

Hepatic Nuclear Receptor Expression Associates with Features of Histology in Pediatric Nonalcoholic Fatty Liver Disease

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Nonalcoholic fatty liver disease (NAFLD) is the most common cause of chronic liver disease in children and adults. This study examined the relationship between hepatic nuclear receptor (NR) expression and histologic features of NAFLD. Drugs targeting a variety of NRs for nonalcoholic steatohepatitis (NASH) are in clinical trials. Liver messenger RNA was isolated from 40 children (10-19 years) undergoing end-of-treatment biopsy in the Treatment of NAFLD in Children (TONIC) trial. High-throughput quantitative polymerase chain reaction assayed NR messenger RNA. Cluster analysis was used to group 36 NRs, and NR levels were related to histologic measures of specific NAFLD features. Cluster analysis determined five groupings of NRs. Significant ($P < 0.05$) differential expressions of specific NRs associated with histologic measures include farnesoid X receptor alpha and retinoic acid receptor (RAR β and RAR β) for steatosis; estrogen receptor alpha (ER α) and peroxisome proliferator-activated receptor gamma 3 (PPAR γ 3) for hepatocellular ballooning; ER and PPAR γ 2 for lobular inflammation; PPAR $\alpha/\delta/\gamma$ 1/ γ 2, ER α , constitutive androstane receptor, chicken ovalbumin upstream promoter transcription factor 1, RAR α , RAR β 1, retinoid X receptor, pregnane X receptor, thyroid hormone receptors α and β , and nuclear receptor related-1 for fibrosis; and ER α and RAR β / β 1/ α for diagnosis of NASH. *Conclusion:* Differential expression of specific NRs correlates with histologic severity of specific NAFLD features. These NRs are pleiotropic transactivators regulating basal metabolic functions and inflammatory responses. Derangement of activity of these receptors in NAFLD provides a rationale for exploiting their ability with receptor-specific ligands to ameliorate NASH and its consequences. (*Hepatology Communications* 2018;2:1213-1226).

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Nonalcoholic fatty liver disease (NAFLD) is the most common liver disease among preadolescents and adolescents in the United States.⁽¹⁾ NAFLD encompasses a spectrum of histologic features from isolated steatosis (generally nonprogressive) to potentially severe nonalcoholic steatohepatitis (NASH).⁽²⁾ NASH is characterized at the molecular

level by oxidative stress and activation of proinflammatory profibrotic cascades and is defined histologically as steatosis with inflammation and hepatocellular ballooning, often accompanied by fibrosis.^(3,4) NASH can ultimately lead to decompensated cirrhosis or hepatocellular carcinoma.^(2,5) Among adults, the frequency of NASH as an indication for liver transplant increased 800% between 2001 and 2009 and has become the second most common indication overall⁽⁶⁾; NASH is

Abbreviations: CAR, constitutive androstane receptor; cDNA, complementary DNA; COUP-TF, chicken ovalbumin upstream promoter transcription factor; ER, estrogen receptor; FXR, farnesoid X receptor; GCNF, germ cell nuclear factor; LXR, liver X receptor; mRNA, messenger RNA; NAFLD, nonalcoholic fatty liver disease; NASH CRN, nonalcoholic steatohepatitis Clinical Research Network; NASH, nonalcoholic steatohepatitis; NR, nuclear receptor; NURR1, nuclear receptor related 1; OCA, obeticholic acid; PCR, polymerase chain reaction; PPAR, peroxisome proliferator-activated receptor; PXR, pregnane X receptor; qPCR, quantitative polymerase chain reaction; RAR, retinoic acid receptor; RXR, retinoid X receptor; TONIC, Treatment of Nonalcoholic Fatty Liver Disease in Children; TR, thyroid hormone receptor; VDR, vitamin D receptor.

Received June 6, 2018; accepted June 18, 2018.

Additional Supporting Information may be found at <http://onlinelibrary.wiley.com/doi/10.1002/hep4.1232/full>.

Supported by the National Institute of Diabetes and Digestive and Kidney Diseases (grants U01DK061718, U01DK061728, U01DK061731, U01DK061732, U01DK061734, U01DK061737, U01DK061738, U01DK061730, and U01DK061713 to the Nonalcoholic Steatohepatitis Clinical Research Network); additional support from the National Center for Advancing Translational Sciences (grants UL1TR000439, UL1TR000077, UL1TR000436, UL1TR000150, UL1TR000424, UL1TR000006, UL1TR000448, UL1TR000040, UL1TR000100, UL1TR000004, UL1TR000423, UL1TR000058, and UL1TR000454) and the Intramural Research Program of the National Institutes of Health National Cancer Institute.

on a trajectory to become the most common indication for transplant by 2025.⁽⁷⁾ In the United States, the prevalence of NAFLD among teenagers has doubled in the past 20 years and 38% of obese children are reported to have NAFLD.^(8,9)

Some patients with NAFLD maintain isolated hepatic steatosis while others develop inflammation, cell injury, and fibrosis (NASH), although the mechanisms underlying this spectrum of outcomes are unclear.^(10,11) The development of NASH is believed to involve insulin resistance, lipotoxicity, and the activation of necro-inflammatory pathways that lead to mitochondrial dysfunction and the release of factors that trigger apoptosis.^(3,12) Attenuation of these steps is requisite for improving outcomes.

Nuclear receptors (NRs) are ligand-inducible transcription factors that activate hierarchical transcriptional networks. They coordinate multi-organ physiologic pathways related to growth, nutrient uptake, metabolic homeostasis, and inflammation.⁽¹³⁾ NRs are expressed in a tissue-dependent, time-dependent, and developmentally specific manner, and each NR has its own subset of protein targets.⁽¹⁴⁾ NR ligands intimately related to NASH pathophysiology include fatty acids (both endogenous and dietary), bile acids, sex hormones, and vitamins A and D.⁽¹⁵⁾

In the liver, NRs act as sensors of the metabolic milieu, activating transcription of cellular machinery for maintenance of homeostasis. NRs act as pleiotropic transactivators of transcriptional cascades, coordinating hepatic functions, including detoxification, storage and release of glucose, and production and uptake of cholesterol.⁽¹⁶⁾ NRs and their protein targets are intimately involved in pathologic processes underlying the

metabolic syndrome and NAFLD, including insulin resistance, hepatic lipid accumulation and inflammation, and increased intestinal permeability.^(15,17)

Drugs that modulate NR activity, including thiazolidinediones and other peroxisome proliferator-activated receptor (PPAR) agonists, are widely used in the treatment of metabolic disease. Several drugs, including obeticholic acid (OCA; a farnesoid X receptor [FXR] α agonist), pioglitazone (a PPAR γ agonist), and elafibranor (GFT505, a dual PPAR δ /PPAR α agonist) have undergone or are undergoing clinical trials in humans for the treatment of adult NAFLD and have demonstrated variable efficacy.

Despite the accumulating evidence for the role of NRs in NASH pathophysiology and treatment, NR expression patterns in children with NAFLD have not been studied. We hypothesized that NRs would be variably expressed in subjects with differing degrees of severity as assessed by histology and that NRs with therapeutic agonists that are currently undergoing testing (i.e., FXR α , PPAR γ α / δ , thyroid hormone receptor [TR] β) would be most likely to differ with histology. The expression pattern of NRs in NAFLD may be a useful tool in precision medicine to identify and personalize treatment of those at particular risk.

Patients and Methods

STUDY POPULATION

This ancillary study of the Treatment of NAFLD in Children (TONIC) trial had Institutional Review Board approval at each of the eight clinical centers comprising The National Institute of Diabetes and

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DOI 10.1002/hep4.1232

Potential conflict of interest: Dr. Lavine consults for Alexion, Allergan, Amarin, Merck, and Takeda. Dr. Brunt consults for Aris, NGM, and Cymabay. The other authors have nothing to report.

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Digestive and Kidney Diseases-sponsored NASH Clinical Research Network (NASH CRN) and approval as an ancillary study of the NASH CRN. The NR expression participants were obtained only from the University of California, San Diego site. Written

informed consent was obtained from a parent or legal guardian, and written assent was obtained from children 8-17 years prior to screening and enrollment.

TONIC was a phase IIb, multicenter, double-blind, randomized, placebo-controlled trial of either

TABLE 1. PHENOTYPIC CHARACTERIZATION OF 40 CHILDREN WITH AND WITHOUT NASH WITH NUCLEAR RECEPTOR EXPRESSION PROFILES

	Not NASH (n = 21)		Borderline/Definite NASH (n = 19)		P Value [†]
	n	Mean (SD) / %	n	Mean (SD) / %	
Demographics					
Female sex	4	19%	3	16%	1.00
Hispanic ethnicity	16	76%	18	95%	0.19
Age in years					
Mean (SD)		15.0 (2.4)		14.7 (2.7)	0.72
Minimum, maximum		11, 19		10, 19	
Tanner stage					
1-3	13	62%	11	65%	1.00
4-5	8	38%	6	35%	
Anthropometric					
Body mass index in kg/m ²		32.8 (6.4)		33.3 (5.3)	0.80
Histology*					
Steatosis score					
0 = <5%	7	33%	0	0%	0.003
1 = 5%-33%	9	43%	6	32%	
2 = 34%-66%	2	10%	10	53%	
3 = >66%	3	14%	3	16%	
Lobular inflammation score					
0 = 0	2	10%	0	0%	<0.001
1 = <2 under 20x magnification	19	90%	6	32%	
2 = 2-4 under 20x magnification	0	-	9	47%	
3 = >4 under 20x magnification	0	-	4	21%	
Ballooning score					
0 = none	18	86%	5	26%	<0.001
1 = few	3	14%	6	32%	
2 = many	0	-	8	42%	
Fibrosis stage					
0 = none	10	48%	2	11%	<0.001
1a = mild, zone 3 perisinusoidal	2	10%	2	11%	
1b = moderate, zone 3 perisinusoidal	0	0%	1	5%	
1c = portal/periportal only	8	38%	2	11%	
2 = zone 3 and periportal	1	5%	8	42%	
3 = bridging	0	0%	4	21%	
TONIC treatment					
Metformin	5	24%	7	37%	0.05
Vitamin E	11	53%	3	16%	
Placebo	5	24%	9	47%	

*Biopsies at 96 weeks of treatment were selected for NR expression levels.

[†]Based on Fisher's exact test for categorical variables and *t* test for continuous variables.

metformin or vitamin E versus placebo in 173 subjects 8-17 years with biopsy-proven NAFLD and persistent alanine aminotransferase >60.^(17,18) Exclusion criteria for TONIC have been described and include diabetes, cirrhosis, use of drugs that could cause or treat fatty liver, and bariatric or hepatobiliary surgery. The TONIC trial concluded in March 2010. End-of-treatment percutaneous liver biopsies were obtained on enrolled subjects after 96 weeks of oral daily dosing of vitamin E (800 IU/day), metformin (1 g/day), or placebo. Flash-frozen fragments of the end-of-treatment biopsies from the last 40 subjects enrolled at the University of California, San Diego were prepared for profiling for NR expression as described below. The liver tissue used in this study consisted of small fragments of the biopsy taken for assessment of histologic changes, and a second pass was not made to obtain the sample. These 40 subjects had been randomized to receive metformin (n = 12), vitamin E (n = 14), or placebo (n = 14). Ethnic makeup, body mass index, and Tanner staging of the subjects at time of enrollment are summarized in Table 1.

HISTOLOGIC EVALUATION

Biopsy specimens were evaluated, scored, and graded for histologic features of NAFLD by the Pathology Committee of NASH CRN in a centralized consensus review format; they were blinded to all clinical information and used validated criteria by Kleiner et al.⁽¹⁸⁾ Specimens were scored for steatosis (grade 0 [macrovesicular fat in <5% of hepatocytes], grade 1 [5%-33%], grade 2 [34%-66%], and grade 3 [>66%]), lobular inflammation (0-3), ballooning (0-2), and fibrosis (stage 0, stage 1a [mild zone 3], stage 1b [moderate zone 3 perisinusoidal], stage 1c [portal/periportal fibrosis only], stage 2 [zone 3 and periportal fibrosis], stage 3 [bridging fibrosis], and stage 4 [cirrhosis]).

Additionally, pattern-based diagnoses were given for each biopsy. The NAFLD pattern of isolated steatosis ("not NASH") versus "borderline zone 1 pattern" (a pattern more common in pediatric NAFLD), "borderline zone 3 pattern," or "definite NASH" were determined according to specific criteria published by the committee.⁽⁹⁾

NR PROFILING

Total liver messenger RNA (mRNA) was isolated using the RNAqueous-Micro kit (Life Technologies, Grand Island, NY). Complementary DNA (cDNA)

amplification was performed using the WT-Ovation RNA Amplification System (NuGen, San Carlos, CA). The cDNA product yield and purity were assessed using an Agilent 2100 Bioanalyzer. The Total Human Reference RNA was prepared for cDNA synthesis. Xpress Reference Human Universal RNA (SuperArray/Qiagen, Hilden, Germany) was spiked with 1 μ L of each NASH CRN sample cDNA and used to generate a quantitative polymerase chain reaction (qPCR) standard curve.

Relative NR expression levels were determined by high-throughput qPCR. Primers and probes were designed using ABI PrimerExpress software. Sequences of primers and probes used in this study have been reported⁽¹⁹⁾ and were designed to have similar amplification efficiencies. All probes for TaqMan real-time PCR were 5' labeled with 6-carboxyfluorescein and 3' labeled with 6-carboxytetramethylrhodamine. PCR reactions were assembled using a Janus automated workstation (PerkinElmer, Shelton, CT) containing 1 \times TaqMan Universal PCR Master Mix, 300 nM primers, 250 nM probe, and cDNA equivalent to 1 ng total RNA in a 10-mL volume. PCR was performed in an ABI PRISM 7700 detection system (Perkin Elmer) at 50C for 2 minutes and 95C for 10 minutes, followed by 40 two-step cycles of 95C for 15 seconds and 60C for 1 minute. Relative mRNA levels were calculated using the comparative delta-Ct method and normalized against separately measured 50S ribosomal protein L15 mRNA levels in the same total RNA samples.⁽²⁰⁾ Expression of the 36 NRs known at the time of analysis and that had primer sets validated for amplification efficiency criteria was compared among categories of steatosis, lobular inflammation, ballooning, and NASH diagnosis. The normalized expression level reported for each NR represents the number of qPCR cycles necessary to generate detectable fluorescence of the receptor in the sample. These units are nonlinear representations of the amount of base mRNA substrate.

STATISTICAL ANALYSIS

Demographic, anthropometric, and histologic features were compared between children with borderline or definite NASH versus those without NASH (Table 1). *P* values were derived from *t* tests for continuous variables or Fisher's exact test for categorical variables.

The outcomes of interest for the current investigation were the expression profile of 36 hepatic NRs in pediatric patients with NAFLD. Exploratory analyses

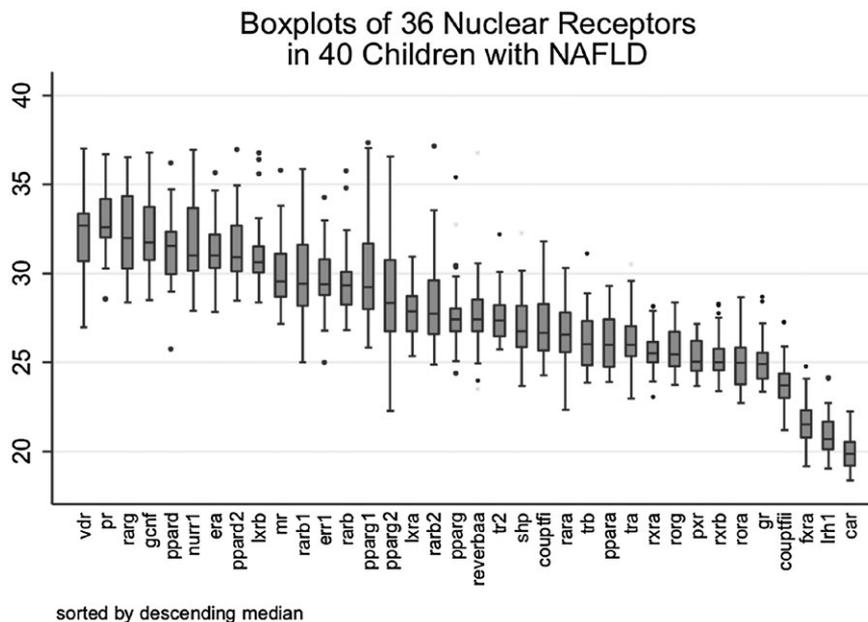


FIG. 1. Boxplots of 36 NRs sorted by descending median in 40 children with NAFLD. Boxplots of all 36 NRs illustrate the breadth of expression of each receptor. VDR demonstrates the lowest mean expression (higher number of PCR cycles needed to detect), while CAR demonstrates the highest. Most receptors had at least one outlier. Abbreviations: err; estrogen-related receptor; gr, glucocorticoid receptor; lrh, liver receptor homolog 1; mr, mineralocorticoid receptor; pr; ror, RAR-related orphan receptor alpha; reverb, nuclear receptor subfamily 1 group D member 1; shp, small heterodimer partner.

included boxplots of the NRs sorted by the median level of normalized mRNA level (Fig. 1).

Cluster analysis was used to assess the expression profile of NRs. Groupings of the NRs were determined using hierarchical clustering with average linkage based on their normalized expression levels.⁽²¹⁾ Twelve NRs had observations with missing data (eight missing vitamin D receptor (VDR), seven missing progesterone receptor, eight missing retinoic acid receptor (RAR) γ , four missing germ cell nuclear factor, one missing PPAR δ , three missing nuclear receptor related 1 (NURR1), two missing PPAR δ 2, one missing liver X receptor (LXR) β , one missing mineralocorticoid receptor, four missing estrogen-related receptor, one missing PPAR γ 1, one missing PPAR γ 2). Missing data were imputed with the median and used for both cluster and regression analyses.

Results of the NR and patient cluster analyses were displayed separately as linear dendrograms (Supporting Figs. S1 and S2) and simultaneously as a heatmap (Fig. 2). The Duda-Hart criterion for stopping rules was used to determine the number of clusters.

Each of the 36 NRs was compared across the following histologic features: steatosis (grade $\leq 33\%$ versus grade $>33\%$), steatohepatitis (none versus borderline/definite), fibrosis stage (none/mild versus moderate/advanced), lobular inflammation (<2 versus $2+$ foci),

and ballooning (none versus few/many). To down-weight the effect of outliers, medians were used as summary statistics and robust linear regression was used to derive *P* values. Logistic regression was used to globally test the set of NRs within each cluster as predictors of each histologic feature dichotomized into higher versus lower severity (Table 2).

Two-sided *P* values were nominal and not adjusted for multiple comparisons. Analyses were performed using SAS version 9.3 (SAS Institute, Cary, NC) and Stata version 14 (StataCorp, College Station, TX).

Results

SUBJECT CHARACTERISTICS AND RESULTS OF TRIAL

All 40 subjects received end-of-treatment research biopsies on which histologic analyses and NR expression were performed. Subject treatments included placebo, vitamin E, or metformin. No subject was excluded from the analyses or lost to follow-up. In total, 85% of subjects were Hispanic with a mean body mass index of 33.0 ± 5.8 kg/m². Although all subjects had biopsy-proven NAFLD at the time of TONIC enrollment, by the end of treatment, 17.5% (*n* = 7) had fully resolved ($<5\%$ steatosis and no other evidence

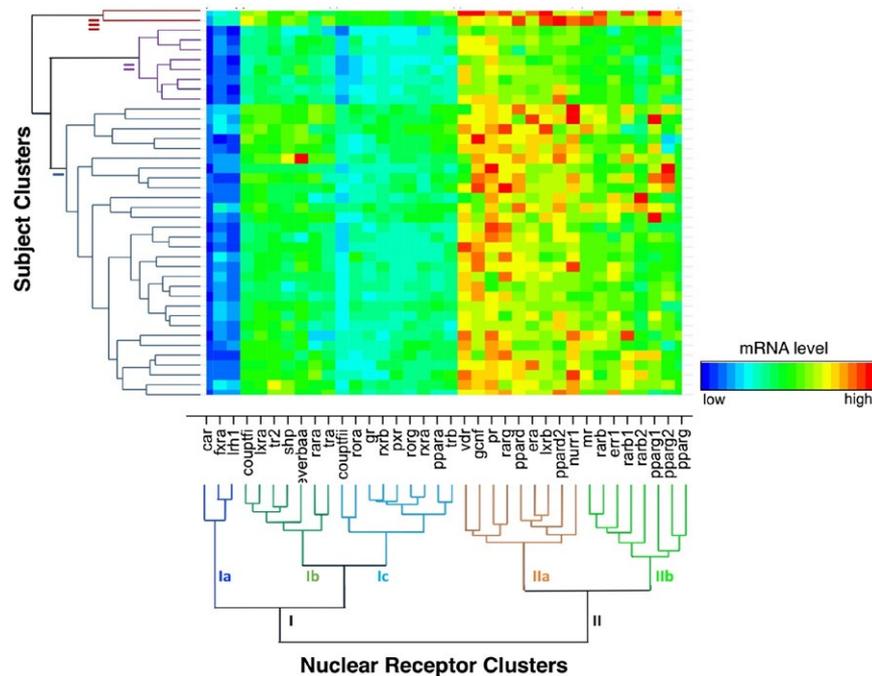


FIG. 2. Hierarchical clustering of NR expression levels relative to subject clusters. The normalized mRNA expression levels are displayed as a heatmap, organized by the results of the NR cluster analysis (main *x* axis) and the subject cluster analysis (main *y* axis). NRs cluster into two superfamilies and five individual clusters (Ia: CAR, FXR α , LRH1; Ib: COUP-TF1, LXR α , TR2, REV-ERB α - α , RAR α , TR α ; Ic: COUP-TFII, ROR α , GR, RXR β , PXR, ROR, RXR α , PPAR α , TR; IIa: VDR, GCNF, PR, RAR γ , PPAR δ , ER α , LXR β , PPAR δ 2, NURR1; IIb: MR, RAR β , ERR1, RAR β 1, RAR β 2, PPAR γ 1, PPAR γ 2, PPAR γ). Subjects cluster into three clusters: cluster I, 30 subjects; cluster II, 8 subjects; cluster III, 2 subjects. For both dendrograms, the *y* axis represents the L2 (Euclidean) dissimilarity measure. Abbreviations: ERR, estrogen-related receptor; GR, glucocorticoid receptor; LRH1, liver receptor homolog 1; MR, mineralocorticoid receptor; PR, REV-ERB α - α , nuclear receptor subfamily 1 group D member 1; ROR α , RAR-related orphan receptor alpha; shp, small heterodimer partner.

of NASH). Histologically, 47.5% ($n = 19$) of subjects exhibited zone 1 or 3 borderline NASH or definite NASH; of that subset, 63% ($n = 16$) had zone 3 perisinusoidal and periportal fibrosis or had bridging fibrosis (i.e., fibrosis stages 2-3).

NR EXPRESSION SORTED BY MEDIAN

Boxplots of the 36 NRs illustrate the summary measures (including median and interquartile range) of the distribution of expression of each NR for the 40 patients.

CLUSTER ANALYSES AND HEATMAP

Cluster analysis revealed two superfamilies of NRs that further divided into five individual clusters. Superfamily I NRs consisted of cluster Ia (constitutive androstane receptor [CAR], FXR α , liver receptor

homolog 1), cluster Ib (chicken ovalbumin upstream promoter transcription factor 1 [COUP-TFI], LXR α , TR2, small heterodimer partner, nuclear receptor subfamily 1 group D member 1 [REV-ERB α], RAR α , TR α), and cluster Ic (COUP-TFII, RAR-related orphan receptor alpha, glucocorticoid receptor, retinoid X receptor [RXR] β , pregnane X receptor [PXR], RAR-related orphan receptor gamma, RXR α , PPAR α , TR β). NR cluster Ia receptors were expressed at the lowest level, on average, across the sample. Superfamily II NRs consisted of IIa (VDR, germ cell nuclear factor [GCNF], progesterone receptor, RAR γ , PPAR δ , estrogen receptor alpha [ER α], LXR β , PPAR δ 2, NURR1) and IIb (mineralocorticoid receptor, RAR β , estrogen-related receptor 1, RAR β 1, RAR β 2, PPAR γ 1, PPAR γ 2, PPAR γ 3). NR cluster IIa receptors were expressed at the highest level, on average, across the sample. The degree of the relationship between each NR is designated on the *y* axis of the dendrogram (shorter branch lengths represent greater similarity between the NRs).

TABLE 2. COMPARISON OF NRS BY HISTOLOGIC CHARACTERISTICS SORTED BY DISSIMILARITY MEASURE FROM CLUSTER ANALYSIS

	Steatosis			Ballooning			Lobular Inflammation			Fibrosis			Type of NAFLD		
	<33% (n = 22)	34%+ (n = 18)	P*	None (n = 23)	Any (n = 17)	P*	None/Mild (n = 27)	Mod/Severe (n = 13)	P*	None (n = 12)	Any (n = 28)	P*	Not NASH (n = 21)	NASH (n = 19)	P*
	Median†	Median†	Median†	Median†	Median†	Median†	Median†	Median†	Median†	Median†	Median†	Median†	Median†	Median†	Median†
Cluster IA															
CAR	19.9	19.9	0.91	19.9	19.8	1.00	19.9	19.8	0.26	20.5	19.7	0.02	19.9	19.8	0.46
FXRα	21.8	20.9	0.03	21.5	21.6	1.00	21.7	21.3	0.76	21.2	21.6	0.35	21.7	21.3	0.70
LRH1	21.1	20.4	0.14	20.7	20.9	0.61	20.7	20.6	0.95	20.5	20.8	0.92	20.7	20.7	0.94
Global test			0.06			0.99			0.43			0.02			0.63
Cluster IB															
COUP-TFII	26.6	26.9	0.85	27.2	26.6	0.35	27.0	26.6	0.24	28.6	26.3	0.003	27.2	26.6	0.07
LXRα	27.9	27.6	0.43	27.9	27.9	0.32	27.9	27.9	0.69	28.1	27.4	0.21	27.9	27.9	0.33
TR2	27.6	27.0	0.37	27.5	27.1	0.55	27.5	27.2	0.96	27.9	27.2	0.23	27.5	27.1	0.48
SHP	26.6	27.0	0.61	26.6	27.0	0.88	26.7	27.0	0.93	27.1	26.6	0.42	26.7	26.8	0.60
REV-ERBAα	28.0	27.3	0.85	28.3	27.2	0.08	27.3	27.5	0.74	28.3	27.3	0.17	28.2	27.4	0.34
RARα	26.6	26.5	0.47	27.0	26.4	0.89	26.6	26.4	0.62	27.8	26.1	0.005	27.0	26.4	0.68
TRα	26.0	26.0	0.89	26.1	25.8	0.94	26.0	25.9	0.82	26.7	25.7	0.05	26.0	26.0	0.58
Global test			0.40			0.55			0.56			0.006			0.04
Cluster IC															
COUP-TFII	23.8	23.7	0.37	23.9	23.6	0.43	23.9	23.6	0.26	24.2	23.5	0.06	23.9	23.6	0.12
RORα	25.3	24.6	0.12	25.0	25.0	0.83	25.0	25.2	0.77	24.8	25.1	0.59	25.0	25.2	0.95
GR	25.1	24.7	0.21	24.9	24.8	0.34	24.9	24.6	0.20	24.9	24.9	0.71	24.9	24.8	0.26
RXRβ	25.0	25.0	0.91	24.9	25.2	0.55	25.0	24.8	0.76	25.5	24.7	0.02	25.0	24.9	0.91
PXR	25.2	25.0	0.92	25.7	25.0	0.63	25.7	24.9	0.33	26.2	24.9	0.005	25.7	25.0	0.41
RORγ	25.4	25.5	0.90	25.6	25.4	0.59	25.5	25.0	0.82	26.1	25.2	0.06	25.6	25.4	0.62
RXRα	25.7	25.3	0.28	25.7	25.4	0.30	25.5	26.0	0.60	25.7	25.5	0.72	25.7	25.3	0.32
PPARα	26.1	25.4	0.93	26.0	26.0	0.94	26.1	25.5	0.45	27.2	25.4	0.007	26.1	25.5	0.26
TRβ	26.1	25.3	0.85	26.1	25.4	0.53	26.1	25.3	0.33	27.0	25.7	0.05	26.1	25.3	0.34
Global test			0.14			0.50			0.03			0.09			0.21
Cluster IIA															
VDR	32.0	32.1	0.65	33.0	32.0	0.39	32.9	32.0	0.97	31.9	32.9	0.22	33.0	32.1	0.58
GCNF	31.4	31.8	0.65	31.8	31.7	0.86	33.1	31.3	0.17	33.9	31.4	0.02	32.8	31.5	0.41
PR	32.4	32.6	0.84	32.6	32.6	0.81	32.6	32.5	0.80	33.4	32.2	0.16	32.6	32.5	0.71
RARγ	32.3	31.3	0.54	32.3	31.3	0.20	32.3	31.3	0.15	32.4	31.4	0.20	32.9	30.9	0.02
PPARδ	31.6	31.4	0.85	31.6	31.0	0.20	31.7	30.8	0.08	32.6	31.2	0.006	31.7	30.8	0.06
ERα	31.6	30.9	0.28	31.5	30.9	0.05	31.5	30.7	0.02	32.2	30.9	0.009	31.6	30.9	0.02
LXRβ	30.5	30.8	0.76	30.8	30.5	0.51	30.8	30.5	0.54	31.1	30.5	0.05	30.9	30.5	0.55

(Continued)

TABLE 2. (CONTINUED)

	Steatosis			Ballooning			Lobular Inflammation			Fibrosis		Type of NAFLD			
	<33% (n = 22)	34%+ (n = 18)	P*	None (n = 23)	Any (n = 17)	P*	None/Mild (n = 27)	Mod/Severe (n = 13)	P*	None (n = 12)	Any (n = 28)	P*	Not NASH (n = 21)	NASH (n = 19)	P*
	Median†	Median†		Median†	Median†		Median†	Median†		Median†	Median†		Median†	Median†	
PPAR δ 2	31.2	30.8	0.70	30.7	31.0	0.78	30.9	31.7	0.78	30.9	31.0	0.94	30.9	31.2	0.75
NURR1	31.1	30.7	0.40	31.6	30.6	0.36	31.6	30.6	0.27	33.0	30.9	0.04	31.8	30.6	0.16
Global test			NCS ⁴			0.42			0.18			0.21			0.01
Cluster IIB															
MR	29.7	29.2	0.24	29.4	29.6	0.65	29.6	29.6	0.53	30.1	29.4	0.33	29.6	29.6	0.49
RAR β	29.6	28.4	0.05	29.5	29.0	0.21	29.4	29.0	0.64	29.2	29.4	0.73	29.5	28.3	0.05
ERR1	29.7	29.2	0.50	29.1	29.7	0.48	29.4	29.5	0.90	29.2	29.6	0.86	29.1	29.7	0.91
RAR β 1	30.0	28.4	0.02	30.0	29.1	0.26	30.0	28.7	0.10	31.6	29.1	0.01	30.1	28.7	0.03
RAR β 2	27.8	27.0	0.20	27.9	27.6	0.61	27.9	27.1	0.52	28.7	27.3	0.09	27.9	27.1	0.41
PPAR γ 1	29.6	29.1	0.48	29.0	29.7	0.78	29.6	29.0	0.33	31.8	28.9	0.001	29.7	29.0	0.20
PPAR γ 2	29.2	26.9	0.07	28.3	29.3	0.44	29.3	26.7	0.003	30.8	28.2	0.04	29.1	27.9	0.10
PPAR γ 3	27.3	27.6	0.93	27.1	27.8	0.003	27.6	26.8	0.07	27.5	27.4	0.75	27.4	27.5	0.48
Global test			0.03			0.06			0.09			0.11			0.08

Abbreviations: ERR, estrogen-related receptor; GR, glucocorticoid receptor; LRRH1, liver receptor homolog 1; MR, mineralocorticoid receptor; PR, REV-ERBa- α , nuclear receptor subfamily 1 group D member 1; ROR α , RAR-related orphan receptor alpha; SHP, small heterodimer partner.

*Based on robust linear regression.

†Normalized mRNA levels.

#P values from global test regressing presence of more severe histologic feature on set of NRs in each cluster.

\$Not calculable, regression did not converge.

Cluster analysis of the aggregate mRNA expression profiles for each subject revealed three clusters. Cluster I consisted of the majority of the sample (30 subjects). Cluster II contained 8 subjects, and cluster III contained 2 subjects. Compared to clusters I and II, subject cluster III individuals demonstrated higher expression of all NRs, a trend that was especially pronounced among NR superfamily II receptors. Cluster II subjects demonstrated a higher expression of NR cluster Ic receptors but a markedly lower expression of NR cluster superfamily II receptors.

Demographics, histology, and treatment group did not significantly differ among the three patient clusters

(I, II, III) derived from the cluster analysis (data not shown).

COMPARISON OF NRs BY HISTOLOGIC CHARACTERISTICS SORTED BY THE DISSIMILARITY MEASURE FROM CLUSTER ANALYSIS

Median expression levels of NRs were compared by steatosis grade (<33% versus \geq 33%), hepatocyte ballooning (none versus any), lobular inflammation (none/

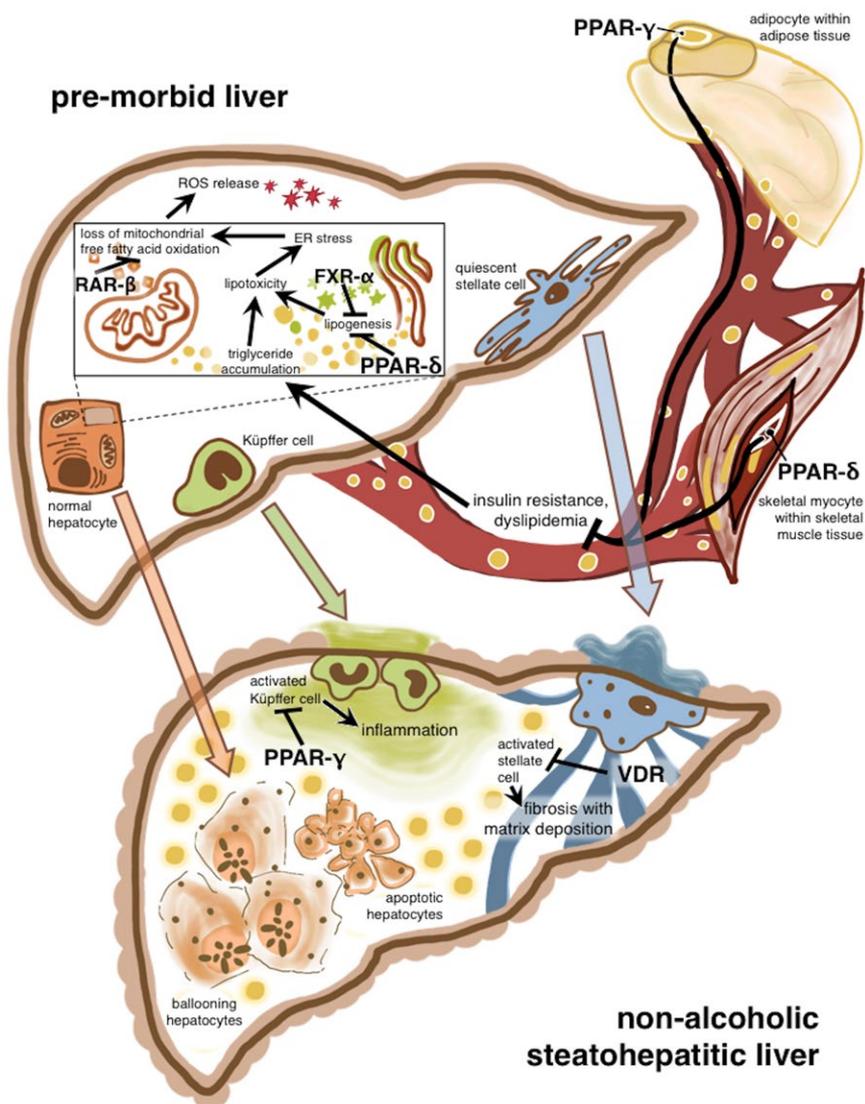


FIG. 3. Theoretical model of NR functions in the development of NASH. NR functions (in the presence of their respective ligands) are potentially protective against the development of NASH. Drugs targeting the pictured PPAR δ , PPAR γ , and FXR α receptors are in trials for the treatment of NASH and the metabolic syndrome. NR–NR heterodimers and interactions are not pictured. (Figure 3 was created by Dr. Nikita Consul, Columbia University College of Physicians and Surgeons, 2017). Abbreviations: ER, endoplasmic reticulum; ROS, reactive oxygen species.

mild versus moderate/severe), fibrosis (none versus any), and type of NAFLD (not NASH versus NASH). In general, differentially expressed NRs exhibited significantly higher expression (i.e., required fewer qPCR cycles to detect, resulting in a numerically smaller normalized expression level) in pathologic states. The relative expression levels with comparative *P* values are listed in Table 2.

Three NRs (FXR α , RAR β , and RAR β 1), located in NR cluster Ia and cluster IIb, were expressed at significantly higher levels in the state of increased steatosis. Further, steatosis grade was significantly different on a global test incorporating a regression of all cluster IIb receptors. Steatosis grade did not significantly associate with any other NRs.

ER α , located in cluster IIa, was expressed at a higher level in the state of “any” versus “no” ballooning. PPAR γ 3, in cluster IIb, however, was expressed at a lower level in the state of any versus no ballooning. PPAR γ 3 was the only NR expressed at a lower level in a pathologic state.

For lobular inflammation, ER α (cluster IIa) and PPAR γ 2 (cluster IIb) were both expressed at higher levels in the state of moderate/severe versus none/mild. The global test of cluster Ic NRs was also significantly different by inflammation severity.

Comparing NR expression by fibrosis status, 12/36 (33%) of all NRs assayed were expressed at significantly higher levels in “any fibrosis” versus “no fibrosis.” These included members from each cluster: the PPARs (PPAR α , PPAR γ 1, PPAR γ 2, and PPAR δ), two RAR isoforms (RAR β 1 and RAR α), two endobiotic/xenobiotic sensors (CAR and PXR), two TRs (TR α and TR β), and two orphan receptors (COUP-TF1 and NURR1). The global test of cluster Ib NRs was significantly different by fibrosis status.

Comparing the state of NASH versus not NASH overall, the RARs (RAR γ [cluster 4], RAR β 1, RAR γ [both cluster IIb]) demonstrated higher expression in the state of NASH versus not NASH. The global tests of cluster Ib and cluster IIa were also significantly different by NASH status.

Discussion

In this study, we stratified 40 pediatric subjects with NAFLD (at time of enrollment) by histologic NAFLD severity to evaluate the differential expression of 36 NRs in liver biopsy tissue taken at the end of treatment from a clinical trial. Although expression levels of

NRs may vary based on sex, age/pubertal status,⁽²²⁾ and race/ethnicity, the not NASH and borderline/definite NASH samples were roughly balanced with respect to these features (Table 1).

The discovery that certain NRs are differentially expressed in NASH (versus NAFLD that is not NASH) and in more severe histologic states provides a mechanistic link between the metabolic derangements of NASH and recognized features of liver histology. These findings support the ongoing development of therapeutic NR ligands and may suggest other unexplored therapeutic targets. To our knowledge, no study has quantified normalized expression of hepatic NRs in pediatric NAFLD/NASH.

Cluster analysis groups genes with similar patterns of expression and, in the case of NRs, may suggest the presence of shared transcriptional drivers.⁽¹³⁾ Cluster analysis is an exploratory technique aimed at generating (rather than testing) hypotheses. Research using this tool often reveals clusters of genes of related functionality.⁽²³⁾ Encouragingly, the functions of individual NR clusters reported here share significant overlap with the “nuclear receptor ring of physiology” clusters of Bookout et al.⁽¹³⁾

As predicted based on the known pathophysiology of NAFLD, both cluster I and cluster II contained NRs with expression that correlated with more severe histologic features. Overall, receptors in cluster II were expressed at higher levels and with more variability between subjects, suggesting a principal role for these NRs in the pathogenesis of pediatric NAFLD. Both cluster I and cluster II contained NRs that are currently under investigation as drug targets or have already been exploited pharmacologically, including PPAR α / δ / γ and FXR α . Other receptors, such as ER α , RAR γ / α / β / β 1, and TR α / β , are not yet established as drug targets in NASH but have long been recognized as key modulators of liver disease. The functions of several NRs known to be protective against the development of NASH are shown in Fig. 3. The remaining NRs that demonstrated differential expression by histology (CAR, PXR, COUP-TF1, GCNF, NURR1) are not well characterized and potentially represent new therapeutic targets.

We found that several NRs are expressed at higher levels in more severe histologic states. It is possible that, as in other biologic systems of negative feedback, the presence of an NR ligand (whether endogenous or as a pharmaceutical agent) acts as a transcriptional repressor of the receptor itself to maintain homeostasis. For example, negative feedback is a key aspect of

the well-characterized FXR α /bile acid transcriptional cascade.⁽²⁴⁾ Negative feedback would account for our finding that differentially expressed NRs have higher expression with more histologically severe disease, i.e., the up-regulated receptors may be partially compensating for reduced levels of circulating endogenous ligand.

FXR α , in cluster Ia, is a key regulator of the gut–liver–adipose axis and is responsible for initiating systemic responses to the fed state.⁽¹⁶⁾ When activated, FXR α induces hundreds of genes throughout the body that mediate nutrient acquisition and distribution (e.g., fibroblast growth factor 19, PPAR α) and inhibit hepatic lipogenesis (e.g., sterol regulatory element-binding transcription factor 1c).⁽²⁵⁾ Phase 3 trials of OCA, a synthetic FXR α agonist, are underway following the recent publication of the Farnesoid X Receptor Ligand OCA in NASH Treatment (FLINT) trial, which reported that OCA administration improved lobular inflammation, steatosis, fibrosis, and steatosis but did not affect the diagnosis of NASH.⁽²⁶⁾ Building on this trial, we report an association between higher levels of steatosis and higher levels of FXR α but no difference in FXR α levels with NASH diagnosis. FXR α directly induces PPAR α and PPAR γ , linking the cluster I and cluster II NRs.

The PPARs are the only other NRs with agonists undergoing phase 3 trials for treatment of NASH. By targeting multiple PPAR isoforms, the drugs currently on trial for treatment of adult NASH aim to harness the diverse metabolic and anti-inflammatory effects of this NR class. For example, elafibranor and pioglitazone, each agonists of two PPAR isoforms, are being tested for NASH treatment in adults.^(27,28) In sum, our findings support the current understanding of PPARs as not only linchpins in lipid and glucose metabolism but also anti-inflammatory and antifibrotic regulators and suggest that pharmacologic targeting of all three isoforms is likely to be effective in pediatric NASH.

Humans express three largely homologous PPAR isoforms (PPAR α , PPAR δ , and PPAR γ), each with multiple tissue-dependent subisoforms driven by alternative splicing or differential promoters (e.g., PPAR γ 1, PPAR γ 2, PPAR γ 3). The PPARs are lipid sensors that bind specific fatty acids. Adding to the evidence supporting the distinct but related roles of each PPAR isoform, we report that PPAR α , PPAR δ , and PPAR γ each cluster with different groups of genes but that expression of each isoform is elevated in states of increased fibrosis. Our findings contradict Francque et al.'s recent report of decreased PPAR α expression

with worsened fibrosis among adults with NASH,⁽²⁹⁾ perhaps suggesting a different mechanism for pediatric versus adult NASH or differences between populations studied (primarily Hispanic in this study).

The three subisoforms of PPAR γ are distributed into cluster IIb. In addition to its roles in adipocyte development and lipid metabolism, PPAR γ is also strongly associated with monocytes and other cells of the immune system where it exerts a potent anti-inflammatory effect by inhibiting production of tumor necrosis factor alpha.^(30,31) Supporting this role, we found higher expression of PPAR γ 2 associated with increased lobular inflammation. Overall, our findings of altered PPAR γ expression across multiple histologic domains suggest that PPAR γ plays an important role in linking adipocyte and monocyte function and adds to the burgeoning evidence connecting NAFLD with systemic inflammation.

Finally, PPAR δ is ubiquitous throughout nearly all tissues. In hepatocytes, it inhibits the expression of lipogenic genes (e.g., fatty acid synthase and acetyl coenzyme A decarboxylase). Although it was the last PPAR for which a synthetic ligand was discovered, its increasingly recognized role in preventing insulin resistance, hypertriglyceridemia, and immune overactivation has led to excitement about its potential as a treatment for NASH.⁽²⁹⁾ Although PPAR δ has an important metabolic role, its position in cluster II near several immunomodulatory NRs suggests its anti-inflammatory properties are also salient.

We also report differential expression of the receptors for estrogen, thyroid hormone, and vitamin A, known modulators of NASH. Estrogen is an *in vitro* antifibrotic agent, as confirmed by several epidemiologic lines of evidence.⁽³²⁾ Given this knowledge, it is not surprising that ER is increased (and possibly therefore estrogen is decreased) in the livers with more ballooning, lobular inflammation, fibrosis, and NASH diagnosis. RAR, the receptor for vitamin A, drives cellular differentiation and regulates mitochondrial and peroxisome oxidation of fatty acids. Animal models support the role of the RAR family of transcription factors in NASH; transgenic mice expressing a dominant negative RAR α in hepatocytes are used as an animal model for NASH and hepatocellular carcinoma.⁽³³⁾ Thyroid hormone is a crucial driver of metabolism; hypothyroidism results in insulin resistance and increased circulating low-density lipoproteins and triglycerides, factors that predispose to the development of NAFLD.⁽³⁴⁾ Indeed, the prevalence of hypothyroidism among adults with NASH is twice

that of healthy controls.⁽³⁵⁾ Consequently, it was not surprising that both isoforms of TR localized to cluster I (near several metabolism-related NRs) and that higher expression of both TR α and TR β was associated with fibrosis. RXR β , which heterodimerizes with RAR, thyroid hormone, and VDR and is therefore at the center of many NR pathways, was also found to be elevated in states of fibrosis.

In this study, fibrosis was the histologic characteristic that was discriminated by the largest number of NRs. In addition to the PPARs, ERs, RAR/RXR, and TRs discussed above, CAR, PXR, GCNF, and COUP-TF1 and NURR1 were also found to be expressed at significantly higher levels in the setting of any versus no fibrosis. Because fibrosis is the only histologic feature that associates with long-term outcomes of adult NAFLD patients,⁽³⁶⁾ therapeutic modulation of these receptors may have important clinical implications.

Finally, we found higher NURR1, GCNF, and COUP-TF1 expression in the setting of fibrosis. The natural ligands of these orphan receptors are unknown, and their role in NAFLD remains similarly undescribed. COUP-TF1 is at the center of several complex cross-regulatory circuits of NRs, including FXR α , RXR, and PPAR γ , during liver development and possibly beyond.⁽³⁷⁾ Understanding crosstalk between the NR pathways described above will necessitate a more complete characterization of NURR1 and COUP-TF1 and may lead to clinically meaningful discoveries.

The intricate regulation of NRs accounts for their exquisite ability to sense and respond to dynamic hormonal and nutritional cues across multiple organ systems in a coordinated fashion. However, their pleiotropic nature also increases the challenge of designing and using NR modulators for therapy. As an illustration of this challenge, recent clinical trials of NR agonists in biopsy-proven NASH (i.e., FLINT; Pioglitazone, Vitamin E, or Placebo for Nonalcoholic Steatohepatitis [PIVENS]; and GOLDEN-505) demonstrated paradoxical and unexpected decoupling of histologic features (including steatosis, inflammation, and fibrosis) and metabolic effects (including insulin resistance, dyslipidemia, and weight gain).⁽³⁸⁾

This study is the first to quantify hepatic NR expression in a cohort of children with NAFLD, a population at greatest risk for poor long-term outcomes. Strengths of this study include the novelty of the population, consensus and blinded review of liver biopsies by NASH CRN pathologists, and the range of histologic severity in the subject biopsies. The use

of cluster analysis is also novel. This tool is not only an emerging methodology in systems biology (itself a key framework for understanding the overarching network of the NR superfamily) but could lead to the identification of subtypes of NAFLD that respond differently to therapeutic interventions.

Limitations of this study include the subject sample size and the inherent restrictions of liver biopsy. Liver biopsy represents a sample of mixed cell populations. NR profile variability may thus represent variability between cell types rather than reflecting true pathologic differences.⁽³⁹⁾ Additionally, this study characterized the NR expression in liver tissue while many NRs are enriched in and exert their primary effects in other tissues. Because this study aimed to characterize the expression profiles of all known hepatic NRs in a discovery cohort, $P < 0.05$ is liberal given the multiple comparisons and should be taken in the context of the multiple NR comparisons evaluated. The preliminary findings of this paper should thus be evaluated in prospective future studies that can also quantify the expression of NR target genes.

Most importantly, the sample size excluded the ability to analyze by treatment group, with potential obfuscation of effects related to treatment effects of vitamin E or metformin. Because vitamin E has been reported to activate PXR⁽⁴⁰⁾ and metformin has been reported to affect the expression of several other NRs, including CAR, small heterodimer partner, and TR4,⁽⁴¹⁾ the use of end-of-treatment biopsies represents a major limitation of this study; thus, these preliminary results should be interpreted with caution. Finally, the study reports on the histology and NR profiles of posttreatment biopsies, although it is possible that treatment itself altered NR profiles compared to untreated individuals with the same histology.

The association of differential NR expression patterns with pediatric NAFLD of varying histologic severity is a novel finding. NRs are the transcriptional key at the center of the gut–liver–adipose axis. Their integrated actions coordinate metabolism, immune function, and cellular activation and differentiation, processes that become dysregulated in NAFLD and NASH. NRs found to be variably expressed in this study correspond to previously recognized therapeutic targets of drugs for NAFLD and the metabolic syndrome that are being investigated in preclinical development through phase 3 trials. Ongoing efforts to identify the ligands for remaining orphan receptors and the development of ligands that specifically target

hepatic or adipose NRs show promise in the treatment of NASH.

Acknowledgment: Members of the NASH CRN are listed in the Supporting Material.

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Supporting Information

Additional Supporting Information may be found at onlinelibrary.wiley.com/doi/10.1002/hep4.1232/full.