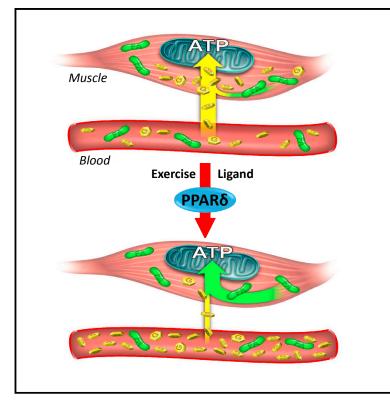
Cell Metabolism

PPAR^b Promotes Running Endurance by Preserving Glucose

Graphical Abstract



Highlights

- Exhaustion of systemic glucose limits endurance exercise
- PPARδ regulates substrate utilization without mitochondrial biogenesis
- PPARδ represses glycolytic genes in muscle to slow glucose consumption
- Glucose sparing by PPARδ dramatically extends running time

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In Brief

Carbohydrate depletion in endurance sports leads to the "hitting the wall" phenomenon, which is mitigated through sports training. Fan et al. show that muscle PPAR_b actively suppresses glucose catabolism. Glucose sparing by PPAR_b delays the onset of hypoglycemia and extends running time by \sim 100 min in agonist-treated mice.







PPAR_b Promotes Running Endurance by Preserving Glucose

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SUMMARY

Management of energy stores is critical during endurance exercise; a shift in substrate utilization from glucose toward fat is a hallmark of trained muscle. Here we show that this key metabolic adaptation is both dependent on muscle PPAR₀ and stimulated by PPAR_δ ligand. Furthermore, we find that muscle PPAR^b expression positively correlates with endurance performance in BXD mouse reference populations. In addition to stimulating fatty acid metabolism in sedentary mice, PPAR_b activation potently suppresses glucose catabolism and does so without affecting either muscle fiber type or mitochondrial content. By preserving systemic glucose levels, PPAR δ acts to delay the onset of hypoglycemia and extends running time by \sim 100 min in treated mice. Collectively, these results identify a bifurcated PPAR_b program that underlies glucose sparing and highlight the potential of PPARô-targeted exercise mimetics in the treatment of metabolic disease, dystrophies, and, unavoidably, the enhancement of athletic performance.

INTRODUCTION

In endurance sports such as marathon running and cycling, carbohydrate depletion, commonly known as "hitting the wall," is a significant determinant of performance. Exercise training enhances endurance, in part, by delaying the depletion of carbohydrate stores (mainly glycogen in liver and muscle). The adaptive benefits of exercise training are commonly attributed to the glycolytic-to-oxidative fiber-type transformation and increased mitochondrial energetic capacity (Holloszy and Booth, 1976), programs in which the AMPK-PGC1a signaling pathway is now known to play a major role. At the same time, exercise also enhances muscle fatty acid (FA) oxidation (Molé et al., 1971), theoretically providing extra energy substrates for extended performance and reducing the dependence on glucose. This

readily observed glucose sparing leads to the assumption that increased FA oxidation extends performance. However, the contribution of altered fat and glucose metabolism to endurance and the molecular mechanism underlying this metabolic shift are simply not known.

To address the above questions, we focused on the peroxisome proliferator-activated receptor delta (PPAR_δ), a nuclear receptor that serves as a key regulator of FA metabolism in muscle (Fan and Evans, 2015; Luguet et al., 2003; Wang et al., 2004). Muscle-specific overexpression of PPAR_b not only induces an oxidative fiber-type transformation but also increases FA oxidation in skeletal muscle through the induction of two mitochondrial gatekeeper proteins, carnitine palmitoyl-transferase 1b (Cpt1b), the rate-limiting enzyme in the transport of FAs into the mitochondria (Bruce et al., 2009; Kleiner et al., 2009), and pyruvate dehydrogenase kinase isozyme 4 (Pdk4), which negatively regulates the influx of glucose-derived pyruvate into the mitochondrial tricarboxylic acid (TCA) cycle (Luquet et al., 2003; Wang et al., 2004). Consequently, PPARô transgenic mice run twice as long as the controls and represent a permanent strain of "marathon mice" (Wang et al., 2004). Conversely, muscle-specific PPAR₀ knockout (PDmKO) mice show defects in fiber-type determination and mitochondrial biogenesis (Schuler et al., 2006).

In contrast to transgenesis, small molecule ligands that specifically activate PPARδ, including GW501516 (GW), have revealed multiple beneficial metabolic effects, including (1) increased energy expenditure (Wang et al., 2003), (2) elevated FA oxidation (Dressel et al., 2003; Tanaka et al., 2003), (3) reduced obesity and insulin resistance (Tanaka et al., 2003; Wang et al., 2003), (4) exercise-induced muscle remodeling, and, collectively, (5) enhanced running endurance by 80% or more (Narkar et al., 2008).

Despite the above five collectanea, the minimal components needed to enhanced running performance have eluded description. Here we show that activation of muscle PPAR δ not only increases fat oxidation, but also coordinately decreases glucose catabolism to forestall hypoglycemia and facilitate progressively longer running time. Unexpectedly, this substrate prioritization does not depend on either oxidative fiber-type transformation or mitochondrial biogenesis. Mechanistically, we identify a PPARô-induced genomic signature in muscle as



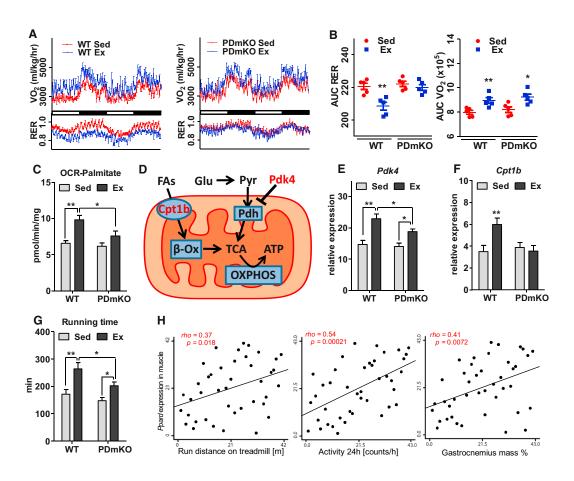


Figure 1. Exercise Induces a PPARô-Dependent Shift in Muscle Energy Substrate Utilization

Experiments were performed in the same set of 4-month-old WT or PDmKO mice with or without 4 weeks of exercise training (n = 5).

(A) Oxygen consumption rate (OCR, VO₂) and respiratory exchange ratio (RER, VCO₂/VO₂) measured over a 48 hr period.

(B) Quantitative analysis of VO2 and RER using area under curve (AUC) of the data in (A).

(C) OCR using palmitoyl-carnitine as the substrate in freshly isolated mitochondria from quadriceps muscle.

(D) Diagram showing the two major types of fuel sources (glucose and FAs) and the gatekeeper enzymes that control their mitochondrial influx.

(E and F) mRNA expression levels of (E) Cpt1b and (F) Pdk4 in soleus.

(G) Total running time in a run-to-exhaustion endurance test.

(H) Correlations between PPAR δ expression in quadriceps and running distance, activity, and muscle mass. Asterisks denote statistically significant differences (*p < 0.05, **p < 0.01).

the transcriptional basis of glucose conservation and ultimately enhanced stamina. These findings identify muscle PPAR δ as a key regulator of energetic resilience and offer a quantitative molecular approach in the development of new, safe, and effective therapeutics for the treatment of metabolic disease and the promotion of metabolic health.

RESULTS

Exercise Induces a PPAR∂-Dependent Shift in Muscle Energy Substrate Utilization

While endurance exercise shifts muscle energy substrate usage from glucose to FAs (Hamilton and Booth, 2000), the dependence on PPARδ for this shift is not known. Accordingly, we compared the benefits of treadmill training in wild-type (WT) and PDmKO mice (Figure S1A). After 4 weeks of daily running, WT mice show a clear shift in energy substrate usage from glucose to FA oxidation, as evidenced by the reduced respiratory exchange ratio (RER) (Figures 1A, 1B, S1B, and S1C) and increased palmitate-fueled mitochondrial oxygen consumption rate (OCR) (Figure 1C). Notably, these metabolic changes are mostly abolished in PDmKO mice (Figures 1A-1C, S1B, and S1C), demonstrating the dependence of exercise-induced metabolic adaptations on PPARb. Mechanistically, we show that the exercise-induced upregulation of mitochondrial gatekeeper genes (Figure 1D) is heavily compromised (Pdk4 induction reduced by ~50%; Figure 1E) or completely absent (Cpt1b; Figure 1F) in PDmKO mice. In terms of running endurance, the increase in performance of PDmKO mice after exercise training was only half that seen in WT controls (run-to-exhaustion treadmill test; Figure 1G). Consistent with these results, PPAR^a expression in skeletal muscle positively correlates with running distance, activity, and muscle mass in the BXD mouse genetic reference population (GRP) (Figure 1H) (Andreux et al., 2012; Peirce et al., 2004). Additional negative correlations between *Cpt1b* and *Pdk4* expression in muscle and plasma lactate (indicator for muscle glycolysis) and RER, respectively, further implicate PPAR δ in the adaptive regulation of energy substrate utilization (Figure S1D).

Despite the requirement for muscle PPAR δ in exerciseinduced metabolic adaptations and endurance enhancement, the glycolytic-to-oxidative fiber-type switch and mitochondrial biogenesis are still achieved in PDmKO mice (Figures S1A and S1E–S1J). Furthermore, sedentary PDmKO mice are indistinguishable from WT mice in terms of mitochondrial content and oxidative phosphorylation (OXPHOS) capacity (Figures S1A, S1E, and S1F), as well as muscle fiber-type composition (Figures S1E and S1G–S1J). In addition, whole-body energy expenditure (measured as oxygen consumption rate [VO₂]; Figures 1A, 1B, S1B, and S1C), energy substrate utilization (RER; Figures 1A, 1B, S1B, and S1C), and mitochondrial FA oxidation (Figure 1C) are all independent of muscle PPAR δ expression. This indicates a role for PPAR δ in adaptive, but not innate, muscle activity and stands in contrast to previous reports (Schuler et al., 2006).

Ligand Activation of Muscle PPAR[®] Prioritizes Energy Substrate Usage to Boost Endurance

Previous studies showed that treatment of mice with the PPAR^b agonist GW dramatically increased running endurance, but only when combined with daily exercise (Narkar et al., 2008). Based on the above, we re-examined the impact of GW on muscle energy substrate usage and endurance in fully sedentary mice. Unexpectedly, treatment of WT mice with GW (40 mg/kg in food) for a longer time (8 weeks compared to 4 weeks) reduced RER to a level similar to exercise training, indicative of increased FA metabolism (Figures 2A, 2B, S2A, and S2B). Consistent with this, palmitate-fueled respiration was \sim 50% higher in muscle mitochondria isolated from GW-treated mice, while succinate-fueled respiration was unchanged (Figures 2C and S2C). GW treatment also more than doubled the palmitate-induced increase of OCR in cultured C2C12 myotubes (Figures 2D and 2E). In addition, GW strongly induced the expression of the mitochondrial gatekeeper genes Pdk4 and Cpt1a/b both in vivo and in vitro (Figures 2F-2H) while serum lactate, an indicator of anaerobic glycolysis, was reduced ~40% in GW-treated mice (Figure S2D). Notably, GW treatment of PDmKO mice failed to alter RER (Figures 2A, 2B, S2A, and S2B), FA oxidation in muscle mitochondria (Figure 2C), expression of muscle Pdk4 and Cpt1b (Figures 2F and 2G), or circulating lactate levels (Figure S2D), establishing that the above effects are dependent on muscle PPARb.

Consistent with an energy substrate shift, the longer 8 week GW treatment of sedentary mice was sufficient to confer \sim 1.5 hr longer running time than untreated controls (Figure 2I). This endurance benefit is lost in PDmKO mice and thus dependent on muscle PPAR δ activation (Figure 2I). Unexpectedly, muscular glycogen content (Figures S2E and S2F), mitochondrial quantity and OXPHOS activity (Figures S2C and S2G–S2I), and muscle fiber-type composition (Figures S2J and S2K)—changes commonly associated with endurance enhancement (Holloszy and Booth, 1976)—were not affected by GW treatment. Thus, while establishing that ligand activation of

 $\text{PPAR}\delta$ can enhance endurance in sedentary mice, these findings implicate a novel mechanism of action.

PPAR[®] Increases Running Endurance by Preserving Glucose

The above data suggested a PPARô-controlled metabolic shift that preserves systemic glucose contributing to a GW-induced endurance enhancement. To determine the magnitude and timing of these changes, we monitored blood glucose in mice treated with or without GW during a run-to-exhaustion test. As expected, both control and GW-treated mice showed time-dependent reductions in blood glucose to <70 mg/dL, at which point the mice stopped running and often lost consciousness (Figures 2J and S2L). By increasing blood glucose to >120 mg/dL via intraperitoneal (i.p.) injection (250 mg/kg), exhausted mice were able to resume running for another ~20 min, confirming that blood glucose is the major determinant of endurance. Interestingly, while the blood glucose in the control mice started dropping after 90-120 min of running, GW-treated mice were able to maintain normal glycemic levels for extended periods and delay the onset of blood glucose reduction even after 180 min of running (Figure 2J). It is important to note that the glucose-sparing effects of GW treatment parallel those seen with exercise training, suggesting a common underlying mechanism (Figure S2M). Blood lactate was also monitored during our run-to-exhaustion tests, which showed minimal fluctuation in both control and GW-treated mice (Figure 2J, dashed lines; Figure S2N), indicating that the endurance regimen did not exceed the aerobic threshold of the tested mice. In combination, our data describe a PPARô-controlled muscle reprogramming that boosts exercise endurance by inversely regulating fat and glucose metabolism, thereby preserving circulating glucose to support other tissues such as the brain (Figure 2K).

PPAR[§] Orchestrates Mitochondrial Gene Networks

Global transcriptional analyses in the glycolytic white quadriceps muscle (WQ) identified 975 genes with altered expression upon GW treatment, with 492 up- and 483 downregulated. In addition to the key mitochondrial genes Pdk4 and Cpt1b described above (Figures 2F and 2G), gene ontology (GO) analysis of upregulated genes revealed significant enrichment in the PPAR signaling pathway as well as lipid and FA catabolism (including Lpl, Lipe, Acadl, Acads, and Acaa2) (Figures 3A, 3B, and S3A). Interestingly, lipogenic genes including $PPAR\gamma$ (master adipogenic regulator) and FA synthase (Fasn) were also induced (Figures 3A, 3B, and S3A), which would theoretically lead to a futile cycle of lipid catabolism and anabolism. Additionally, genes involved in antioxidant defense and glutathione synthesis (including Cat, Sod3, and Gpx1) were highly upregulated (Figures 3A, 3B, and S3A). Counterintuitively, pathways in carbohydrate metabolism, including the hexose metabolic process, pentose-phosphate shunt, and insulin signaling, were also significantly enriched (Figures 3A, 3B, and S3A). However, the induction of Fbp2, Pck1, and Pcx (Figure 3B) is consistent with the induction of an anabolic program, suggesting a possible role in muscle repair.

Conversely, pathways of insulin signaling, glycolysis, and carbohydrate catabolism were significantly enriched in the

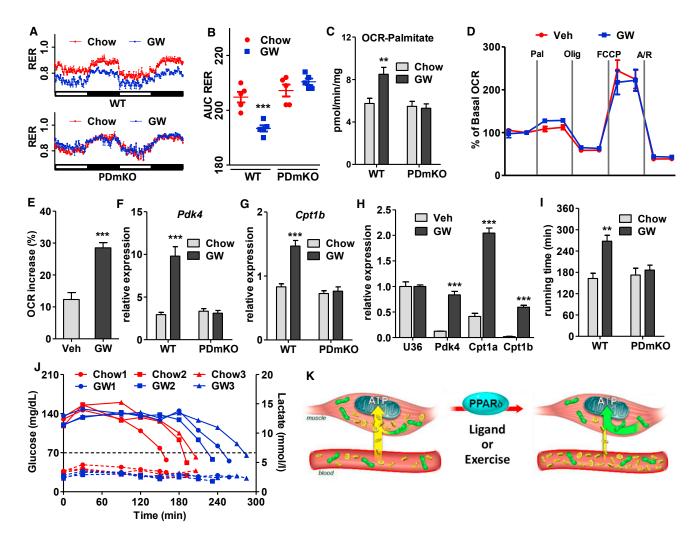


Figure 2. Ligand Activation of Muscle PPARô Induces Substrate Shift and Boosts Endurance by Preserving Glucose

Mouse experiments were performed in the same set of 4-month-old WT or PDmKO mice with or without 8 weeks of oral GW treatment (n = 8).

(A) RER measured over a 48 hr period.

(B) Quantitative RER analysis using AUC of the data in (A).

(C) OCR using palmitoyl-carnitine as the substrate in freshly isolated mitochondria from quadriceps.

(D) Change of OCR upon palmitate injection measured in C2C12 myotubes treated with vehicle or GW.

(E) Percentage increase in OCR measured in (D).

(F and G) mRNA expression levels of (F) Pdk4 and (G) Cpt1b in white quadriceps.

(H) mRNA expression levels of Pdk4 and Cpt1a/b in C2C12 myotubes. Data normalized to the level of U36 (U36b4).

(I) Total running time in the endurance test.

(J) Blood glucose (solid lines) and lactate (dotted lines) monitored during the run-to-exhaustion endurance test in mice treated with or without GW.

(K) Diagram showing the PPAR δ -controlled energy substrate shift induced by its ligands or exercise. Yellow marks glucose and its usage while green marks FAs and their usage. *p < 0.05, **p < 0.01, ***p < 0.001.

downregulated gene set (including *Irs2*, *Slc2a3*, and *Hk2*) (Figures 3A, 3C, and S3B). Notably, these transcriptional changes, combined with the suppression of the recently identified mitochondrial pyruvate carrier *Mpc1*, coordinately reduce muscle glucose catabolism (Figures 3A, 3C, and S3B). These studies reveal that PPAR δ reprograms muscle metabolism for endurance by reciprocal regulation of gene programs promoting FA oxidation and suppressing glucose metabolism (Figure 3D).

Ligand Remodeling of the PPAR_o Cistrome

Chromatin immunoprecipitation coupled with deep sequencing (ChIP-seq) was used to establish the PPAR δ cistrome in both the presence and absence of ligand. In C2C12 cells, 8,474 and 10,482 PPAR δ binding sites were identified in vehicle- and GW-treated cells, respectively (Figure 4A). Motif analysis identified a consensus PPAR response element significantly enriched in both conditions (Figure 4A), confirming the quality of the ChIP. A total of 5,586 binding sites were common to both vehicle- and

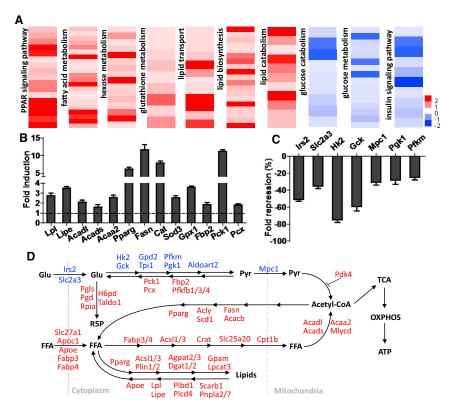


Figure 3. PPAR δ Gene Network Orchestrates Opposing Changes on Fat and Sugar Metabolism

RNA sequencing (RNA-seq) experiments were performed in white quadriceps from 4-month-old WT mice with or without 8 weeks of GW treatment. (A) Heatmaps showing individual gene expression changes in gene ontology (GO) terms identified in RNA-seq results. Data are presented as log₂(fold change).

(B) GW-induced fold induction of the expression of genes involved in FA catabolism (*LpI*, *Lipe*, *AcadI*, *Acads*, and *Acaa2*), lipogenesis (*PPARg* and *Fasn*), antioxidant (*Cat*, *Sod3*, and *Gpx1*), and gluconeogenesis (*Fbp2*, *Pck1*, and *Pcx*).

(C) GW-induced fold repression of the expression of genes involved in insulin signaling (*Irs2*), glucose uptake (*Slc2a3*), glycolysis (*Hk2*, *Gck*, *Pgk1*, and *Pfkm*), and mitochondrial pyruvate entry (*Mpc1*).

(D) Diagram showing the metabolism of glucose and FAs, the two major cellular energy substrates, as well as GW-induced gene expression changes that regulate their metabolism. Red and blue labels represent up- and downregulation induced by GW treatment, respectively.

p < 0.01 or 0.001 in all genes listed in (B) and (C).

GW-treated cells, with GW recruiting an additional 4,896 unique sites and dismissing 2,888 pre-ligand sites. PPAR δ binding sites were predominantly located in the intergenic and intronic regions, with only 4% in gene promoter regions (Figure 4B), as seen with many transcription factors.

Correlating the PPAR_o cistrome with the ligand-induced transcriptional changes (Figures 3 and S3) revealed that \sim 50% of GW-regulated genes (457 of 975 genes) were direct PPARδ target genes (based on proximity of binding sites to the closest transcription start site), with roughly equivalent numbers of these genes up- and downregulated (223 and 234, respectively; Figure 4C). Furthermore, GO analysis of the 457 directly regulated genes showed enrichment of the same categories as seen in the entire GW transcriptome, including FA metabolism in upregulated and glucose catabolism in downregulated gene sets (Figures 3A, S3, and 4C). In contrast, the 518 indirect PPARb target genes failed to show any significant GO enrichment. The marked overlap between the transcriptomic and cistromic findings supports a direct role for PPARδ-regulated transcriptional changes in both exercise- and ligand-induced adaptations in energy substrate utilization.

Interestingly, PPAR δ employs distinct mechanisms to regulate target genes. Only a subset of genes showed increased PPAR δ chromatin binding upon ligand treatment (e.g., *Pdk4* and *Mlycd*, in contrast to *Cpt1a*, *Slc25a20*, *Angptl4*, and *Ucp3*, where PPAR δ binding was independent of ligand) (Figures 4D–4F). Further investigation of the latter gene set revealed both ligand-induced loss of co-repressor binding (loss of NCoR binding on *Angptl4* and *Ucp3*) and ligand-induced recruitment of co-activator (increased Pgc1 α binding on *Cpt1a* and *Slc25a20*) (Figures 4G and 4H).

AMPK Activation Is Insufficient to Induce a Metabolic Shift

Previously, a functional interaction between PPAR_b and AMPK was suggested based on a synergistic induction of FA metabolism genes by co-treatment with GW and the AMPK activator AICAR, an effect that was dependent on PPAR_δ (Narkar et al., 2008). To explore the regulatory hierarchy controlling metabolic substrate utilization, we determined the effects of AICAR treatment on PPAR_b target genes (Figures 3A and 3B). AICAR alone did not significantly activate PPARo target genes involved in FA metabolism, except for the induction of $Ppar\gamma$, in agreement with an earlier study (Figures S4A and S4B). Furthermore, AICAR failed to repress glucose catabolism genes (Figure S4A). Consistent with this lack of transcriptional changes, 8 weeks of AICAR treatment did not alter substrate utilization in mice (Figure S4C). AICAR treatment did increase energy expenditure in mice, presumably through mitochondrial biogenesis (Figures S4C and S4D). Notably, the ability of AICAR to induce mitochondrial biogenesis is independent of PPAR₀ (Figure S4D), in line with the data that PPAR δ activation or depletion did not affect mitochondrial biogenesis (Figure S2G).

DISCUSSION

In endurance sport competitions such cycling, marathon runs, race walking, and cross-country skiing, "hitting the wall" is a dramatic demonstration of sudden and complete exhaustion. It is thought to be due to the depletion of liver and muscle glycogen and can be averted by training that promotes mitochondrial biogenesis, increased type I fibers, and enhanced FA burning.

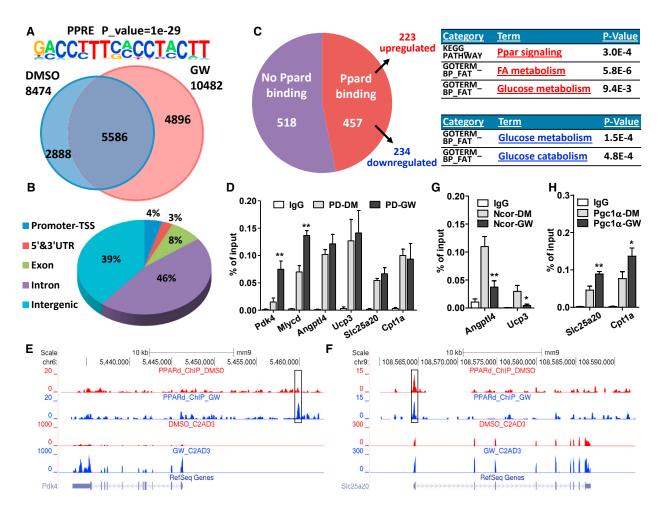


Figure 4. Ligand Remodeling of the PPAR_δ Cistrome

Experiments were performed in 5-day-differentiated C2C12 myotubes with 6 hr treatment of DMSO or GW.

(A) Venn diagram showing distinct and overlapping binding sites of PPARô in C2C12 myotubes with DMSO or GW treatment. PPRE motif (top) was significantly enriched.

(B) Pie chart illustrating genomic locations of PPARo binding sites in the DMSO-treated condition. GW treatment gave similar results.

(C) Pie chart showing the number of PPARô-bound or non-bound genes from all 975 genes that are changed by GW treatment. GO and pathway analysis of upand downregulated genes is listed.

(D) ChIP-qPCR showing PPAR^b binding sites that are enhanced by GW treatment or not. IgG, IgG control; PD-DM, PPAR^b-ChIP in DMSO treatment; PD-GW, PPAR^b-ChIP in GW treatment.

(E and F) ChIP-seq and RNA-seq reads aligned to (E) Pdk4 and (F) Slc25a20.

(G and H) ChIP-qPCR showing the changes of (G) NcoR and (H) Pgc1a binding sites by GW treatment. IgG, IgG control; Pgc1a/Ncor-DM, Pgc1a/Ncor-ChIP in DMSO treatment; Pgc1a/Ncor-GW, Pgc1a/Ncor-ChIP in GW treatment. *p < 0.05, **p < 0.01.

In this study, we show that PPAR δ expression correlates with endurance, and its activation by exercise mimetics, such as GW, is sufficient to increase running time by ~100 min without changes in either muscle fiber type or mitochondrial biogenesis. Thus, the foundational core of endurance enhancement appears to be purely metabolic. Furthermore, even though the GW impact appears to be achieved via increased FA metabolism, the strongest correlation to endurance is maintenance of blood glucose above 70 mg/dL. Indeed, expression of key glycolytic genes such as *Hk2*, *Gck*, and the recently described mitochondrial pyruvate carrier (Mcp1) is dramatically reduced.

Activation of muscle PPARδ either genetically or pharmacologically is sufficient to dramatically improve endurance capacity. However, fiber-type changes and mitochondrial biogenesis found in the PPAR δ transgenic models (Luquet et al., 2003; Wang et al., 2004) were not seen in "ligand-only" activation. Instead, we find that PPAR δ ligand prioritizes energy substrate usage to increase FA catabolism while lowering glycolysis with the net effect of preserving systemic glucose (Figure 2K).

This PPAR δ -directed metabolic shift is driven by the induction of a metabolic gene signature change, which includes not only the induction of the mitochondrial gatekeeper genes *Cpt1b* and *Pdk4*, but also the upregulation of genes in FA transport, FA oxidation, lipogenesis, and gluconeogenesis, and the downregulation of genes in glucose uptake, glycolysis, and mitochondrial pyruvate entry. Overall, these gene expression changes promoted the metabolic shift in energy substrate from glucose to FA in the muscle. Antioxidant genes, as well as genes in glutathione synthesis, were also significantly induced by GW treatment, which could protect against increased reactive oxidative species (ROS) due to elevated mitochondrial energy metabolism.

Our study reveals the molecular mechanism underlying muscle PPAR δ regulation of its target genes. We show that ligand activation recruits PPAR δ to new *cis* regulatory elements on its target genes. In addition, at sites where PPAR δ is naturally bound, ligand binding modifies its interaction with co-activators or co-repressors for target gene regulation (Yamamoto et al., 2011). Our data also suggested PPAR δ as the direct executor in GW-induced gene expression changes, since ~50% of the GW-induced genes, about half were upregulated and half downregulated upon GW activation, suggesting PPAR δ could both directly activate and suppress downstream genes in a ligand-dependent manner, a circumstance observed for other nuclear receptor members such as PPAR γ (Duan et al., 2008).

The importance of muscle PPAR δ in regulating energy metabolism has been further confirmed by the correlation study in 38 BXD mouse lines. We observed strong correlations between PPAR δ target gene expression and metabolic fitness. As a nuclear receptor, the transcription activity of PPAR δ is regulated by its endogenous ligands. Its activity, rather than its own expression level, controls its target gene expression. In support of this, exercise training highly induced the expression of PPAR δ target genes such as *Cpt1b* and *Pdk4* but had no effect on PPAR δ itself in skeletal muscle.

This work identifies PPAR δ as both the master regulator and key executor of adaptive changes in energy substrate use in skeletal muscle. Notably, pharmacologic activation of PPAR δ replicates the exercise-induced changes in substrate utilization to preserve systemic glucose and thereby delay the onset of hypoglycemia, or "hitting the wall." While exercise-induced muscle remodeling is well documented, the health benefits have been largely attributed to mitochondrial biogenesis and fiber-type transformation (Fan and Evans, 2017). In contrast, pharmacophores that activate PPAR δ promote endurance through preserving glucose, essentially "pushing back the wall," without affecting mitochondrial biogenesis or fiber-type transformation. This ability to chemically activate energetic circuits regulated by PPAR δ has the potential to confer health benefits in a variety of human diseases.

STAR * METHODS

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

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SUPPLEMENTAL INFORMATION

Supplemental Information includes four figures and two tables and can be found with this article online at http://dx.doi.org/10.1016/j.cmet.2017.04.006.

AUTHOR CONTRIBUTIONS

W.F., M.D., and R.M.E. designed the study. W.F., W.W., C.S.L., M.-X.H., and C.E.W. conducted all experiments. V.S., H.L., and J.A. performed the BXD correlation analysis. C.L. and R.T.Y. analyzed genomic data. W.F., A.R.A., M.D., and R.M.E. drafted and revised the manuscript.

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STAR***METHODS**

KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Antibodies		
Guinea pig anti-PPARδ	This paper	N/A
Guinea pig anti-NCOR	Yamamoto et al., 2011	N/A
Rabbit anti-PGC1a	Abcam	ab54481; RRID: AB_881987
Rabbit anti-Tom20	Cell Signaling	42406
Rabbit anti-HSP90	Cell Signaling	4877; RRID: AB_2233307
Mouse IgG2b anti-MYH7	DSHB	BA-F8
Mouse IgG1 anti-MYH2	DSHB	SC-71
Mouse IgM anti-MYH4	DSHB	BF-F3
Goat anti-Mouse IgG2b, Alexa 350	Thermo Fisher	A-21140; RRID: AB_2535777
Goat anti-Mouse IgG1, Alexa 488	Thermo Fisher	A-21121; RRID: AB_2535764
Goat anti-Mouse IgM, Alexa 555	Thermo Fisher	A-21426; RRID: AB_2535847
Bacterial and Virus Strains		
Cre-GFP adenovirus	Vector Biolabs	Cat 1700
Chemicals, Peptides, and Recombinant Proteins		
GW501516	Cayman Chemical	317318-70-0
Critical Commercial Assays		
Palmitate-BSA FAO Substrate	Agilent	102720-100
Cell Mito Stress Test Kit	Agilent	103015-100
Glycogen assay kit	BioVision	K646-100
Mitochondria isolation kit	MilliporeSigma	MITOISO1-1KT
Periodic Acid-Schiff (PAS) Staining System	MilliporeSigma	395B
Deposited Data		
RNA-seq	NCBI SRA database	SRA: SRP070441
ChIP-seq	NCBI SRA database	SRA: SRP081099
Experimental Models: Cell Lines		
C2C12	ATCC	CRL-1772
Experimental Models: Organisms/Strains		
Pparð ^{fl/fl}	Barak et al., 2002	N/A
ACTA-Cre	JAX	006149
Oligonucleotides		
Full sequences in Table S2	IDT	N/A

CONTACT FOR REAGENT AND RESOURCE SHARING

Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Ronald Evans (evans@salk.edu).

EXPERIMENTAL MODEL AND SUBJECT DETAILS

Mouse models

PDmKO mice were generated by crossing Pparo^{fl/fl} mice (Barak et al., 2002) with Acta1-Cre mice (JAX 006149). Male mice of 2-4 months of age were used in all experiments. Age-matched Cre- mice were used as controls.

Cell lines

C2C12 myoblasts were cultured in DMEM supplemented with 20% FBS. All C2C12 in vitro experiments were performed in differentiated myotubes, after 5 days of differentiation in DMEM supplemented with 2% horse serum. Primary myoblasts were isolated from Pparδ^{fl/fl} mice and the knockout of Pparδ was achieved by the transfection of adenovirus expressing Cre recombinase (Vector Biolabs Cat 1700). Primary myotube formation was induced by 2 days of culture in DMEM supplemented with 2% horse serum.

METHOD DETAILS

Animal studies

Prior to training or exhaustion running, mice were pre-adapted to the treadmill for 20 min per day for 3 days at a gradually increased speed (5 to 10 m/min). Daily exercise training was achieved with one hour of forced running on a rodent treadmill (Harvard Apparatus) at a speed of 10 m/min. The same treadmill was used for the run-to-exhaustion test, which included 10 min of adaptive period with a gradually increasing speed from 10 to 15 m/min followed by the exhaustion run at 15 m/min till mice failed. Blood glucose and lactate levels were measured using a glucometer (Nova max) and a Lactate Scout analyzer (EKF Diagnostic) with tail-nip bleeding. GW501516 was administered through customized diets (Envigo) at the concentration of 40mg/kg. Energy expenditure (VO2), RER (VCO2/VO2), and activity were monitored with the CLAMS/Oxymax system (Columbus Instruments). Body temperature was measured with a rectal thermometer (Thermoworks) and an infrared camera (FLIR). All animal protocols were reviewed and approved by the Institute of Animal Care and Use Committee (IACUC) of their respective institutes, and studies were conducted in compliance with institutional and national guidelines.

Western blotting

Freshly frozen quadriceps muscle was pulverized in liquid nitrogen. About 50mg of muscle powder was weighed and proteins extracted with the ProPrep protein extraction solution (Bulldog Bio, 17081). Protein concentration was measured with the Pierce BCA protein assay kit (Thermo Fisher, 23225). 20 μ g of total proteins was loaded onto 4%–12% gradient NuPAGE Bis-Tris gels (Invitrogen) and run for 1.5 hr at 120V. Proteins were transferred to nitrocellulose membranes (Biorad). After one-hour blocking in 5% milk PBST (0.1% Tween 20) solution, membranes were incubated overnight at 4°C with in-house developed guinea pig anti-PPAR δ and commercial PGC1 α (Abcam ab54481), Tom20 (Cell Signaling 42406), and HSP90 (Cell Signaling 4877) antibodies, followed by 3x 5 min washes in PBST, 1 hr incubation in secondary HRP antibodies, and 3x 5 min washes in PBST. SuperSignal West Pico (Thermo 34080) was used to develop the signals.

Seahorse Bioanalyzer

For Seahorse analysis (XF96, Agilent Technologies), C2C12 myoblasts were seeded at a density of 10⁴/well in XF96 plates. After 4 days of differentiation, cells were treated overnight with vehicle (DMSO) or GW501516 (0.2 μM). OCR and ECAR were next measured following manufacturer's instructions with the injection of Seahorse XF Palmitate-BSA FAO Substrate (Agilent Technologies) and Seahorse XF Cell Mito Stress Test Kit (Agilent Technologies).

Immunohistochemistry and histochemistry

Gastrocnemius, soleus, and plantaris muscles were dissected and freshly frozen in liquid N₂-cooled isopentane. 10 μ m cryosections were prepared using a cryostat (Zeiss). Sections were dried at RT (room temperature) for 30 min and stored in -80°C or directly used for stainings. For immunohistochemistry, sections were blocked in 5% GS/PBST (5% goat serum in PBST) for 1 hr at RT and incubated overnight at 4°C with a mixture of three primary mouse monoclonal antibodies in 5% GS/PBST against MYH7 (BA-F8, IgG2b), MYH2 (SC-71, IgG1), and MYH4 (BF-F3, IgM), obtained from DSHB at the University of Iowa. After 3x 5 min washes in PBST, sections were incubated for one hour with a mixture of three goat anti-mouse secondary antibodies against IgG2b (Alexa 350), IgG1 (Alexa 488), and IgM (Alexa 555) in 5% GS/PBST, followed by 3x 5 min washes in PBST. Sections were then mounted with ProLong Gold Anti-fade mountant (Thermo Fisher) and sealed with nail polish. For histochemical mitochondrial complex I and IV activity staining, sections were incubated at RT for 15 min in freshly prepared complex I assay solution (100mM Tris (pH 7.1), 1mg/ml nitro blue tertrazolium, and 1mg/ml NADH) or complex IV assay solution (200mM NaH2PO4 (pH 7.4), 7.5mg/ml sucrose, 2ug/ml catalase, 1.5mg/ml cytochrome *c*, and 1mg/ml DAB). Sections were washed in distilled water and mounted in Permount (Thermo Fisher). For glycogen staining, a Periodic Acid-Schiff (PAS) staining system (MilliporeSigma, 395B) was used following the manufacturer's manual and mounted with Permount. All sections were imaged with an Olympus VS-120 Virtual Slide Scanning Microscope.

Mitochondrial isolation and analysis

Mitochondria were isolated from freshly dissected quadriceps muscle using a mitochondrial isolation kit following the manufacturer's manual (MilliporeSigma, MITOISO1). Mitochondrial protein concentration was measured using a BCA assay. 50ug of freshly isolated mitochondria was added to each well in a Seahorse XF96 plate and pelleted by 30 min of centrifugation at 4°C at the speed of 3000 g. OCR was measured using the Seahorse XF96 bioanalyzer and the XF96 assay kit (Agilent Technologies) following manufacturer's protocol with either succinate or palmitoyl-carnitine as the energy substrate. The activities of citrate synthase and mitochondrial complex I, II+III, and IV, were measured using spectrophotometric enzyme assays (Fan et al., 2011). Specifically, freshly isolated mitochondria were disrupted with 3 cycles of freeze-and-thaw and immediately used to detect complex I, II+III, IV, and citrate

synthase activities by spectrophotometric assays. Complex I activity was measured as the rate of NADH oxidation at 340 nm. A reaction containing 400 μ L water, 500 μ L 2x Buffer (500 mM sucrose, 2 mM EDTA, 100 mM Tris-HCl, pH 7.4), 10 μ L 10 mM decylubiquinone (DB, Sigma), 1 μ L 2M KCN, and 20ug mitochondria, was incubated at 30°C for 5 min. 50 μ L 1mM NADH was then added to trigger the reaction, and absorption at 340 nm was measured for 5 min for total complex I activity. A parallel experiment was performed in the presence of 5 μ L 1 mg/ml rotenone to measure rotenone-insensitive complex I activity. Complex II+III activity was measured as the rate of cytochrome *c* (cyt c) reduction at 550 nm. A reaction was set up containing 550 μ L water, 400 μ L 100 mM potassium phosphate buffer (pH 7.4), 20 μ L 1 M succinate, 1 μ L 0.5 M EDTA, 1 μ L 2M KCN, and 30 μ L 1 mM cyt c. 10 μ g mitochondria was then added and the absorption at 550 nm was monitored for 2 min for complex II+III activity. Complex IV activity was measured as the rate of cytochrome *c* (cyt c) oxidation at 550 nm. A reaction was set up containing 850 μ L water, 100 μ L 100 mM potassium phosphate buffer (pH 7.4), and 50 μ L 1 mM reduced cyt c. 2 μ g mitochondria was then added and the absorption at 550 nm was monitored for 2 min for complex IV activity. To reduce cyt c, 2 μ L 1 M dithiothreitol (DTT) was added to 1 mL 1 mM cyt c and was ready to use after a 15 min incubation. Citrate synthase activity was measured as the reduction of DTNB at 412 nm. A reaction was set up containing 800 μ L water, 100 μ L 1 M Tris-HCl (pH 8.0), 50 μ L 6 mM Acetyl-CoA, and 10 μ L 10 mM DTNB. 10 μ g mitochondria was then added and the absorption at 412 nm was monitored for 2 min for citrate synthase activity.

RNA analysis

Total RNAs were extracted from the glycolytic white quadriceps muscle or C2C12 myotubes with Trizol (Invitrogen) and the RNeasy Mini kit with on-column DNase treatment (QIAGEN). RNA quality was confirmed using the Agilent 2100 Bioanalyzer and RNA-Seq libraries prepared using the TruSeq RNA Sample Preparation Kit v2 according to Illumina protocol. Multiplexed libraries were validated using the Agilent BioAnalyzer, normalized and pooled for sequencing. High-throughput sequencing was performed on the Hiseq 2000 system (Illumina) with a 100-bp read length. For quantitative PCR (qPCR) analysis, 1 µg of RNA was reverse transcribed using the iScript supermix (Biorad) and qPCR performed with specific primer pairs and the SYBR Green Master Mix on the CFX384 system (Biorad).

Chromatin immunoprecipitation (ChIP) analysis

Each ChIP was performed in $4x10^7$ cells using a previously described protocol (Barish et al., 2010). Briefly, C2C12 myotubes were crosslinked with 1% freshly prepared formaldehyde in PBS for 10 min at room temperature. After glycine neutralization, cells were harvested and nuclei were isolated, lysed and sheared with the Diagenode Bioruptor to yield DNA fragment sizes of 200–500 base pairs followed by immunoprecipitation using the following antibodies: normal guinea pig IgG, in-house developed guinea pig anti-PPAR δ and NcoR antibodies, normal rabbit IgG, and rabbit anti- PGC1 α antibody (Abcam ab54481). DNA was next extracted and subjected to either qPCR or ChIP-seq library preparation using the NEXTflex Illumina ChIP-Seq Library Prep Kit (Bioo Scientific). High-throughput sequencing was performed on the Hiseq 2000 system (Illumina) with a 50-bp read length.

Glycogen assay

Glycogen was measured using a commercial kit (BioVision K646-100) following manufacturer's instructions. Snap-frozen muscles were ground using a mortar and pestle in liquid N2, and weighed tissue powder lysed in the provided buffer. Tissue lysate was then assayed for glycogen content.

QUANTIFICATION AND STATISTICAL ANALYSIS

ANOVA and post hoc analysis was used to evaluate statistical significance in studies using four groups of samples. For studies with only two samples, unpaired t test was used instead. For RNA-Seq, image analysis and base calling were done with Illumina CASAVA-1.8.2. Short read sequences were mapped to a UCSC mm9 reference sequence using the RNA-Seq aligner STAR (Dobin et al., 2013). Known splice junctions from mm9 were supplied to the aligner and de novo junction discovery was also permitted. Differential gene expression analysis, statistical testing and annotation were performed using Cuffdiff 2 (Trapnell et al., 2013). Transcript expression was calculated as gene-level relative abundance in fragments per kilobase of exon model per million mapped fragments and employed correction for transcript abundance bias (Roberts et al., 2011). Results for genes of interest were also explored visually using the UCSC Genome Browser. For ChIP-Seg, short DNA reads were demultiplexed using Illumina CASAVA v1.8.2. Reads were aligned against the mouse mm9 using the Bowtie aligner allowing up to 2 mismatches in the read. Only tags that map uniquely to the genome were considered for further analysis. Subsequent peak calling and motif analysis were conducted using HOMER, a software suite for ChIP-Seg analysis. The methods for HOMER, which are described below, have been implemented and are freely available at http:// homer.ucsd.edu/homer/. One tag from each unique position was considered to eliminate peaks resulting from clonal amplification of fragments during the ChIP-Seq protocol. Peaks were identified by searching for clusters of tags within a sliding 200 bp window, requiring adjacent clusters to be at least 1 kb away from each other. The threshold for the number of tags that determine a valid peak was selected for a false discovery rate of < 0.01, as empirically determined by repeating the peak finding procedure using randomized tag positions. Peaks are required to have at least 4-fold more tags (normalized to total count) than input or IgG control samples and 4-fold more tags relative to the local background region (10 kb) to avoid identifying regions with genomic duplications or non-localized binding. Peaks are annotated to gene products by identifying the nearest RefSeq transcriptional start site. Visualization of ChIP-Seq results was achieved by uploading custom tracks onto the UCSC genome browser. Gene ontology and pathway analysis was performed with the DAVID functional annotation tool (https://david.ncifcrf.gov). The BXD correlation analysis was based on the Spearman's rho and performed in R as previously described (Andreux et al., 2012).

DATA AND SOFTWARE AVAILABILITY

The accession number for the RNA-seq data reported in this paper is SRA: SRP070441. The accession number for the ChIP-seq data is SRA: SRP081099.