

# Adjuvant-induced Human Monocyte Secretome Profiles Reveal Adjuvant- and Age-specific Protein Signatures\*

Djin-Ye Ohद¶¶<sup>a,b</sup>, David J. Dowling‡§¶¶, Saima Ahmed||, Hyungwon Choi\*\*, Spencer Brightman‡, Ilana Bergelson‡, Sebastian T. Berger||, John F. Sauld||, Matthew Pettengill‡§<sup>a</sup>, Alvin T. Kho‡‡, Henry J. Pollack¶, Hanno Steen||||||<sup>a</sup>, and Ofer Levy‡§§§|||<sup>a</sup>

Adjuvants boost vaccine responses, enhancing protective immunity against infections that are most common among the very young. Many adjuvants activate innate immunity, some via Toll-Like Receptors (TLRs), whose activities varies with age. Accordingly, characterization of age-specific adjuvant-induced immune responses may inform rational adjuvant design targeting vulnerable populations. In this study, we employed proteomics to characterize the adjuvant-induced changes of secretomes from human newborn and adult monocytes in response to Alum, the most commonly used adjuvant in licensed vaccines; Monophosphoryl Lipid A (MPLA), a TLR4-activating adjuvant component of a licensed Human Papilloma Virus vaccine; and R848 an imidazoquinoline TLR7/8 agonist that is a candidate adjuvant for early life vaccines. Monocytes were incubated in vitro for 24 h with vehicle, Alum, MPLA, or R848 and supernatants collected for proteomic analysis employing liquid chromatography-mass spectrometry (LC-MS) (data available via ProteomeXchange, ID PXD003534). 1894 non-redundant proteins were identified, of which  $\sim$ 30 - 40% were common to all treatment conditions and ~5% were treatment-specific. Adjuvant-

 ${}^{\varkappa}$  Author's Choice—Final version free via Creative Commons CC-BY license.

Received October 14, 2015, and in revised form, February 4, 2016 Published, MCP Papers in Press, March 1, 2016, DOI 10.1074/mcp.M115.055541

Author contributions: D.O., D.J.D., H.S., and O.L. designed research; D.O., D.J.D., S.A., S.B., I.B., J.F.S., and M.P. performed research; H.C. and S.T.B. contributed new reagents or analytic tools; D.O., D.J.D., S.T.B., and A.T.K. analyzed data; D.O., D.J.D., H.S., and O.L. wrote the paper; H.J.P. provided expert imput. stimulated secretome profiles, as identified by cluster analyses of over-represented proteins, varied with age and adjuvant type. Adjuvants, especially Alum, activated multiple innate immune pathways as assessed by functional enrichment analyses. Release of lactoferrin, pentraxin 3, and matrix metalloproteinase-9 was confirmed in newborn and adult whole blood and blood monocytes stimulated with adjuvants alone or adjuvanted licensed vaccines with distinct clinical reactogenicity profiles. MPLA-induced adult monocyte secretome profiles correlated in silico with transcriptome profiles induced in adults immunized with the MPLA-adjuvanted RTS,S malaria vaccine (Mosquirix<sup>™</sup>). Overall, adjuvants such as Alum, MPLA and R848 give rise to distinct and age-specific monocyte secretome profiles, paralleling responses to adjuvant-containing vaccines in vivo. Age-specific in vitro modeling coupled with proteomics may provide fresh insight into the ontogeny of adjuvant action thereby informing targeted adjuvanted vaccine development for distinct age groups. Molecular & Cellular Proteomics 15: 10.1074/mcp.M115.055541, 1877-1894, 2016.

Infections cause enormous morbidity and mortality worldwide, especially among those at the extremes of life, newborns and the elderly. Immunization is one of the most cost effective interventions to reduce infectious diseases but the efficacy of many vaccines varies with age with suboptimal vaccine responses especially common in the young and elderly, who display distinct immune system function (1, 2). Adjuvants enhance the quantity and shape the quality of vaccine-induced immune protection. Most current adjuvanted vaccines have been developed empirically, formulating antigen with adjuvants, such as aluminum salts or oil-in water emulsions, whose mode of action, especially in different age groups, is incompletely elucidated (3, 4). One approach to increase vaccine immunogenicity in these vulnerable populations is to use and develop adjuvants that are particularly effective in overcoming age-specific limitations in immune system function (5-7). Characterization of adjuvant action in

From the ‡Department of Medicine, Division of Infectious Diseases, Boston Children's Hospital and §Harvard Medical School, Boston, Massachusetts; ¶Division of Pediatric Infectious Diseases, New York University Medical School, New York; ||Department of Pathology, Boston Children's Hospital and Harvard Medical School, Boston, Massachusetts; \*\*Saw Swee Hock School of Public Health, National University of Singapore, Singapore; ‡‡Children's Hospital Informatics Program, Boston Children's Hospital and Harvard Medical School, Boston, Massachusetts; <sup>a</sup>Precision Vaccines Program, Division of Infectious Diseases, Boston Children's Hospital, Boston, Massachusetts

different age groups may inform more rational adjuvant design.

Adjuvant activity can be age-dependent (8, 9). Responses to Alum, the most commonly used vaccine adjuvant (10, 11), vary with age (8, 9). When tested in whole blood cultures *in vitro*, Alum induces greater cytokine production (e.g. IL-1 $\beta$ and CXCL8) from newborn than adult leukocytes (12). Moreover, the age at which Alum-adjuvanted Pneumococcal conjugate vaccine is given affects subsequent innate immune polarization such that subsequent *Toll*-Like Receptor (TLR)<sup>1</sup>mediated cytokine responses are altered (13). Given the extensive use of Alum as an adjuvant (10, 11), it is important to better characterize its age-specific actions.

The characterization of TLRs and other pattern recognition receptors (PRRs) linking innate and adaptive immunity has informed rational adjuvant design, with multiple PRR agonists in development as vaccine adjuvants (6, 14). The first welldefined TLR agonist (TLRA) to be incorporated into a licensed vaccine was monophosphoryl lipid A (MPLA; TLR4A), a lowtoxicity lipopolysaccharide (LPS) derivative that is a component of the licensed human papilloma virus (HPV) and certain hepatitis B vaccine (HBV) formulations (15-17). Agonists of TLR3, -4, -5, -7/8 and -9 are currently in preclinical and clinical development, but TLR-mediated immune responses are often distinct at the extremes of age (2, 14). For example, when compared with their adult counterparts in vitro, human newborn and infant leukocytes demonstrate reduced Th1-polarizing cytokine induction in response to most TLRAs, including the TLR4As LPS and MPLA (2). For this reason, we choose to study human monocytes, leukocytes with antigen-presenting properties that are key players in the vaccine-induced immune response (18, 19). Adjuvants act via PRRs that mediate monocyte activation, triggering subsequent immune responses in vitro (18, 20, 21) and in vivo (22).

Rational adjuvant design aims to maximize a vaccine's safety and efficacy profiles, inducing an optimal protective immune response without provoking short- or long-term adverse effects. Little is known regarding the global molecular impact of adjuvants and adjuvanted vaccines in early life (23). To this end, a detailed and comprehensive understanding of adjuvant action in special target populations as compared with healthy middle aged adults is of scientific and translational interest (1). For example, TLR8As such as the imidazoquinoline R848 (TLR7/8A), can induce adult-like Th cytokine induction and co-stimulatory molecule expression in neonatal leukocytes suggesting they may be promising candidate neonatal vaccine adjuvants (18, 24-26). For novel adjuvants, a practical approach to characterize adjuvant-induced responses employs in vitro human cell systems that model the immune response (21, 26-28), and may inform subsequent adjuvant selection for in vivo studies.

Systems-scale transcriptomic approaches have increasingly been employed to examine the global immune response to adjuvanted vaccines, raising novel hypotheses regarding mechanisms of adjuvant action (29, 30) and revealing vaccine-specific molecular signatures that may predict vaccine responses (31–34). However, alterations observed in the global gene expression profiles may not necessarily correspond closely to adjuvant-induced changes on protein level (35, 36). Moreover, to date these studies have not taken into account age, even though the majorities of infection-induced mortality and of global immunization schedules are focused on newborns and infants.

The study of protein secretion in in vitro systems has largely depended on targeted detection methods, including measurement of cytokine production, limited by the specificity and availability of antibodies. Quantitative high-resolution mass spectrometry has been recently applied to characterize the secreted proteomes (secretomes) of murine antigen-presenting cells in a comprehensive manner (37). To gain fresh insights into the potential age-specific action of established and candidate adjuvants, we assessed the effect of treatment with Alum or the TLRAs MPLA or R848 on the secretomes of primary human monocytes. We found that (1) adjuvant-induced monocyte secretomes varied by adjuvant and age, (2) that adjuvants induce distinct innate immune pathways, (3) that protein biomarkers defined by this approach were confirmed in adjuvant and licensed adjuvanted vaccine-stimulated whole blood assays in vitro as well as in (4) publicly available data sets of individuals receiving a novel adjuvanted vaccine in vivo. Our observations provide fresh insight into adjuvant action and suggest a novel paradigm for characterizing age-specific adjuvant effects in vitro in relation to their effects in vivo.

### EXPERIMENTAL PROCEDURES

Ethics Statement-All experiments were conducted in accordance with relevant institutional and national guidelines, regulations and

<sup>&</sup>lt;sup>1</sup> The abbreviations used are: TLR, *Toll*-like receptor; AAHS, Amorphous aluminum hydroxyphosphate sulfate; Adju-Phos, Aluminum phosphate; Alum, Aluminum phosphate, Al (PO<sub>4</sub>)<sub>3</sub>, (Adju-Phos); APC, Antigen-presenting cell; CBMCs, Cord blood mononuclear cells; CD, Cluster of differentiation; DAMPs, Danger-associated molecular patterns; DMEM, Dulbecco's Modified Eagle Medium; DTT, dithiothreitol; ELISA, Enzyme-linked immunosorbent assay; EU, Endotoxin unit; FDR, False discovery rate; HCD, Higher-energy collisional dissociation; HPLC, High-performance liquid chromatography; HPV, Human papilloma virus; IL, Interleukin; IMQ, Imidazoguinoline; IPA, Ingenuity Pathway Analysis; LAL, Limulus amoebocyte lysate; LC-MS/MS, liquid chromatography coupled with tandem mass spectrometry; LPS, Lipopolysaccharide; LTF, Lactoferrin; m/z, Mass-to-charge ratio; MFI, Mean fluorescent intensity; MGF, Mascot Generic Files; MMP, Matrix metalloproteinase; Mos, Monocytes; MPLA, Monophosphoryl Lipid A; ms, Millisecond; PBMCs, Peripheral blood mononuclear cells; ppm, parts per million; PRRs, pattern recognition receptors; PTX, Pentraxin; RPMI, Roswell Park Memorial Institute Medium; SDS-PAGE, Sodium dodecyl sulfate polyacrylamide gel electrophoresis; SpC, Spectral count; TLRA, Toll-like receptor agonist; TNF, Tumor necrosis factor; WBA, Whole blood assay.

approvals. Cord blood samples were collected and de-identified with approval from the Ethics Committee of The Brigham & Women's Hospital, Boston, MA (protocol number 2000-P-000117) and Beth Israel Deaconess Medical Center Boston, MA (protocol number 2011P-000118). Blood from adult donors was obtained after written informed consent with approval from the Ethics Committee of Boston Children's Hospital; Boston, MA (protocol number X07–05-0223).

TLR Agonists, Adjuvants, Licensed Vaccines, and Assay Reagents—TLRAs included MPLA (TLR4), R848 (TLR7/8), and were obtained from InvivoGen (San Diego, CA). Adju-Phos (Al (PO<sub>4</sub>)<sub>3</sub>) was from The Statens Serum Institut (Copenhagen, Denmark) (Table I). TLRAs (other than MPLA) were verified to be endotoxin-free (< 1 EU/ml) as measured by the *Limulus* amebocyte lysate (LAL) assay per the manufacturer's instructions (Charles River; Wilmington, MA). Licensed adjuvanted vaccines were obtained from manufacturers as listed in Table II.

Monocyte Isolation and In Vitro Stimulation Assay-Peripheral blood was collected from healthy adult volunteers, whereas human newborn cord blood was collected immediately after Cesarean section delivery of the placenta. Placentas from HIV-positive mothers were excluded. Blood was anti-coagulated with 15-20 units/ml pyrogen-free sodium heparin (American Pharmaceutical Partners, Inc.; Schaumberg, IL), kept at room temperature and processed within 4 h of collection. Cord blood mononuclear cells (CBMC) or peripheral blood mononuclear cells (PBMC) were obtained after centrifugation over Ficoll-Hypaque gradients (Ficoll-Paque PREMIUM, GE Healthcare; Waukesha, WI). Monocytes were isolated from mononuclear cell fractions by positive selection with magnetic microbeads according to the manufacturer's instructions (Miltenyi Biotec; Auburn, CA) using CD14 as a pan-marker for monocytes (38). Monocyte preparations were verified to be > 95% CD14 positive as assessed by flow cytometry for CD14 with fluorophore-labeled antibodies (FITC, BD Biosciences) as previously described (39). For secretomic studies, isolated monocytes were cultured in tissue culture dishes at  $4 \times 10^{6}$ cells/ml in high glucose Dulbecco's Modified Eagle Medium (DMEM, Life Technologies; Grand Island, NY) supplemented with non-essential amino acids solution (Life Technologies) in the presence of sterile medium (negative control), Alum (5 µg/ml), MPLA (100, 1000 ng/ml), or R848 (5, 50 µM). For targeted protein confirmation assays, monocytes were cultured in 96-well tissue round bottom culture dishes at  $1 \times 10^{6}$  cells/ml in either RPMI supplemented with 10% platelet poor plasma. Monocytes were then incubated at 37 °C, 5% CO<sub>2</sub> with or without adjuvants for 18 h.

Supernatant Sample Preparation for Secretome Analysis—Conditioned culture media samples were collected after 18 h of incubation, centrifuged for 5 min at 500 × g, 4 °C and the resulting supernatant transferred to a new micro-tube before storage at -80 °C until further use. Upon thawing, proteins were precipitated from the supernatants using trichloroacetic acid and prepared for LC-MS analysis. Concentrated protein samples were reduced with dithiothreitol (DTT) and alkylated with acrylamide before they were applied to 12% gradient gels for sodium dodecyl sulfate polyacrylamide gel electrophoresis (SDS-PAGE) (NuPage; Invitrogen, NY). After staining with Coomassie Blue (SimplyBlue Safestain; Invitrogen), the gel lanes were excised and subjected to in-gel tryptic digestion. Gel pieces were destained in ammonium bicarbonate and acetonitrile, dehydrated in acetonitrile, and dried using a SpeedVac. Finally, samples were digested overnight with 12 ng/µl trypsin at room temperature.

*LC-MS Analysis*—Peptides were analyzed on a nanoflow ultrahighperformance liquid chromatography (UPLC) system (Eksigent/Sciex; Framingham, MA) hyphenated with a quadrupole-Orbitrap mass spectrometer (Q Exactive; Thermo Scientific; San Jose, CA). Peptides were loaded onto an in-house packed 100  $\mu$ m i.d.  $\times$  15 cm C18 column (Magic C18, 5  $\mu$ m, 200Å; Michrom Bioresource; Auburn, CA) and separated at 400 nl/min (linear gradients from 5 to 35% acetonitrile in 0.2% formic acid). Full MS scans were obtained in an Orbitrap mass analyzer over m/z 350-2000 range with resolution 70,000 (m/z 200) and a target value of  $3 \times 10^6$ . The 10 most intense peaks (charge state  $\geq$  2) were fragmented in the higher-energy collisional dissociation (HCD) collision cell at normalized collision energy of 27%, and tandem mass spectrum was acquired in the Orbitrap mass analyzer with resolution 17500 at m/z 200 and a target value of 2 imes $10^5$ . The ion selection threshold was  $1.7 \times 10^3$ , the maximum allowed ion accumulation times were 20 millisecond (ms) for full MS scans and 120 ms for tandem mass spectrum. For each MS run, RAW files, generated using XCalibur software (version 2.2; Thermo Scientific), were converted to Mascot Generic Files (MGF) through an in-house script, extracting the 200 most intense fragment ions for each MS/MS spectrum. The mass spectrometry proteomics data have been deposited to the ProteomeXchange Consortium (40) via the PRIDE partner repository with the data set identifier PXD003534 and 10.6019/PXD003534.

Protein Identification-All peak list files (MGFs) were analyzed using the Mascot (Matrix Science; London, UK; version 2.3.02) and X!Tandem search engines (The GPM, thegpm.org; version CYCLONE (2010.12.01.1)). Mascot was configured to search the Uniprot human sequence database (35,806 entries as of May 2011), assuming the digestion enzyme trypsin with one missed cleavage allowed. Searches were conducted with fixed modification for carbamidomethyl; variable methionine oxidation and variable pyroGlu formation (from N-terminal Glu and Gln); monoisotopic mass with peptide precursor mass tolerance of 10 parts per million (ppm); MS/MS ion mass tolerance of 0.02 Dalton (Da). X!Tandem was set up to search a subset of Uniprot human sequence database, also assuming trypsin, allowing for up to two missed cleavages; a fragment ion mass tolerance of 0.02 Da and a parent ion tolerance of 10.0 ppm; Carbamidomethyl of cysteine was specified as a fixed, and Glu->pyro-Glu of the N terminus, GIn->pyro-Glu of the N terminus, ammonia-loss of the N terminus, and methionine oxidation were specified in X!Tandem as variable modifications. Scaffold (Proteome Software Inc., Portland, OR; version 4.2.1) was used to combine the MS/MS-based peptide and protein identifications. Peptide identifications were accepted at a false discovery rate (FDR) < 1%. Peptide probabilities from X!Tandem were assigned by the Scaffold Local FDR algorithm. Protein identifications were accepted if they could be established at > 95% probability to achieve an FDR <1% and contained at least one identified peptide. Of note: for several downstream data analyses steps, only proteins identified by 2 or more peptides were considered (see below). Protein probabilities were assigned by the Protein Prophet algorithm (41). Proteins that contained similar peptides and could not be differentiated based on MS/MS analysis alone were grouped to satisfy the principles of parsimony. Proteins sharing significant peptide evidence were grouped into clusters. Next, a Scaffold output file was generated, containing exclusive unique spectral counts (termed raw spectral counts hereafter) for each identified protein per biological sample.

Bioinformatics and Hierarchical Cluster Analysis—Proteomic data underwent hierarchical cluster analysis, using PermutMatrix, a software packet originally designed for gene expression analysis (http:// www.lirmm.fr/caraux/PermutMatrix/EN/index.html) (42), that has subsequently been validated for proteomics (43, 44). Briefly, relative label-free protein quantification analysis was performed based on unique spectral counts (SpCs), which were obtained using the Scaffold 4.2.1 software. Not all proteins were identified in all samples. For visualization, comparison and data analysis purposes, proteins with missing SpC values in one sample were imputed with a SpC value of 0.5 (corresponding to each data set's half minimum SpC), thus avoiding division by zero and preventing overestimation of fold changes. For each sample, raw SpC were normalized by multiplication with the ratio of maximum total SpC and the sample's total SpC. Fold change was calculated by dividing the normalized SpC from each treated condition with that of the corresponding untreated adult or newborn condition. Cluster analysis was restricted to proteins identified by  $\geq 2$  spectra and in at least two biological samples, which showed an adjuvant-induced fold change  $\geq 2$  in more than half of the biological replicates of the same treatment condition. For each protein, average log2-transformed fold changes observed under one treatment condition were imported into PermutMatrix and Z score-transformed for normalization. Then two-way clustering analysis was carried out using the Pearson and Ward's minimum variance methods for distance and aggregation, resulting in dendograms that display treatment conditions on the horizontal and protein names on the vertical axis.

Label-free Protein Quantification and Analysis of Differential Protein Expression-Protein expression in differentially stimulated primary human monocytes was compared based on length-normalized SpC, which were determined using the Scaffold 4.2.1 software (as outlined above). Based on results of a small pilot study (n = 3) using multiple replicates ( $\sim$  3) of the adjuvants tested, which indicated that singlet samples were representative, one Scaffold file was generated containing all SpCs for each of the 6 individual adult and 7 individual newborn monocyte singlet samples treated with different adjuvants. Multiple isoforms underwent quantification only if they were classified as individual entries (with distinct gene names) by Scaffold. Proteins enriched after adjuvant treatment but not medium treatment were identified employing a customized version of the model-based statistical analysis tool QSpec based on SpC, using the count data model with paired design option and normalization by the total number of SpC in each sample replicate (45). Proteins with QSpec's new significance score (Z-statistic) above the threshold associated with 5% FDR underwent further evaluation (46).

Content Analysis – Secretome data were further analyzed using Ingenuity Pathway Analysis (IPA) (Ingenuity® Systems, www.ingenuity. com). Canonical pathways analysis identified the pathways from the IPA library of canonical pathways that were most significant to each secretome induced in neonates and adults by Alum, MPLA and R848. Identified proteins that i) met the FDR cutoff of 5% and ii) were associated with a canonical pathway in the Ingenuity Knowledge Base were considered for the analysis. The significance of the association between the data set and the canonical pathway was measured using Fisher's exact test, which calculates the probability that the overlap between the genes in the data set and the canonical pathway is explained by chance alone. The Odds Ratio for the overlap was calculated for each significantly up-regulated pathway.

Whole Blood Assay (WBA)-Adjuvant and vaccine activity in whole blood (WB) was assessed by adapting previously described methodologies (24, 47). Briefly, heparinized neonatal cord blood or adult whole blood, obtained from different study participants than those providing blood for the monocyte stimulation assays, was mixed 1:1 with sterile pre-warmed (37 °C) RPMI 1640 medium (Invitrogen) and cultured in 96-well U-bottom plates (Becton Dickinson, Franklin Lakes, NJ) in the presence of adjuvants (Alum [0.5, 5 and 50  $\mu$ g/ml]; MPLA [1, 10, 100 and 1000 ng/ml]; R848 [0.5, 5 and 50  $\mu$ M]) or the vaccines listed in Table II (final dilutions 1:10, 1:100 and 1:1000). Suspensions containing 200 µl/well were gently mixed several times by pipetting and incubated for 6 h, 37 °C in a humidified incubator at 5% CO<sub>2</sub>. After culture, plates were centrifuged at 500  $\times$  g and 110–150  $\mu$ l of supernatant was removed by pipetting without disturbing the cell pellet. Supernatants were assayed by ELISA to quantify concentrations of Lactoferrin (LTF; Hycult Biotech, Uden, The Netherlands), Pentraxin 3 (PTX-3; R&D Systems, Minneapolis, MN), matrix metalloproteinase 9 (MMP-9; R&D Systems), TNF (BD Biosciences), IL-1 $\beta$  (eBiosciences, San Diego, CA) and by competitive EIA for

Prostaglandin  $E_2$  (PGE<sub>2</sub>; Cayman Chemical, Ann Arbor, MI). Adenosine deaminase-2 (ADA2) activity in whole blood assay supernatants was determined using a chromogenic enzyme activity assay (Diazyme Laboratories, Poway, CA), run in duplicate in the presence of erythro-9-(2-hydroxy-3-nonyl)-

adenine (EHNA; 20  $\mu$ M) to inhibit ADA-1 activity. ADA2 is not EHNAsensitive; thus, activity in the presence of EHNA reflects ADA2 activity (48).

Extrapolation of the Adjuvant-Induced Monocyte Secretome Data Set to an Adjuvanted-Vaccine-Induced PBMC Transcriptome Data Set-Each protein present in the adjuvant-induced monocyte secretomes was quantified based on spectral count data, using QSpec as described above. Changes relative to the secretomes of mediumtreated controls were considered statistically significant based on Z-statistics corresponding to an FDR < 5%. PBMC transcriptome profiles (49) of 24 adults vaccinated with the MPLA adjuvant-containing Mosquirix™ Malaria vaccine RTS,S/AS01 (dispersed lipid vesicles containing MPLA and saponin) or the similar formulation RTS,S/AS02 (an oil-in-water preparation containing MPLA and saponin), measured at four different time points (T1 = 0 h, T2 = 24 h, T3 = 48 h, T4 = 14 days post third vaccine dose), and publicly available at http:// www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE18323, were analyzed for changes in gene expression after immunization (50). GSE18323 was Robust Multi-array Average (RMA) quantile normalized (51) for all 11 vaccine-protected and 13 non-protected study participant transcriptome profiles at 4 time points (T1 - T4). Paired (by participant) nonparametric Wilcoxon signed-rank test was applied at p < 0.05 significance threshold per microarray probe (i.e. gene) between T2 versus T1 time points across the non-protected participant subset, the protected participant subset, and combined nonprotected and protected participant subsets respectively. A similar analysis was conducted for T3 versus T1, T4 versus T1. Each microarray probe was mapped to a gene identified by its Entrez Gene ID. For a gene with > 1 microarray probe, we used the microarray probe with the smallest p value from the paired differential analysis above as the unique representative for that gene. Each gene/Entrez Gene ID was matched to corresponding protein accession numbers of the secretome data set via ftp://ftp.ncbi.nih.gov/gene/DATA/ gene2accession.gz version 2015 May 19. Molecules present in both in vitro monocyte secretome and in vivo PBMC transcriptome data sets were assessed for the direction of their change (versus the unstimulated condition and the T1 time point, respectively) and its statistical significance. The set of proteins displaying significant changes in the MPLA-induced adult secretome, and each set of genes displaying significant changes in one of the three time comparisons of GSE18323, underwent gene ontology (GO) analysis using https://david.ncifcrf.gov/with EASE score (alpha) of 0.05 to call significance. The resulting significant GO terms were evaluated with respect to their co-occurrence between MPLA secretome and each of the three transcriptome data sets in GSE18323.

Experimental Design and Statistical Rationale—The total numbers of biological samples analyzed for the monocyte stimulation assay are 6 for adult and 7 for newborn, whereas the numbers of biological samples analyzed for WBA was n = 4 - 8. Data used to extrapolate adjuvant-induced secretome to adjuvanted-induced transcriptome, was from 24 adult study participants. Flow cytometry analysis employed a MoFlo Legacy cytometer (DakoCytomation; Fort Collins, CO) or FACSFortessa (BD Biosciences) cytometer and was analyzed using FlowJo software (Tree Star). Graphic output was generated using JMP v. 11.0 (SAS, Cary NC) and Prism v. 6.0c (GraphPad Software). For WBA confirmation assays, statistical significance was determined using two-tailed student *t* tests comparing stimulated samples to unstimulated controls. Results were considered statistically significant at p < 0.05. To assess differential

Characteristics of adjuvants used in this study			
Name	Mechanism of immune activation	Current use	
AIPO	NLRP3 Inflammasome, IRF3	Component of licensed vaccines, including HBV, PCV	
MPLA	TLR4 activation	Approved for HPV vaccine (Cervarix)	
R848	TLR7/8 activation, NLR activation	R848 and additional TLR7/8 activating molecules are	
		in preclinical development as vaccine adjuvants	

TABLE I Characteristics of adjuvants used in this study

MPLA; monophospholipid A, TLR; Toll-like receptor, HBV; Hepatitis B Vaccine, PCV; Pneumococcal conjugate vaccine, NLR; NOD-like receptor.



Fig. 1. Protocol employed for secretome analysis of adjuvantstimulated primary human newborn and adult monocytes. Human monocytes, isolated as described in Methods, were cultured under serum-free conditions for 18 h in the presence of sterile buffer (control), Alum [5  $\mu$ g/ml], MPLA [100 ng/ml], and R848 [5  $\mu$ M]. Supernatant proteins were precipitated prior to SDS-PAGE and trypsin digestion. The resulting peptide mixtures were subjected to LC-MS/MS on a QE mass spectrometer (3 h gradient). Several levels of data analysis were undertaken for protein identification and secretome comparison.

expression of Recombivax (HBV)- *versus* EasyFive (DTwP-Hep B-Hib)- induced protein fold changes, the Wilcoxon rank-sum test was used, combining all dosages of each vaccine. This is a non-parametric test of the null hypothesis (that the two groups of fold changes result from the same treatment condition) against an alternative hypothesis, where the null hypothesis was rejected for *p* values less than 0.05.

# RESULTS

Protein Identification by LC-MS from Monocyte Cultures – Culture supernatants from neonatal and adult human monocytes treated with medium alone (control), aluminum phosphate (Alum), MPLA or R848 (Table I) were analyzed by LC-MS using a nanoflow HPLC system hyphenated with a hybrid quadrupole/Orbitrap mass spectrometer (summarized in Fig. 1). Using the MASCOT and X!Tandem search engines, a total of 1894 nonredundant proteins was identified. The number of proteins identified in supernatants from differentially treated cells ranged from 829 to 1184 for the neonatal, and from 832 to 1406 for the adult samples, respectively. supplemental Table S1 gives an overview of these proteins, which were identified in seven biological replicates (*i.e.* six paired adult and newborn samples, and one unpaired newborn sample) combined, with a raw spectral count  $\geq$  1 and a protein FDR < 1%.

Protein Overlap in Supernatants from Differentially Stimulated Monocytes Samples and Hierarchical Clustering-Of the 1519 and 1717 non-redundant proteins identified for the newborn and the adult samples, respectively, 617 (41%) and 565 (33%) were common to all adjuvant treatment conditions and an average of 75 (5%) and 67 (4%) proteins were unique to each (Fig. 2A, 2B). Proteins detected at a spectral count of 1 in a single sample of only one condition were excluded from all subsequent analyses. As a first approach to compare secreted proteomes (secretomes) resulting from differential stimulation of newborn and adult human monocytes, we analyzed proteomic data sets using unsupervised two-way hierarchical clustering analysis, based on each protein's average fold change per treatment condition. A heat map was generated to visualize the results (Fig. 2C). Alum-induced newborn and adult monocyte secretomes demonstrated the most marked differences, exceeding the degree of variation observed between newborn and adult for each of the TLRAs. Age alone appeared to exert an effect on TLRA-induced secretomes, resulting in distinct newborn and adult clusters. Furthermore, both the TLRAs MPLA (TLR4) and R848 (TLR8), induced similar secretome clusters by age that were highly distinct from those induced by Alum (Fig. 2C).

Differential Expression of Proteins in Secretomes from Monocytes Treated with Alum, MPLA and R848-Next, the proteins differentially expressed between the un-stimulated and the adjuvant treatment conditions were further examined. For each treatment condition, proteins that were significantly enriched relative to the un-stimulated controls were identified using QSpec, a Bayesian statistical framework specifically designed to handle discrete, spectral count-based data (45). This software was customized for the purpose of this study to facilitate pairwise analysis within each stimulation experiment, aggregating evidence across multiple experiments. Fig. 3 visualizes, for newborns and adults, adjuvant-induced increases or decreases in protein expression levels, highlighting those changed significantly at an FDR < 5%. The distributions of the proteins in the three different treatments recapitulate the finding described in Fig. 2C that the MPLA and R848 treatments elicit much more similar responses than the Alum treatment. For each adjuvant, these proteins can be grouped



Fig. 2. **Monocyte secretomes are adjuvant- and age-specific.** *A*, *B*, Distribution of proteins determined by LC-MS/MS in the supernatants of differentially treated newborn and adult monocytes. *C*, Cluster analysis of adjuvant-induced human monocyte secretomes indicates ageand adjuvant-specific differences. Proteins identified in the supernatants from CD14+ monocytes cultured in the presence of Alum (5  $\mu$ g/ml), MPLA (100 - 1000 ng/ml), or R848 (5 - 50  $\mu$ M) are shown along the *y* axis and treatment conditions along the *x* axis. Neonatal and Adult secretomes clustered separately. The R848-induced secretomes clustered together with the MPLA-secretome and are distinct from the Alum-induced secretome. Color codes reflect the Z scores of the log2-transformed average changes of normalized spectral count (SpC) relative to the untreated control sample. Data are representative of proteins identified in newborn (*n* = 7) and adult (*n* = 6) biological replicates, of which six included paired newborn/adult samples.

into those that are significantly up-, or down- regulated in neonates exclusively (blue circle), adults exclusively (green) or both neonates and adults (red), at an FDR < 0.05. Among the total 218 significantly changed proteins, 115 were significantly enriched in response to at least one adjuvant in the neonatal secretomes (66 proteins/blue circles, Fig. 3A–3C) and/or the adult secretomes (100 proteins/green, Fig. 3A–3C). Further details on significantly enriched proteins are provided in the supplemental section online, which includes information on whether enriched proteins are induced by more than one adjuvant (supplemental Fig. S1, for which an

interactive version is accessible at http://adjuvant-secretomes.herokuapp.com/), as well as accession numbers, predicted secretion mechanisms, fold changes, Z statistics and FDR values for each protein (supplemental Table S2, supplemental Table S3).

Pathway Analysis—The results of IPA pathway analyses are depicted in Table III. Pathways represented in the Alum-induced secretomes differed substantially between newborn and adult (Table III and supplemental Fig. S2A). The neonatal Alum-induced secretome was significantly enriched with proteins belonging to innate immune pathways, including granu-



Fig. 3. Alum-, MPLA-, and R848-induced human monocyte secretomes in newborns and adults demonstrate age-common and age-specific proteins. Secretome proteins after stimulation of newborn (*y* axis) and adult (*x* axis) monocytes with Alum (*A*, 5  $\mu$ g/ml), MPLA (*B*, 100 ng/ml) or R848 (*C*, 5  $\mu$ M) are plotted by Z statistic values, reflecting the average change of normalized spectral counts in relation to sterile buffer treatment, taking inter-individual variability into account. Each circle represents one protein. Highlighted in colors are proteins that demonstrated statistically significant enrichment after adjuvant treatment in neonates exclusively (blue), adults exclusively (green) or both neonates and adults (red). Proteins selected for targeted confirmation based on reproducibility of the observed fold change across multiple specimens, novelty and commercial assay availability are labeled. Data represents proteins identified in biological replicates for newborn (*n* = 7) and adult (*n* = 6) monocyte secretomes.

TABLE II
Characteristics of the licensed vaccines used in whole blood assays

Vaccine	Trade name	Abbreviation	Manufacturer	Adjuvant
Hepatitis B	Recombivax HB	НерВ	Merck	AAHS
Human Papillomavirus	Cervarix	2vHPV	GlaxoSmithKline	AI(OH) <sub>3</sub> , MPLA
H. influenzae type b, Meningococcal	PedvaxHIB	Hib-MenB	Merck	AAHS, OMPC
Meningococcal	Bexsero	MenB	GlaxoSmithKline	AI(OH)3, OMVs
Hepatitis B, Diphtheria, Tetanus, Pertussis, H. influenzae type b,	Easyfive	DTwP-Hep B-Hib	Panacea Biotec	AIPO, Inactivated whole cell <i>B. pertussis</i>

Table adapted from Centers for Disease Control and Prevention Epidemiology and Prevention of Vaccine-Preventable Diseases, 13th Edition. Abbreviations. AAHS; Amorphous Aluminum Hydroxyphosphate Sulfate, AIPO; Aluminum Phosphate, AI(OH)<sub>3</sub>; Aluminum Hydroxide, MPLA; Monophosphoryl Lipid A, OMVs; Outer Membrane Vesicles, OMPC; Outer Membrane Protein Complex.

locyte adhesion signaling, leukocyte extravasation/diapedesis, crosstalk between dendritic and NK T cells, and Interleukin-8 (CXCL-8) signaling. In contrast, many of these pathways, such as DC/NKT cell crosstalk, T helper cell differentiation and communication of innate and adaptive immune cells were underrepresented in the adult Alum-induced secretome. The Alum-induced adult secretome, on the other hand, included unique proteins of the actin cytoskeleton pathway, possibly relating to cell degradation (52) (Table III and supplemental Fig. S2A). Multiple pathways represented in the TLRAinduced monocyte secretomes (Table III and supplemental Fig. S2B-S2C), such as Acute Phase Response Signaling, LXR/RXR Activation and Granulocyte Adhesion/Diapedesis Signaling, are relevant to the immune response and correspond to some of those present in the neonatal Alum secretome. In contrast to the highly divergent Alum response by age, greater similarity was observed between newborn and adult secretomes induced by the two investigated TLRAs.

Selective Verification of Secretomics Results using in vitro Monocyte and Whole Blood Assays—Following secretomics analysis, we wished to confirm up-regulation of selected proteins in a different experimental system. Selection of proteins for confirmation took into account novelty, significance level and reproducibility across multiple samples as well as commercial availability of targeted quantification assays (e.g. ELISA). Four proteins were measured in human whole blood stimulation assays (Fig. 4*E*–4*H*; each protein's corresponding spectral counts observed in the previous monocyte secretome analysis are shown in Fig. 4*A*–4*D*): adenosine deaminase 2 (ADA-2) (Fig. 4*E*), lactoferrin (LTF) (Fig. 4*F*), pentraxin 3 (PTX-3) (Fig. 4*G*), and matrix metalloproteinase 9 (MMP-9) (Fig. 4*H*).

Whereas ADA-2 activity displayed only minimal changes in the WBA system, statistically significant elevations in response to adjuvant treatment of whole blood were observed for LTF, PTX-3 and MMP-9. LTF levels rose moderately after

# TABLE III

Monocyte secretomes demonstrate activation of distinct canonical pathways varying by adjuvant and age. Ingenuity Pathway Analysis (IPA) was used to identify canonical pathways represented in the sets of adjuvant-induced proteins (n = 7 newborns and n = 6 adults). Proteins significantly up-regulated in the Alum-, MPLA-, and R848-induced secretomes. Shown are only those pathways represented by more than one protein in at least one of the adult/newborn datasets, with a p value < 0.05 per IPA; disease-specific pathways are excluded from the graph

Treatment	Pathways	-log10 (p value)	Significantly up newborn/adult
Adult alum	Caveolar-mediated endocytosis signaling	2.56	Yes
	Integrin signaling	1.72	Yes
	Actin cytoskeleton signaling	1.66	No
	MSP-RON signaling pathway	1.31	Yes
dult MPLA	Acute phase response signaling	1.24	Yes
	LXR/RXR Activation	8.56	Yes
	Coagulation system	6.39	No
	Granulocyte adhesion and diapedesis	6.22	Yes
	Caveolar-mediated endocytosis signaling	6.15	Yes
	Leukocyte extravasation signaling	5.70	Yes
	Complement system	4.96	Yes
	FXR/RXR Activation	4.75	Yes
	Communication between innate and adaptive immune cells	4.53	Yes
	Extrinsic prothrombin activation pathway	4.36	No
	Dendritic cell maturation	4.02	No
	Agranulocyte adhesion and diapedesis	3.93	Yes
	IL-8 Signaling	3.83	Yes
	Intrinsic prothrombin activation pathway	3.61	No
	Antigen presentation pathway	3.25	No
	Inhibition of matrix metalloproteases	3.22	No
	Virus entry via endocytic pathways	3.21	Yes
	Glucocorticoid receptor signaling	3.03	No
	Paxillin signaling	3.03	Yes
	Dermatan sulfate degradation (Metazoa)	2.78	No
	Agrin interactions at neuromuscular junction	2.50	Yes
	IL-10 Signaling	2.48	Yes
	TREM1 signaling	2.45	Yes
	TR/RXR activation	2.21	No
	Crosstalk between dendritic cells and natural killer cells	2.16	Yes
	Cytotoxic T lymphocyte-mediated apoptosis of target cells	2.09	No
	Inhibition of angiogenesis by TSP1	2.07	Yes
	IL-6 signaling	1.84	Yes
	Role of PRRs in recognition of bacteria and viruses	1.82	Yes
	Hematopoiesis from pluripotent stem cells	1.80	No
	Relaxin signaling	1.70	Yes
	Role of cytokines in mediating Communication between immune cells	1.66	Yes
	melatonin signaling	1.45	No
	Macropinocytosis signaling	1.45	Yes
	Endothelin-1 signaling	1.43	No
	Endotrient i signaling Ephrin receptor signaling	1.40	No
	NF-κB activation by viruses	1.39	Yes
		1.39	Yes
	Toll-like receptor signaling		
	Production of nitric oxide and reactive oxygen species in macrophages	1.36	No
	Integrin-linked kinase signaling	1.35	Yes
dult R848	Acute phase response signaling	12.8	Yes
	LXR/RXR activation	10.2	Yes
	Granulocyte adhesion and diapedesis	8.84	Yes
	Agranulocyte adhesion and diapedesis	6.21	Yes
	FXR/RXR activation	6.08	Yes
	Leukocyte extravasation signaling	5.89	Yes
	Complement system	5.05	No
	IL-8 signaling	4.98	Yes
	Coagulation system	4.89	No
	Inhibition of matrix metalloproteases	4.75	Yes
	Communication between innate and adaptive immune cells	4.65	Yes
	Extrinsic prothrombin activation pathway	4.44	No

## Table III —continued

Treatment	Pathways	-log10 (p value)	Significantly up in newborn/adult
	Glucocorticoid receptor signaling	4.02	Yes
	IL-6 signaling	3.93	Yes
	IL-10 signaling	3.74	Yes
	TREM1 signaling	3.70	Yes
	Intrinsic prothrombin activation pathway	3.68	No
	Dendritic cell maturation	3.17	No
	Paxillin signaling	3.12	Yes
	Chondroitin sulfate degradation (Metazoa)	2.89	No
	Role of cytokines in mediating communication between immune cells	2.89	Yes
	Dermatan sulfate degradation (Metazoa)	2.83	No
	Role of PRRs in recognition of bacteria and viruses	2.82	Yes
	Cytokine production in macrophages and Th cells by IL-17A/IL-17F	2.61	No
		2.57	
	Agrin interactions at neuromuscular junction		Yes
	Toll-like receptor signaling	2.46	Yes
	NF-κB signaling	2.28	Yes
	Crosstalk between dendritic cells and natural killer cells	2.22	Yes
	Clathrin-mediated endocytosis signaling	2.15	No
	Inhibition of angiogenesis by TSP1	2.11	Yes
	HIF1 $\alpha$ signaling	2.07	Yes
	Oncostatin M signaling	2.06	Yes
	Integrin signaling	2.06	Yes
	IL-17A signaling in fibroblasts	2.04	Yes
	Hematopoiesis from pluripotent stem cells	1.84	No
	MSP-RON signaling pathway	1.81	Yes
	Macropinocytosis signaling	1.49	Yes
	NF-κB activation by viruses	1.43	Yes
	Integrin-linked kinase signaling	1.41	Yes
	Reelin signaling in neurons	1.37	Yes
	TR/RXR activation	1.31	No
		6.10	
Newborn Alum	Caveolar-mediated endocytosis signaling		Yes
	Paxillin signaling	5.55	No
	Granulocyte adhesion and diapedesis	4.67	No
	IL-8 signaling	4.49	No
	Leukocyte extravasation signaling	4.40	No
	Integrin signaling	4.38	Yes
	Crosstalk between dendritic cells and natural killer cells	4.00	No
	LXR/RXR activation	3.60	No
	Inhibition of angiogenesis by TSP1	3.31	No
	MSP-RON signaling pathway	2.99	Yes
	T helper cell differentiation	2.67	No
	Agrin interactions at neuromuscular junction	2.67	No
	TREM1 signaling	2.63	No
	NF-κB activation by viruses	2.59	No
	Reelin signaling in neurons	2.53	No
	Communication between innate and adaptive immune cells	2.49	No
		2.43	No
	Virus entry via endocytic pathways	2.42	
	Role of PRRs in recognition of bacteria and viruses		No
	Acute phase response signaling	1.89	No
	Dendritic cell maturation	1.89	No
	Agranulocyte adhesion and diapedesis	1.86	No
	Integrin-linked kinase signaling	1.83	No
Newborn MPLA	Granulocyte adhesion and diapedesis	8.22	Yes
	IL-8 signaling	6.52	Yes
	Leukocyte extravasation signaling	6.37	Yes
	LXR/RXR activation	6.30	Yes
	Agranulocyte adhesion and diapedesis	5.37	Yes
	Caveolar-mediated endocytosis signaling	4.53	Yes
	Acute phase response signaling	4.25	Yes
	Paxillin signaling	3.99	Yes

Treatment	Pathways	-log10 (p value)	Significantly up newborn/adult
	TREM1 signaling	3.16	Yes
	Integrin signaling	2.87	Yes
	Inhibition of angiogenesis by TSP1	2.55	Yes
	Complement system	2.55	Yes
	IL-6 signaling	2.53	Yes
	Role of PRRs in recognition of bacteria and viruses	2.50	No
	FXR/RXR activation	2.44	Yes
	Role of cytokines in mediating Communication between immune cells	2.14	Yes
	Agrin interactions at neuromuscular junction	1.92	Yes
	Macropinocytosis signaling	1.91	Yes
	NF-KB activation by viruses	1.85	Yes
	Toll-like receptor signaling	1.85	Yes
	Communication between innate and adaptive immune cells	1.76	Yes
	Signaling by Rho family GTPases	1.70	No
	Virus entry via endocytic pathways	1.69	Yes
	Crosstalk between dendritic cells and natural killer cells	1.69	Yes
	Cytokine production in macrophages and Th cells by IL-17A/IL-17F	1.36	No
ewborn R848	Granulocyte adhesion and diapedesis	7.74	Yes
	IL-8 signaling	6.12	Yes
	Leukocyte extravasation signaling	5.97	Yes
	LXR/RXR activation	5.96	Yes
	Inhibition of matrix metalloproteases	5.42	Yes
	Agranulocyte adhesion and diapedesis	5.03	Yes
	Acute phase response signaling	3.97	Yes
	Paxillin signaling	3.76	Yes
	Glucocorticoid receptor signaling	3.11	Yes
	IL-10 signaling	3.03	Yes
	Macropinocytosis signaling	3.03	Yes
	TREM1 signaling	3.00	Yes
	Integrin signaling	2.66	Yes
	HIF1 $\alpha$ signaling	2.54	Yes
	Inhibition of angiogenesis by TSP1	2.44	Yes
	Oncostatin M signaling	2.38	Yes
	IL-6 signaling	2.37	Yes
	IL-17A signaling in fibroblasts	2.36	Yes
	Role of PRRs in recognition of bacteria and viruses	2.34	Yes
	FXR/RXR activation	2.28	Yes
	MSP-RON signaling pathway	2.13	Yes
	Role of cytokines in mediating communication between immune cells	2.03	Yes
	NF- <sub>K</sub> B signaling	1.92	Yes
	Integrin-linked kinase signaling	1.84	Yes
	Agrin interactions at neuromuscular junction	1.81	Yes
	NF- $\kappa$ B activation by viruses	1.74	Yes
	Toll-like receptor signaling	1.74	Yes
	Reelin signaling in neurons	1.68	Yes
	Communication between innate and adaptive immune cells	1.65	Yes
	Crosstalk between dendritic cells and natural killer cells	1.58	Yes
	PTEN signaling	1.36	No

#### Table III —continued

MPLA treatment of adult WB (100 ng/ml, p = 0.03 and 1000 ng/ml, p = 0.04), and over twofold after 50  $\mu$ M R848 treatment of both newborn (p = 0.001) and adult WB to (p = 0.01). Significant PTX-3 increases were induced in newborn WB by MPLA (10 ng/ml, p = 0.01) and R848 (all concentrations, p = 0.01), as well as R848 in adult WB ( $0.5 \ \mu$ M, p = 0.048; 5  $\mu$ M. p = 0.002; 50  $\mu$ M, p = 0.002). MMP-9 levels significantly increased in response to 100 ng/ml of MPLA in both newborn (p = 0.004) and adult WB (p = 0.02), whereas titration de-

pendent responses were observed in newborn (all concentrations, p = 0.01) to as well as adult WB (0.5  $\mu$ M, p = 0.03; 5  $\mu$ M. p = 0.002; 50  $\mu$ M, p < 0.001). To further confirm that targeted biomarkers are directly produced by blood monocytes, we purified CD14+ monocytes by immunomagnetic bead selection, cultured them in RPMI supplemented with 10% plasma, and stimulated them with Alum, MPLA, or R848. Supernatants were collected for subsequent ELISAs that demonstrated production of LTF (supplemental Fig. S3A, S3B), PTX-3 (supple-



Fig. 4. Targeted confirmation of proteins identified by monocyte secretomics in human whole blood assay. To confirm the adjuvantinduced release of adenosine deaminase 2 (ADA-2), lactoferrin (LTF), pentraxin 3 (PTX-3) and matrix metalloproteinase (MMP-9) observed in monocyte secretomes (A–D, Alum: 50  $\mu$ g/ml, MPLA: 100 and 1000 ng/ml, R848: 5 and 50  $\mu$ M), human neonatal and adult blood was stimulated with vehicle (RPMI), Alum (0.5–50  $\mu$ g/ml), MPLA (TLR4; 10–1000 ng/ml), or R848 (TLR7/8; 0.5–50  $\mu$ M). E–H, Supernatants were assayed for ADA-2 activity (E, kinetic assay) as well as LTF, PTX-3 and MMP-9 concentrations (F–H, ELISAs). Data represent fold change (mean  $\pm$  S.E.) in stimulated samples *versus* the untreated controls (neonates and adults; n = 5–8/age group).  $\Box$  = Newborn,  $\blacksquare$  = Adult. \*, p < 0.05 as determined by 2-tailed Student's t test.

# mental Fig. S3*D*, S3*E*) and MMP-9 (supplemental Fig. S3*G*, S3*H*) in a concentration dependent manner.

Induction of Verified Proteins and of Cytokines by Licensed Vaccines—To assess if LTF, PTX-3 and MMP-9 are also induced by adjuvanted vaccine formulations, we studied WB stimulation with five licensed vaccines that are adjuvanted with Alum alone or with Alum in combination with TLRAs (listed in Table II). When compared with the untreated control, significant elevations of LTF was observed in both newborn and adult WB treated with all of the Alum + TLRA-containing vaccines at multiple concentrations, but not with the hepatitis B vaccine (HBV) Recombivax, that is adjuvanted with Alum alone (Fig. 5*A*). LTF levels were also significantly higher when directly comparing the Alum-only Recombivax *versus* the (Alum + TLR agonist)-containing vaccines (*i.e.* Cervarix, Bexsero, PedvaxHIB and Easyfive), all at equivalent volumeto-volume (v/v) treatments concentrations. With respect to PTX-3, a similar trend was also observed. When compared at equivalent volume-to-volume (v/v) treatment concentrations, HBV (Recombivax) induced only moderate increases over the untreated control in newborn WB (p = 0.04 at the highest dose), whereas the (Alum + TLRA)-containing vac-



Fig. 5. Alum- and/or TLR agonist-adjuvanted vaccines induce distinct patterns of of LTF, PTX-3 and MMP-9 release in whole blood tested in vitro. Human neonatal and adult blood was cultured in the presence of vaccines for 6 h at 37 °C prior to collection of the extracellular fluid for measurement of A, LTF, B, PTX-3 and C, MMP-9 by ELISA. Data are depicted as fold changes (mean  $\pm$  S.E.) of n = 5-8 neonates and adults; asterisks denote a statistically significant difference between stimulated samples versus the untreated (*black stars*), or Alum only Recombivax versus the Alum + TLR agonist containing vaccines (red stars), all at equivalent volume-to-volume (v/v) treatments. \*, p < 0.05, \*\*, p < 0.01, \*\*, p < 0.001 as determined by 2-tailed Student's t test.

cines induced greater PTX-3 concentrations in both newborns and adults, in comparison to control and HBV (Fig. 5B). In contrast, MMP-9 was induced in a concentrationdependent manner in both newborn (p < 0.05) and adult (p < 0.05) WB by HBV (Recombivax) alone (Fig. 5C). Nevertheless, (Alum + TLRA)-containing vaccines induced significantly greater MMP-9 concentrations than HBV (Recombivax) in both newborns and adults (Fig. 5C). Interestingly, the licensed pediatric vaccine not indicated for neonatal administration in vivo (i.e. Bexsero, PedvaxHIB and Easyfive) induced age-specific PTX-3 release in newborn whole blood in vitro (p < 0.05), when compared directly to identically treated adult samples (Fig. 6A). In contrast, Alumadjuvanted HBV (Recombivax), a vaccine indicated for neonatal administration and with potentially relatively lower reactogenicity rates, induced age-specific elevation of MMP-9 in adult blood (Fig. 6, 6B). Vaccine induced responses were also observed to be directly produced by blood monocytes (supplemental Fig. S3*C*, S3*F*, S3*I*).

In addition to the proteins described above, we also measured vaccine-induced TNF, IL-1 $\beta$  and PGE<sub>2</sub> release in a subgroup of 8 biological individual samples (4 newborns and 4 adults) as the *in vitro* levels of these mediators may potentially predict *in vivo* vaccine reactogenicity (21). supplemental Fig. S4 demonstrates the relationships among vaccine-induced fold changes for TNF, IL-1 $\beta$ , and PGE<sub>2</sub> as well as LTF, PTX-3, and MMP-9. We assessed whether the *in vitro* levels of LTF, PTX-3, and MMP-9 might also predict *in vivo* vaccine reactogenicity by comparing the fold changes of each protein across two vaccine treatment groups: (1) Alum-adjuvanted HBV (Recombivax) vaccine of low reactogenicity (53) and (2) EasyFive, a combination vaccine containing whole cell pertussis vaccine of high reactogenicity (54). To assess whether a protein was differentially expressed in response

FIG. 6. Licensed pediatric vaccines induce age-specific PTX-3 responses in newborn whole blood in vitro. Human neonatal and adult blood was cultured as outlined above. A, PTX-3 levels in newborn blood are significantly elevated over adult responses to (Alum + TLR agonist)- containing vaccines (i.e. Bexsero, PedvaxHIB and Easyfive). B, In contrast, adult blood demonstrates agespecific elevation in MMP-9 to the Alumadjuvanted HBV (Recombivax), a vaccine of low reactogenicity. Data are depicted as fold changes (mean  $\pm$  S.E.) of neonates and adults (n = 5-8/group); asterisks denote a statistically significant difference between newborn and adults, all at equivalent 1:10 volume-to-volume (v/v) treatments. \*, p < 0.05, as determined by 2-tailed Student's t test.



to treatment with HBV (Recombivax) as compared with treatment with EasyFive, we employed the Wilcoxon ranksum test. As shown in Table IV, EasyFive induced higher levels of positive biomarker controls TNF, IL-1 $\beta$  and PGE<sub>2</sub> (p < 0.05) as compared with Recombivax, demonstrating the validity of our approach. Similarly, EasyFive also significantly induced LTF, PTX-3 and MMP-9 at the indicated fold changes as compared with Recombivax treated neonatal and adult whole blood.

Extrapolation of the Adjuvant-Induced Secretomes in vitro to Vaccine-Induced PBMC Transcriptomes In Vivo-Adjuvant-induced in vitro monocyte secretome data sets were compared with publicly-available in vivo PBMC transcriptome profiles from 24 individuals vaccinated with the MPLA-adjuvanted Malaria vaccines RTS,S/AS01B or RTS,S/AS02A (49). For each protein identified in the monocyte secretomes and represented in the transcriptome data sets, we assessed the expression profile of the corresponding gene. We found many molecules displaying statistically significant changes that were concordant (either both up or both down) between vaccine-induced transcriptomes and adjuvant-induced secretomes (Fig. 7A and supplemental Fig. S5). Gene ontological (GO) analysis was also performed on the in vitro adult MPLAinduced monocyte secretome, and each of the in vivo Mosquirix vaccine GSE18323 transcriptomes (24 h, 48 h and 2 weeks; supplemental Table S4), to compare the representation of gene and gene product. The GO terms significant for the MPLA secretome were compared with the GO terms significant for each transcriptome. GO terms between secretome and transcriptome overlapped at each post-vaccination time point by  $\sim$ 13% (supplemental Fig. S6).

TABLE IV Alum-adjuvanted HBV (Recombivax) vs. whole cell pertussis-containing vaccine (EasyFive)

Protein	$\rho$ value <sup>a</sup> [number of individuals]		
FIOLEIII	Newborns	Adults	
TNF IL-1 $\beta$ PGE <sub>2</sub> LTF PTX-3 MMP-9	$\begin{array}{c} 2.6 \times 10^{-5} \left[n=4\right] \\ 3.2 \times 10^{-5} \left[n=4\right] \\ 3.4 \times 10^{-6} \left[n=5\right] \\ 6.2 \times 10^{-6} \left[n=5\right] \\ 3.6 \times 10^{-8} \left[n=7\right] \\ 4.6 \times 10^{-7} \left[n=8\right] \end{array}$	$\begin{array}{c} 1.4 \times 10^{-5} \left[ n=4 \right] \\ 3.0 \times 10^{-4} \left[ n=4 \right] \\ 2.8 \times 10^{-5} \left[ n=6 \right] \\ 5.7 \times 10^{-5} \left[ n=5 \right] \\ 5.1 \times 10^{-7} \left[ n=8 \right] \\ 3.3 \times 10^{-7} \left[ n=8 \right] \end{array}$	

<sup>a</sup> determined using Wilcoxon log-rank test.

Of note, our analyses revealed that the number of the concordant (i.e. transcriptome in vivo with secretome in vitro) molecules appeared to correspond by adjuvant and age as it was higher for TLRA (MPLA and R848)-induced secretomes than Alum-induced secretomes; higher for adult than newborn secretomes; and higher at the 24 h time point than the later time points (Fig. 7B). For the purposes of comparative analysis, assuming the 12,893 unique genes of the Affymetrix Human Genome U133A microarray platform used in GSE18323 to be background set of commonly measurable genes/proteins in both proteomic and transcriptomic studies, we found significant number of concordant genes between GSE18323 at 24 h with the adult secretome conditions for Alum (p = 4.0e-4, Kendall's tau beta test), MPLA (p = 1.8e-7, Kendall's tau beta test) and R848 (p = 2.9e-4, Kendall's tau beta) and none for the newborn data sets at 24 h. All other pair-wise concordance analyses between the 6 secretomes and GSE18323 three



FIG. 7. Gene Expression Levels in Adults Immunized with an MPLA-Adjuvanted Malaria Vaccine Demonstrate Adjuvant-, Ageand Kinetic-Concordance with Secretome Proteins in Silico. PBMC transcriptome profiles of 24 adults immunized with the MPLAaduvanted Malaria vaccines RTS, S/AS01B or RTS, S/AS02A, measured at four different time points (49) were analyzed for post-immunization changes in gene expression. A, For each protein identified in the adjuvant-induced monocyte secretomes, the corresponding gene's fold change and p value at the 24 h time point was plotted on the indicated log scales. Highlighted in orange are those molecules that displayed statistically significant changes that are concordant (i.e. both up or both down) between vaccine-induced transcriptomes and adjuvant-induced secretomes. Blue color signifies the biomarker candidates further assessed in vitro in the context of this study. B, For each of the three post-vaccine time points, the number of molecules displaying statistically significant changes concordant between transcriptomes and newborn/adult monocyte secretomes induced by Alum and the TLR agonists MPLA and R848. Overall, this number of concordant molecules is higher for TLRA-induced secretomes than Alum-induced secretomes; higher for adult than newborn secretomes; and higher at the 24 h time point than the later time points, suggesting concordance with our in vitro platform. Assuming the 12,893 unique genes of the Affymetrix Human Genome U133A microarray platform used in GSE18323 as the background set of commonly measurable genes/proteins in both proteomic and transcriptomic studies, we found significant number of concordant genes between GSE18323 at 24 h with the adult secretome conditions for Alum (p = 4.0e-4, Kendall's tau beta test), MPLA (p = 1.8e-7, Kendall's tau beta test) and R848 (p = 2.9e-4, Kendall's tau beta) and none for the newborn data sets at 24 h. Overall, the alignment of the transcriptomic-proteomic data sets was most significant for the adult MPLA conditions.

time points are not significant. Of further note, the alignment of the transcriptomic-proteomic data sets was most significant for the adult MPLA conditions. This suggests that our *in vitro* model reflected age- and adjuvant-specific differences that are relevant *in vivo*.

#### DISCUSSION

To our knowledge, we report the first proteomic analysis of adjuvant-induced human monocyte secretomes in vitro. Cluster and pathway analyses demonstrated marked differences between Alum- and TLRA-induced secretome signatures for both neonates and adults that also translated to the pathway level. Our findings are in agreement with the known functional differences between these adjuvants. Whereas TLR stimulation induces MyD88 and TRIF/TRAM dependent pathways that elicit a Th1-polarizing immune response, Alum's mode of action is distinct and still under investigation (10, 55). Alum preferentially induces a Th2 response via innate immune pathways that may include activation of the NALP3 inflammasome and of the Syk tyrosine kinase (11). Alum-induced cell necrosis releases DNA, purine catabolites and other danger-associated molecular patterns (DAMPs) that stimulate the adaptive immune response (11, 56). The ability of Alum to induce cell necrosis in our model was evident in that proteins involved in the DNA degradation pathway were induced by Alum in both newborn and adult monocytes.

Although multiple studies indicated a dampened Th1 cytokine response to LPS and to MPLA (24), suggestive of a distinct TLR4 responsiveness in newborns as compared with adults, the overall secretome response to the TLR4A MPLA in this study did not vary substantially between newborn and adult monocytes. We cannot rule out that the similarity in newborn and adult monocytes responses to TLRAs may, in part, reflect our efforts to facilitate sensitive proteomic analysis of monocytes by culturing them in the absence of autologous plasma that contains multiple soluble age-dependent factors that limit TLR-mediated neonatal Th1 cytokine production (18, 57, 58).

To further characterize adjuvant-induced proteins in a more complete and potentially more physiologic in vitro model, we conducted whole blood stimulation assays to confirm upregulation of select proteins in the presence of blood plasma and multiple leukocyte types. These targeted whole blood assays confirmed that the TLRAs MPLA and R848 induced LTF, PTX-3, and MMP-9, but not ADA-2. ADA-2 may play a role in adenosine deamination in tissues or in extracellular locations with elevated levels of adenosine and low pH (48). However, it is a weak adenosine deaminase at physiological conditions and concentrations of adenosine, and is produced almost exclusively by monocyte-lineage cells. This may explain why a significant increase in ADA-2 was observed by LC/MS in the secretomes of purified monocyte secretomes, but not by a functional assay in whole blood assay supernatants.

In this same whole blood platform, we also evaluated whether conventional licensed vaccines containing the adjuvants studied may induce LTF, PTX-3, and MMP-9. Five licensed vaccines were selected for study: Recombivax, a HBV

adjuvanted with Alum (amorphous aluminum hydroxyphosphate sulfate, AAHS); the HPV vaccine Cervarix, containing Alum (Al(OH)<sub>3</sub>) and the synthetic TLRA MPLA; PedvaxHiB, adjuvanted with Alum (AAHS) and N. meningitidis Outer Membrane Complex (OMPC), which stimulates TLR2 (59); Bexsero, which in addition to aluminum hydroxide contains TLR-activating N. meningitidis Outer Membrane Vesicles (OMVs); (60); and EasyFive, a pentavalent vaccine whose relatively high reactogenicity (propensity to induce local soreness and systemic fever after administration) is thought to be because of its whole cell pertussis vaccine component (61), known to stimulate TLR4 (60). Although the Alum-adjuvanted Recombivax induced significant up-regulation of only MMP-9 among the targeted biomarkers, all of the studied TLRA-containing vaccines induced significant LTF, PTX-3, and MMP-9 release in both age groups. We also demonstrated significantly higher levels of PTX-3 production in newborn whole blood in response to the (Alum + TLRA)-containing licensed pediatric vaccines (i.e. Bexsero, PedvaxHIB, and Easyfive) with relatively higher reactogenicity levels in vivo. In contrast, the Alum(only)-adjuvanted HBV (Recombivax), a vaccine indicated for neonatal administration with relatively low reactogenicity rates, induced higher production of MMP-9 in adult than in newborn blood.

We further scrutinized the patterns of induction of each of the targeted proteins. Whereas our proteomic (secretomic) analysis indicated significant LTF increase only for R848stimulated neonatal monocytes, in the whole blood assay, both MPLA- (in adults) and R848- (newborns and adults) stimulation induced substantial LTF release. Robust LTF release in blood may be because of its abundance in the secondary granules of neutrophils that express functional TLRs (62). PTX-3 up-regulation following treatment with TLRA-containing vaccines is consistent with observations that PTX-3 is released in response to inflammatory stimuli, including TLRAs (63). Moreover, in a mouse model, the adjuvants MF-59 and CpG DNA (TLR9A) induce PTX-3 when injected into whole muscle in vivo, whereas Alum does not (29). The TLRAs MPLA and R848, as well as the TLRA-containing licensed vaccines we studied induced MMP-9, consistent with studies demonstrating TLR-mediated release of MMP-9 (64, 65). Interestingly, although Alum alone induced minimal MMP-9 release in whole blood (onefold), the Alum-adjuvanted HBV vaccine, comprised of Hepatitis B surface antigen as a viral like particle with Alum adjuvantation as well as yeast extract components that may trigger PRRs, induced a more robust response (twoto threefold). Further studies are needed to clarify the potential contribution of the Alum component of the HBV vaccine to this activity.

There is an unmet need for methods to assess candidate adjuvants with respect to their potential reactogenicity and contribution to vaccine immunogenicity and efficacy prior to clinical trials (66). Though imperfect, experimental platforms that model the human immune response to vaccines and their

adjuvants in vitro, may recapitulate relevant aspects of the response to adjuvants and adjuvanted vaccines (1, 14, 21). Studies correlating biomarker release from human monocytic cell lines with a rabbit pyrogenicity model have suggested that immunomodulatory/inflammatory mediators such as TNF, IL-1 $\beta$ , or PGE<sub>2</sub> may serve as *in vitro* predictors of an adjuvant's in vivo reactogenicity (21). We hypothesized that these proteins, as well as LTF, PTX-3, and MMP-9 could be induced in our WBA by licensed vaccines, at levels that might reflect a vaccine's empiric in vivo reactogenicity. Consistent with our hypothesis, the magnitude of protein biomarker induction by adjuvanted vaccines in vitro appeared to parallel reactogenicity in vivo. Alum-adjuvanted HBV (Recombivax), a vaccine of relatively low reactogenicity, induced small, if any, increases of these proteins in human WB. In contrast, marked increases of each of these proteins in human WB was noted with Easy-Five, a combined formulation containing whole cell pertussis vaccine whose use was discontinued in the U.S. because of too high reactogenicity, including induction of fevers and febrile seizures (54). Further studies are needed to assess the potential utility of the proteins and pathways identified in our study as biomarkers that may correlate with vaccine reactogenicity in vitro and in vivo. If robust, such predictors could inform and accelerate development of rationally designed adjuvants and adjuvanted vaccines.

To assess whether the TLRA-induced monocyte secretome in vitro resembled that induced by TLRA-adjuvanted vaccine in vivo, we compared monocyte secretome data with published in vivo transcriptome data obtained from adults immunized with MPLA-containing RTS,S malaria vaccines, including the recently approved Mosquirix<sup>™</sup> (67). Of note, we found that RTS,S-induced transcriptome changes in vivo mirrored proteomic (secretomic) changes in our in vitro platform in that alignment of gene and protein signatures was most consistent by (1) adjuvant with TLRA, especially MPLA-, induced secretome changes showing greater alignment than Alum; (2) age, as in vivo changes in this adult vaccine study were more similar to the adult than the newborn monocyte in vitro secretomes; (3) kinetics with in vitro (18 h stimulation) secretome data being more similar to the in vivo transcriptome at the 24 h post-vaccine than later time points; and (4) gene ontology analysis of the overlapping gene microarray transcriptome and protein monocyte secretomes for MPLA treated samples. Overall, these findings suggest a correlation between in vitro monocyte secretome data and in vivo data. We speculate that, had the in vitro and in vivo samples been derived from the same study participants, this would reduce variability related to genetics or epigenetics, likely resulting in even greater concordance of the data sets.

In conclusion, our study has for the first time employed a global proteomic approach to characterize adjuvant-induced protein release from human neonatal and adult monocytes, demonstrating adjuvant- and age-specific differences. We found that adjuvants induced different, but partially overlap-

ping inventories of secreted proteins that varied by adjuvant type and age of study participant. TLRAs (MPLA and R848) induced secretome signatures distinct from Alum that triggered markedly different protein and pathway level responses between newborns and adults. We employed whole blood from different study participants for targeted verification (e.g. LTF, PTX-3, MMP-9) that proteins induced in the monocyte platform were also detectable in this more physiologically complex assay that includes autologous plasma. Finally, using publicly available adult transcriptome profiles induced by an MPLA-adjuvanted malaria vaccine, we found that the adjuvant-induced monocyte secretome in vitro correlated with the adjuvant-, age-, and kinetic-specific response to the same adjuvant in vivo. That proteins induced by pure adjuvants from monocytes in vitro were also induced by licensed vaccines containing the same adjuvants in whole blood in vitro and further verified by analysis of the transcriptomic response to an adjuvanted vaccine in vivo, supports their potential future utility as biomarkers for pre-clinical assessment of vaccine reactogenicity and/or immunogenicity in vivo. Overall, our study suggests a novel paradigm for characterizing adjuvantand age-specific responses using age-specific in vitro modeling coupled with global molecular analyses and in vivo verification to inform rational development of age-specific adjuvanted vaccines.

Acknowledgments—We thank adult blood donors and staff at the BWH and BIDMC maternity wards, whose participation and support made this study possible; members of the Levy laboratory for phlebotomy; David N. Schumann for interactive figure development; and Drs. Christine Palmer, Alka Khaitan, William Borkowsky, and Michael Wessels for helpful discussions. Dr. Gary Fleisher is thanked for his advice and support for Boston Children's Hospitals Precision Vaccine Program.

\* D.Y.O. was supported by a Gerber Foundation Novice Researcher Grant and a Thrasher Research Fund Early Career Award. O.L. laboratory is funded by an internal award from the Boston Children's Hospital Department of Medicine in support of the Precision Vaccines Program, U.S. National Institutes of Health (NIH) grant 1R01Al100135–01 and administrative supplement PA-14– 027, the National Institutes of Allergy and Infectious Diseases (NIAID), NIH, Department of Health and Human Services, Adjuvant Discovery Program Contract No. HHSN272201400052C, Global Health (OPPGH5284) and Grand Challenges Explorations (OPP1035192) awards from the Bill & Melinda Gates Foundation as well as sponsored research support from Crucell (Johnson & Johnson). The content is solely the responsibility of the authors and does not necessarily represent the official views of the National Institutes of Health.

S This article contains supplemental material.

§§ To whom correspondence should be addressed: Staff Physician & Principal Investigator, Director, *Precision Vaccines Program*, Division of Infectious Diseases, Children's Hospital Boston, Associate Professor in Pediatrics, Harvard Medical School, John F. Enders Research Labs (Room 861.1), Boston Children's Hospital, 300 Longwood Avenue, Boston, MA 02115. Tel.: +1-617-919-2904; Fax: +1-617-730-0255; E-mail: ofer.levy@childrens.harvard.edu.

¶¶ These first authors contributed equally to this work.

These senior authors contributed equally to this work.

<sup>b</sup> Current address for DO: Aaron Diamond AIDS Research Center and Rockefeller University, New York.

#### REFERENCES

- Dowling, D. J., and Levy, O. (2014) Ontogeny of early life immunity. *Trends Immunol.* 35, 299–310
- Kollmann, T. R., Levy, O., Montgomery, R. R., and Goriely, S. (2012) Innate immune function by Toll-like receptors: distinct responses newborns and the elderly. *Immunity* **37**, 771–783
- De Gregorio, E., D'Oro, U., and Wack, A. (2009) Immunology of TLRindependent vaccine adjuvants. *Current Opinion Immunol.* 21, 339–345
- Dowling, D. J., and Levy, O. (2015) Pediatric vaccine adjuvants: Components of the modern vaccinologist's toolbox. *Pediatr. Infect. Dis. J.*
- Belderbos, M. E., Levy, O., Stalpers, F., Kimpen, J. L., Meyaard, L., and Bont, L. (2012) Neonatal plasma polarizes TLR4-mediated cytokine responses towards low IL-12p70 and high IL-10 production via distinct factors. *PLoS ONE* 7, e33419
- Coffman, R. L., Sher, A., and Seder, R. A. (2010) Vaccine adjuvants: putting innate immunity to work. *Immunity* 33, 492–503
- Fox, C. B., Barnes, V. L., Evers, T., Chesko, J. D., Vedvick, T. S., Coler, R. N., Reed, S. G., and Baldwin, S. L. (2013) Adjuvanted pandemic influenza vaccine: variation of emulsion components affects stability, antigen structure, and vaccine efficacy. *Influenza Respiratory Viruses* 7, 815–826
- Pomat, W. S., van den Biggelaar, A. H., Phuanukoonnon, S., Francis, J., Jacoby, P., Siba, P. M., Alpers, M. P., Reeder, J. C., Holt, P. G., Richmond, P. C., Lehmann, D., and Neonatal Pneumococcal Conjugate Vaccine Trial Study, T. (2013) Safety and immunogenicity of neonatal pneumococcal conjugate vaccination in Papua New Guinean children: a randomised controlled trial. *PLoS ONE* 8, e56698
- Levy, O., Goriely, S., and Kollmann, T. R. (2013) Immune response to vaccine adjuvants during the first year of life. *Vaccine* **31**, 2500–2505
- Kool, M., Fierens, K., and Lambrecht, B. N. (2012) Alum adjuvant: some of the tricks of the oldest adjuvant. J. Med. Microbiol. 61, 927–934
- Kuroda, E., Coban, C., and Ishii, K. J. (2013) Particulate adjuvant and innate immunity: past achievements, present findings, and future prospects. *Int. Rev. Immunol.* 32, 209–220
- Lisciandro, J. G., Prescott, S. L., Nadal-Sims, M. G., Devitt, C. J., Pomat, W., Siba, P. M., Holt, P. G., Strickland, D., and van den Biggelaar, A. H. (2012) Comparison of neonatal T regulatory cell function in Papua New Guinean and Australian newborns. *Pediatr. Allergy Immunol.* 23, 173–180
- van den Biggelaar, A. H., Richmond, P. C., Pomat, W. S., Phuanukoonnon, S., Nadal-Sims, M. A., Devitt, C. J., Siba, P. M., Lehmann, D., and Holt, P. G. (2009) Neonatal pneumococcal conjugate vaccine immunization primes T cells for preferential Th2 cytokine expression: a randomized controlled trial in Papua New Guinea. *Vaccine* 27, 1340–1347
- Reed, S. G., Orr, M. T., and Fox, C. B. (2013) Key roles of adjuvants in modern vaccines. *Nat. Med.* 19, 1597–1608
- Verstraeten, T., Descamps, D., David, M. P., Zahaf, T., Hardt, K., Izurieta, P., Dubin, G., and Breuer, T. (2008) Analysis of adverse events of potential autoimmune aetiology in a large integrated safety database of AS04 adjuvanted vaccines. *Vaccine* 26, 6630–6638
- Garcon, N., Chomez, P., and Van Mechelen, M. (2007) GlaxoSmithKline Adjuvant Systems in vaccines: concepts, achievements and perspectives. *Expert Rev. Vaccines* 6, 723–739
- Kundi, M. (2007) New hepatitis B vaccine formulated with an improved adjuvant system. *Expert Rev. Vaccines* 6, 133–140
- Philbin, V. J., Dowling, D. J., Gallington, L. C., Cortes, G., Tan, Z., Suter, E. E., Chi, K. W., Shuckett, A., Stoler-Barak, L., Tomai, M., Miller, R. L., Mansfield, K., and Levy, O. (2012) Imidazoquinoline Toll-like receptor 8 agonists activate human newborn monocytes and dendritic cells through adenosine-refractory and caspase-1-dependent pathways. *J. Allergy Clin. Immunol.* 130, 195–204 e199
- Kollmann, T. R., Crabtree, J., Rein-Weston, A., Blimkie, D., Thommai, F., Wang, X. Y., Lavoie, P. M., Furlong, J., Fortuno, E. S., 3rd, Hajjar, A. M., Hawkins, N. R., Self, S. G., and Wilson, C. B. (2009) Neonatal innate TLR-mediated responses are distinct from those of adults. *J. Immunol.* 183, 7150–7160
- Seubert, A., Monaci, E., Pizza, M., O'Hagan, D. T., and Wack, A. (2008) The adjuvants aluminum hydroxide and MF59 induce monocyte and granulocyte chemoattractants and enhance monocyte differentiation toward

dendritic cells. J. Immunol. 180, 5402-5412

- Zaitseva, M., Romantseva, T., Blinova, K., Beren, J., Sirota, L., Drane, D., and Golding, H. (2012) Use of human MonoMac6 cells for development of in vitro assay predictive of adjuvant safety in vivo. *Vaccine* **30**, 4859–4865
- Kwissa, M., Nakaya, H. I., Oluoch, H., and Pulendran, B. (2012) Distinct TLR adjuvants differentially stimulate systemic and local innate immune responses in nonhuman primates. *Blood* **119**, 2044–2055
- Amenyogbe, N., Levy, O., and Kollmann, T. R. (2015) Systems vaccinology: a promise for the young and the poor. *Phil. Trans. Roy. Soc. London.* 370
- Dowling, D. J., Tan, Z., Prokopowicz, Z. M., Palmer, C. D., Matthews, M. A., Dietsch, G. N., Hershberg, R. M., and Levy, O. (2013) The ultra-potent and selective TLR8 agonist VTX-294 activates human newborn and adult leukocytes. *PLoS ONE* 8, e58164
- PrabhuDas, M., Adkins, B., Gans, H., King, C., Levy, O., Ramilo, O., and Siegrist, C. A. (2011) Challenges in infant immunity: implications for responses to infection and vaccines. *Nat. Immunol.* **12**, 189–194
- Sanchez-Schmitz, G., and Levy, O. (2011) Development of newborn and infant vaccines. Sci. Transl. Med. 3, 90ps27
- Higbee, R. G., Byers, A. M., Dhir, V., Drake, D., Fahlenkamp, H. G., Gangur, J., Kachurin, A., Kachurina, O., Leistritz, D., Ma, Y., Mehta, R., Mishkin, E., Moser, J., Mosquera, L., Nguyen, M., Parkhill, R., Pawar, S., Poisson, L., Sanchez-Schmitz, G., Schanen, B., Singh, I., Song, H., Tapia, T., Warren, W., and Wittman, V. (2009) An immunologic model for rapid vaccine assessment – a clinical trial in a test tube. *Alt/ Lab. Animals* **37** 19–27
- Orr, M. T., Kramer, R. M., Barnes, L. t., Dowling, Q. M., Desbien, A. L., Beebe, E. A., Laurance, J. D., Fox, C. B., Reed, S. G., Coler, R. N., and Vedvick, T. S. (2014) Elimination of the cold-chain dependence of a nanoemulsion adjuvanted vaccine against tuberculosis by lyophilization. *J. Controlled Release* **177**, 20–26
- Mosca, F., Tritto, E., Muzzi, A., Monaci, E., Bagnoli, F., Iavarone, C., O'Hagan, D., Rappuoli, R., and De Gregorio, E. (2008) Molecular and cellular signatures of human vaccine adjuvants. *Proc. Natl. Acad. Sci.* U.S.A. 105, 10501–10506
- Caskey, M., Lefebvre, F., Filali-Mouhim, A., Cameron, M. J., Goulet, J. P., Haddad, E. K., Breton, G., Trumpfheller, C., Pollak, S., Shimeliovich, I., Duque-Alarcon, A., Pan, L., Nelkenbaum, A., Salazar, A. M., Schlesinger, S. J., Steinman, R. M., and Sekaly, R. P. (2011) Synthetic doublestranded RNA induces innate immune responses similar to a live viral vaccine in humans. *J. Exp. Med.* **208**, 2357–2366
- Li, S., Rouphael, N., Duraisingham, S., Romero-Steiner, S., Presnell, S., Davis, C., Schmidt, D. S., Johnson, S. E., Milton, A., Rajam, G., Kasturi, S., Carlone, G. M., Quinn, C., Chaussabel, D., Palucka, A. K., Mulligan, M. J., Ahmed, R., Stephens, D. S., Nakaya, H. I., and Pulendran, B. (2014) Molecular signatures of antibody responses derived from a systems biology study of five human vaccines. *Nat. Immunol.* **15**, 195–204
- Nakaya, H. I., Wrammert, J., Lee, E. K., Racioppi, L., Marie-Kunze, S., Haining, W. N., Means, A. R., Kasturi, S. P., Khan, N., Li, G. M., Mc-Causland, M., Kanchan, V., Kokko, K. E., Li, S., Elbein, R., Mehta, A. K., Aderem, A., Subbarao, K., Ahmed, R., and Pulendran, B. (2011) Systems biology of vaccination for seasonal influenza in humans. *Nat. Immunol.* 12, 786–795
- 33. Querec, T. D., Akondy, R. S., Lee, E. K., Cao, W., Nakaya, H. I., Teuwen, D., Pirani, A., Gernert, K., Deng, J., Marzolf, B., Kennedy, K., Wu, H., Bennouna, S., Oluoch, H., Miller, J., Vencio, R. Z., Mulligan, M., Aderem, A., Ahmed, R., and Pulendran, B. (2009) Systems biology approach predicts immunogenicity of the yellow fever vaccine in humans. *Nat. Immunol.* **10**, 116–125
- Tsang, J. S., Schwartzberg, P. L., Kotliarov, Y., Biancotto, A., Xie, Z., Germain, R. N., Wang, E., Olnes, M. J., Narayanan, M., Golding, H., Moir, S., Dickler, H. B., Perl, S., Cheung, F., Baylor, H. C., and Consortium, C. H. I. (2014) Global analyses of human immune variation reveal baseline predictors of postvaccination responses. *Cell* **157**, 499–513
- 35. Wilhelm, M., Schlegl, J., Hahne, H., Moghaddas Gholami, A., Lieberenz, M., Savitski, M. M., Ziegler, E., Butzmann, L., Gessulat, S., Marx, H., Mathieson, T., Lemeer, S., Schnatbaum, K., Reimer, U., Wenschuh, H., Mollenhauer, M., Slotta-Huspenina, J., Boese, J. H., Bantscheff, M., Gerstmair, A., Faerber, F., and Kuster, B. (2014) Mass-spectrometrybased draft of the human proteome. *Nature* **509**, 582–587
- 36. Gygi, S. P., Rochon, Y., Franza, B. R., and Aebersold, R. (1999) Correlation

between protein and mRNA abundance in yeast. *Mol. Cell. Biol.* 19, 1720-1730

- Meissner, F., Scheltema, R. A., Mollenkopf, H. J., and Mann, M. (2013) Direct proteomic quantification of the secretome of activated immune cells. *Science* **340**, 475–478
- Bal, M. S., Mandal, N. N., Das, M. K., Kar, S. K., Sarangi, S. S., and Beuria, M. K. (2010) Transplacental transfer of filarial antigens from Wuchereria bancrofti-infected mothers to their offspring. *Parasitology* **137**, 669–673
- Levy, O., Zarember, K. A., Roy, R. M., Cywes, C., Godowski, P. J., and Wessels, M. R. (2004) Selective impairment of TLR-mediated innate immunity in human newborns: neonatal blood plasma reduces monocyte TNF-alpha induction by bacterial lipopeptides, lipopolysaccharide, and imiquimod, but preserves the response to R-848. *J. Immunol.* **173**, 4627–4634
- Vizcaino, J. A., Deutsch, E. W., Wang, R., Csordas, A., Reisinger, F., Rios, D., Dianes, J. A., Sun, Z., Farrah, T., Bandeira, N., Binz, P. A., Xenarios, I., Eisenacher, M., Mayer, G., and Gatto, L. (2014) ProteomeXchange provides globally coordinated proteomics data submission and dissemination. **32**, 223–226
- Nesvizhskii, A. I., Keller, A., Kolker, E., and Aebersold, R. (2003) A statistical model for identifying proteins by tandem mass spectrometry. *Anal. Chem.* **75**, 4646–4658
- Caraux, G., and Pinloche, S. (2005) PermutMatrix: a graphical environment to arrange gene expression profiles in optimal linear order. *Bioinformatics* 21, 1280–1281
- Meunier, B., Dumas, E., Piec, I., Bechet, D., Hebraud, M., and Hocquette, J. F. (2007) Assessment of hierarchical clustering methodologies for proteomic data mining. *J. Proteome Res.* 6, 358–366
- Makawita, S., Smith, C., Batruch, I., Zheng, Y., Ruckert, F., Grutzmann, R., Pilarsky, C., Gallinger, S., and Diamandis, E. P. (2011) Integrated proteomic profiling of cell line conditioned media and pancreatic juice for the identification of pancreatic cancer biomarkers. *Mol. Cell. Proteomics* 10, M111 008599
- Choi, H., Fermin, D., and Nesvizhskii, A. I. (2008) Significance analysis of spectral count data in label-free shotgun proteomics. *Mol. Cell. Proteomics* 7, 2373–2385
- 46. Choi, H., Kim, S., Fermin, D., Tsou, C. C., and Nesvizhskii, A. I. (2015) QPROT: Statistical method for testing differential expression using protein-level intensity data in label-free quantitative proteomics. *J. Proteomics*
- Ganapathi, L., Van Haren, S., Dowling, D. J., Bergelson, I., Shukla, N. M., Malladi, S. S., Balakrishna, R., Tanji, H., Ohto, U., Shimizu, T., David, S. A., and Levy, O. (2015) The Imidazoquinoline Toll-Like Receptor-7/8 Agonist Hybrid-2 Potently Induces Cytokine Production by Human Newborn and Adult Leukocytes. *PLoS ONE* **10**, e0134640
- Zavialov, A. V., and Engstrom, A. (2005) Human ADA2 belongs to a new family of growth factors with adenosine deaminase activity. *Biochem. J.* 391, 51–57
- 49. Vahey, M. T., Wang, Z., Kester, K. E., Cummings, J., Heppner, D. G., Jr., Nau, M. E., Ofori-Anyinam, O., Cohen, J., Coche, T., Ballou, W. R., and Ockenhouse, C. F. (2010) Expression of genes associated with immunoproteasome processing of major histocompatibility complex peptides is indicative of protection with adjuvanted RTS,S malaria vaccine. *J. Infect Dis.* **201**, 580–589
- Kester, K. E., Cummings, J. F., Ofori-Anyinam, O., Ockenhouse, C. F., Krzych, U., Moris, P., Schwenk, R., Nielsen, R. A., Debebe, Z., Pinelis, E., Juompan, L., Williams, J., Dowler, M., Stewart, V. A., Wirtz, R. A., Dubois, M. C., Lievens, M., Cohen, J., Ballou, W. R., Heppner, D. G., Jr., and Rts, S. V. E. G. (2009) Randomized, double-blind, phase 2a trial of falciparum malaria vaccines RTS,S/AS01B and RTS,S/AS02A in malaria-naive adults: safety, efficacy, and immunologic associates of protection. J. Infect. Dis. 200, 337–346
- Bolstad, B. M., Irizarry, R. A., Astrand, M., and Speed, T. P. (2003) A comparison of normalization methods for high density oligonucleotide array data based on variance and bias. *Bioinformatics* 19, 185–193
- Bergsbaken, T., Fink, S. L., and Cookson, B. T. (2009) Pyroptosis: host cell death and inflammation. *Nat. Rev. Microbiology* 7, 99–109
- 53. Greenberg, D. P., Vadheim, C. M., Wong, V. K., Marcy, S. M., Partridge, S., Greene, T., Chiu, C. Y., Margolis, H. S., and Ward, J. I. (1996) Comparative safety and immunogenicity of two recombinant hepatitis B vaccines given to infants at two, four and six months of age. *Pediatr. Infect. Dis. J.*

**15,** 590–596

- Poolman, J. T. (2014) Shortcomings of pertussis vaccines: why we need a third generation vaccine. *Expert Rev. Vaccines* 13, 1159–1162
- Fierens, K., and Kool, M. (2012) The mechanism of adjuvanticity of aluminium-containing formulas. *Current Pharmaceut. Design* 18, 2305–2313
- Jacobson, L. S., Lima, H., Jr., Goldberg, M. F., Gocheva, V., Tsiperson, V., Sutterwala, F. S., Joyce, J. A., Gapp, B. V., Blomen, V. A., Chandran, K., Brummelkamp, T. R., Diaz-Griffero, F., and Brojatsch, J. (2013) Cathepsin-mediated necrosis controls the adaptive immune response by Th2 (T helper type 2)-associated adjuvants. *J. Biol. Chem.* 288, 7481–7491
- Pettengill, M. A., van Haren, S. D., and Levy, O. (2014) Soluble mediators regulating immunity in early life. *Frontiers Immunol.* 5, 457
- Pettengill, M., Robson, S., Tresenriter, M., Millan, J. L., Usheva, A., Bingham, T., Belderbos, M., Bergelson, I., Burl, S., Kampmann, B., Gelinas, L., Kollmann, T., Bont, L., and Levy, O. (2013) Soluble ecto-5'-nucleotidase (5'-NT), alkaline phosphatase, and adenosine deaminase (ADA1) activities in neonatal blood favor elevated extracellular adenosine. *J. Biol. Chem.* **288**, 27315–27326
- Latz, E., Franko, J., Golenbock, D. T., and Schreiber, J. R. (2004) Haemophilus influenzae type b-outer membrane protein complex glycoconjugate vaccine induces cytokine production by engaging human toll-like receptor 2 (TLR2) and requires the presence of TLR2 for optimal immunogenicity. *J. Immunol.* **172**, 2431–2438
- Fransen, F., Stenger, R. M., Poelen, M. C., van Dijken, H. H., Kuipers, B., Boog, C. J., van Putten, J. P., van Els, C. A., and van der Ley, P. (2010) Differential effect of TLR2 and TLR4 on the immune response after

immunization with a vaccine against Neisseria meningitidis or Bordetella pertussis. *PLoS ONE* **5**, e15692

- 61. David, S., Vermeer-de Bondt, P. E., and van der Maas, N. A. (2008) Reactogenicity of infant whole cell pertussis combination vaccine compared with acellular pertussis vaccines with or without simultaneous pneumococcal vaccine in the Netherlands. *Vaccine* 26, 5883–5887
- Hayashi, F., Means, T. K., and Luster, A. D. (2003) Toll-like receptors stimulate human neutrophil function. *Blood* 102, 2660–2669
- Garlanda, C., Bottazzi, B., Salvatori, G., De Santis, R., Cotena, A., Deban, L., Maina, V., Moalli, F., Doni, A., Veliz-Rodriguez, T., and Mantovani, A. (2006) Pentraxins in innate immunity and inflammation. *Novartis Foundation Symposium* **279**, 80–86; *discussion* 86- **91**, 216–219
- Bradley, L. M., Douglass, M. F., Chatterjee, D., Akira, S., and Baaten, B. J. (2012) Matrix metalloprotease 9 mediates neutrophil migration into the airways in response to influenza virus-induced toll-like receptor signaling. *PLoS Pathogens* 8, e1002641
- Hu, F., Ku, M. C., Markovic, D., a Dzaye, O. D., Lehnardt, S., Synowitz, M., Wolf, S. A., and Kettenmann, H. (2014) Glioma-associated microglial MMP9 expression is upregulated by TLR2 signaling and sensitive to minocycline. *Int. J. Cancer* **135**, 2569–2578
- Garcon, N., Segal, L., Tavares, F., and Van Mechelen, M. (2011) The safety evaluation of adjuvants during vaccine development: the AS04 experience. *Vaccine* 29, 4453–4459
- Wilby, K. J., Lau, T. T., Gilchrist, S. E., and Ensom, M. H. (2012) Mosquirix (RTS,S): a novel vaccine for the prevention of Plasmodium falciparum malaria. *Ann. Pharmacotherapy* 46, 384–393 bfl