nonreference mapping. Normalized fragments per kilobase of transcript per million mapped reads (FPKM) expression values were obtained for reference and novel transcripts via Cufflinks, and pairwise differential gene expression tests were carried out with Cuffdiff v2.0.2 (Trapnell et al. 2012). The default significance threshold of FDR < 5% was used for each comparison. Principle components analysis for RNA-seq was performed with R package cummeRbund v2.0.0. Hierarchical clusterings of RNA-seq data (Fig. 1F; Supplemental Fig. S2A) were performed using heatmap.2 from the gplots package (http://CRAN.R-project.org/ package=gplots). A two-sided Kolmogorov-Smirnov test was used to assess the global association of differential DHS and nearby gene expression differences between ileum and colon and in the presence or absence of microbiota. GO enrichments were performed using DAVID v6.7 (Huang et al. 2009a,b). For additional information, see the Supplemental Material.

#### Bioinformatic analysis of DNase-seq data sets

The top 100,000 DHS peaks in each DNase-seq biological replicate were merged and windowed to 250 bp (with 50bp overlaps) to establish a liberal search space for differential DNase hypersensitivity (signal). Raw base-pair resolution DH signal was summed for each sample in each window as input for the R package DESeq v1.8.3 (Anders and Huber 2010). Sequencing depth normalization, variance fitting, and pairwise differential analyses were performed via DESeq v1.8.3. Overlapping windows with significantly differential DHS signal at the desired FDR threshold (<0.01% for tissue comparisons and <5% for GF vs. CR comparisons) were subsequently merged to reconstitute differential DHS peaks for enumeration. Feature counts were obtained by an in-house script to annotate DHSs with mm9 UCSC gene elements. In all analyses, 2 kb upstream of reference or RNA-seq-derived TSS were considered proximal promoter regions. In the relatively rare cases where a DHS fell within 2 kb of a TSS at two different genes, we selected the gene with the nearest TSS to the midpoint of the DHS. Conservation of DHSs was assessed using the Cistrome conservation plots tool by computing the base-wise phastCons score in the 1000 bp surrounding the DHS peak center. Functional enrichments for sets of DHSs were computed using default parameters with GREAT v2.0.2 (McLean et al. 2010). Refer to http://bejerano.stanford.edu/great for a description of statistical outputs for each set of functional enrichments. For additional information, see the Supplemental Material.

#### Data access

DNase-seq and RNA-seq data sets have been submitted to the NCBI Gene Expression Omnibus (GEO; http://www.ncbi.nlm.nih.gov/geo/) under accession number GSE57919 and as a trackHub viewable at the UCSC Genome Browser (see http://rawlslab.duhs. duke.edu/data).

#### Acknowledgments

The authors are grateful to Chris Packey and Maureen Bower for assistance with gnotobiotic mice, Lingyun Song, Yoichiro Shibata, Alexias Safi, and Jeremy Simon for technical assistance with accessible chromatin data set generation and analysis, and Adam Gracz for help with IEC isolation. This work was supported by grants from the National Institutes of Health (P30-DK034987, P40-OD010995, R01-DK081426, R01-HD059862, P01-DK094779), the National Science Foundation (DGE-1147470), the PhRMA Foundation, and the Pew Scholars in the Biomedical Sciences Program.

*Author contributions:* The study was designed by J.G.C., J.F.R., C.L.F., and G.E.C. Experiments were performed by J.G.C. and C.L.F. DNase and RNA-seq analyses were conducted by C.L.F. and J.G.C., and integration of transcriptome data sets was performed by C.R.L. Motif prediction was performed by C.R.L., J.G.C., C.L.F., and H.G. Overlap enrichment analysis was conducted by T.R., H.G., and G.B. ChIP data sets were curated by A.M.W., J.C., and G.B. The manuscript was written by J.G.C., C.L.F., J.F.R., G.E.C., and C.R.L. with input from all authors.

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Received August 29, 2013; accepted in revised form June 6, 2014.