



# Approaching Inflammation Paradoxes—Proinflammatory Cytokine Blockages Induce Inflammatory Regulators

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The mechanisms that underlie various inflammation paradoxes, metabolically healthy obesity, and increased inflammations after inflammatory cytokine blockades and deficiencies remain poorly determined. We performed an extensive -omics database mining, determined the expressions of 1367 innate immune regulators in 18 microarrays after deficiencies of 15 proinflammatory cytokines/regulators and eight microarray datasets of patients receiving Mab therapies, and made a set of significant findings: 1) proinflammatory cytokines/regulators suppress the expressions of innate immune regulators; 2) upregulations of innate immune regulators in the deficiencies of IFNy/ IFN $\gamma$ R1, IL-17A, STAT3 and miR155 are more than that after deficiencies of TNF $\alpha$ , IL-1 $\beta$ , IL-6, IL-18, STAT1, NF-kB, and miR221; 3) IFNy, IFNyR and IL-17RA inhibit 10, 59 and 39 proinflammatory cytokine/regulator pathways, respectively; in contrast, TNFα, IL-6 and IL-18 each inhibits only four to five pathways; 4) The IFNy-promoted and -suppressed innate immune regulators have four shared pathways; the IFNyR1-promoted and -suppressed innate immune regulators have 11 shared pathways; and the miR155-promoted and -suppressed innate immune regulators have 13 shared pathways, suggesting negativefeedback mechanisms in their conserved regulatory pathways for innate immune regulators; 5) Deficiencies of proinflammatory cytokine/regulator-suppressed, promoted programs share signaling pathways and increase the likelihood of developing 11 diseases including cardiovascular disease; 6) There are the shared innate immune regulators and pathways between deficiency of TNFa in mice and anti-TNF therapy in clinical patients;

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7) Mechanistically, up-regulated reactive oxygen species regulators such as myeloperoxidase caused by suppression of proinflammatory cytokines/regulators can drive the upregulation of suppressed innate immune regulators. Our findings have provided novel insights on various inflammation paradoxes and proinflammatory cytokines regulation of innate immune regulators; and may re-shape new therapeutic strategies for cardiovascular disease and other inflammatory diseases.

Keywords: proinflammatory cytokine blockage, proinflammatory cytokines, inflammation, innate immune regulators, reactive oxygen species

### INTRODUCTION

Cardiovascular diseases (CVDs), which include coronary heart disease, hypertension, stroke, and peripheral artery disease, collectively comprise the number one cause of death globally (1, 2). Our and others' recent reports showed that CVD stressors and risk factors such as hyperlipidemia (3, 4), hyperglycemia (5), hyperhomocysteinemia (6, 7), and chronic kidney disease (8–10), promote atherosclerosis and vascular inflammation via several mechanisms. These mechanisms include endothelial cell activation (3, 11-14) and injury (15); caspase-1/inflammasome activation (8, 10), mitochondrial reactive oxygen species (ROS) (4); differentiation of Ly6C<sup>high</sup> mouse monocytes and CD40<sup>+</sup> human monocytes (7, 16-18); decreased/transdifferentiated CD4<sup>+</sup>Foxp3<sup>+</sup> regulatory T cells (Treg) (19–22); impaired vascular repairability of bone marrow-derived progenitor cells (23, 24); downregulated histone modification enzymes (25) and increased expressions of trained immunity pathway enzymes (26). These reports have clearly demonstrated that inflammation mechanisms play significant roles in the initiation and pathogenesis of vascular inflammation and atherosclerosis.

Proinflammatory cytokines (PCs) are key regulators of inflammation, participating in acute (27) and chronic inflammation *via* a complex and sometimes seemingly contradictory network of interactions (28). Numerous reports of gene deficiency within

mouse models showed that while PCs promote vascular inflammation and atherosclerosis; deficiencies of these cytokine genes lead to decreased atherosclerosis. In contrast, several antiinflammatory cytokines inhibit vascular inflammation and atherosclerosis, and the deficiencies of those anti-inflammatory cytokine genes result in increased inflammation and atherosclerosis (29). This recent progress led to the development of many cytokine blockage-based therapies for inflammatory diseases and CVDs. The CANTOS trial with the monoclonal antibody (Mab) Canakinumab to block proinflammatory cytokine interleukin-1ß (IL-1 $\beta$ ) was a recent success in treating coronary artery disease (30). However, recent reports from our and others' teams suggest that inhibition of one or more proinflammatory regulators such as cytokines or microRNAs (miRs) can lead to new waves of inflammation. In our previous studies, deficiency of proinflammatory microRNA-155 (miR155) in atherogenic apolipoprotein E knockout (ApoE KO, or ApoE<sup>-/-</sup>) mice results in the establishment of the first metabolically healthy obesity (MHO) mouse model with decreased aortic atherosclerosis, increased obesity, white adipose tissue hypertrophy and non-alcoholic fatty liver disease but without insulin resistance (31). In another report we showed that, analyzing 109 microRNAs (miRs) reported in four hyperlipidemia-related diseases (HRDs) such as atherosclerosis, non-alcoholic fatty liver disease (NAFLD), obesity, and type II diabetes (T2DM), we found that miR155 and miR221 are significantly modulated in all four HRDs. We hypothesized that miR155 is a proinflammatory, proatherogenic but obesitysuppressed master regulator. Deficiency of miR155 results in a "second wave of inflammation" in the high-fat feeding MHO model, which is our proposed new concept. Indeed, our results showed that high-fat feeding leads to a new "second wave of inflammation", as we termed, in miR155<sup>-/-</sup>/ApoE<sup>-/-</sup> MHO mice with increased plasma proinflammatory adipokines leptin and resistin in plasma and white adipose tissue (32). In addition, biological disease-modifying antirheumatic drugs (bDMARDs) targeting inflammatory cytokines have expanded the treatment options for patients with rheumatoid arthritis (RA) (33), inflammatory bowel disease, psoriatic arthritis, severe psoriasis, autoinflammatory disease, Castleman disease, and plaque psoriasis (Table S1) (34). As shown in Table 1, the therapies of tumor necrosis factor- $\alpha$  (TNF- $\alpha$ ) targeting monoclonal antibody (Mab) adalimumab and IL-6 receptor (IL-6R) targeting Mab sarilumab could lead to injection site reactions (sarilumab), worsening RA (adalimumab) and increased incidences of infections (sarilumab: 28.8%; adalimumab: 27.7%) in patients

Abbreviations: CVDs, cardiovascular diseases; IGs, innatomic genes (innate immune genes/regulators); PCs, proinflammatory cytokines/regulators; ROS, reactive oxygen species; Treg, regulatory T cells; IL-1β interleukin-1β; miRs: microRNAs; miR155, microRNA-155; KO, knock-out; MHO, metabolically healthy obesity; RA, rheumatoid arthritis; TNFa, tumor necrosis factor-a; Mab, monoclonal antibody; IL-6R, IL-6 receptor; DAMPs, danger associated molecular patterns; PAMPs, pathogen associated molecular patterns; NCDs, non-communicable diseases; NIH, National Institutes of Health; NCBI, National Center for Biotechnology Information; GEO, Gene Expression Omnibus; IPA: Ingenuity Pathway Analysis; GSEA, Gene Set Enrichment Analysis; IFNy, interferon-y, STAT1, signal transducer and activator of transcription protein 1; IKK2, Inhibitor of NFKB kinase subunit-β; TRAF6, TNF receptor associated factor 6; IRAK1, interleukin-1 receptor-associated kinase 1; PBMCs, peripheral blood mononuclear cell populations; Th1, type 1 T helper cells; HMGB1, high mobility group box 1; STAT4, signal transducer and activator of transcription 4; Erk1/2, extracellular signal-regulated protein kinases 1 and 2; Pyk2, proline-rich tyrosine kinase 2; CrkL, CRK like proto-oncogene; iCOS, inducible T-cell co-stimulator; NF-AT, nuclear factor of activated T cells; IRF, interferon regulatory factor; HGF, hepatocyte growth factor; JAK, Janus kinases; MIF: macrophage migration inhibitory factor; PAK, p21-activated kinase; PI3K, phosphatidylinositol-3-kinase; AKT, protein kinase B; cAMP, cyclic adenosine monophosphate; TFs, transcription factors; PD-1, programmed cell death protein-1; DC, dendritic cells; mtROS, mitochondrial ROS; MPO, myeloperoxidase; NES, normalized enrichment score; FDR, false discovery rate; NK, natural killer.

| Proinflammatory<br>cytokines |       | Related findings  | Changes of inflammation related genes   | The related pathway  | PMID                 |
|------------------------------|-------|---|---|--|----------------------|
| TNF                          | Human | The incidences of infections and worsening RA were about 27.7% and 0.5% in Adalimumab treatment.  | N/A   | N/A  | 27856432             |
|                              |       | The risk of serious infections increased 2 folds in patients with RA treated with anti-TNF antibody.  | N/A   | N/A  | 16705109             |
|                              |       | Paradoxical inflammation occurred involving the skin, joints and lungs under anti-TNF treatment in patients with inflammatory bowel disease.                                  | IFN-α production; IL12B<br>and IL23R increased.                                       | type I IFN signaling; the differentiation of<br>naïve T cells towards TH1 (via IL-12) or<br>TH17 (via IL-23) cells | 22751454             |
|                              |       | The incidences of pneumonia were 2.2% and 1.4% using TNF antibodies Infliximab and Etanercept for RA.   | N/A   | N/A  | 20877307             |
|                              |       | Anti-TNF $\alpha$ therapy up-regulated IL6 and IL23p19, in patients with Crohn's disease; IL-1B and IL17A remained up-regulated in patients refractory to anti-TNF $\alpha$ . | IL-1B and IL17A are up-<br>regulated in<br>nonresponders.                             | IL17A pathway  | 24700437             |
|                              |       | During anti-TNF therapy, there are upregulations of IL-23p19,<br>IL23R, and<br>IL-17A in patients with Crohn's disease  | IL23R, IL17A, IL17F and<br>TNFR2 are up-regulated in<br>nonrespinders.                | IL23R signalling   | 29848778             |
|                              | Mouse | TNF overexpression was cardioprotective<br>In macrophages, TNF produced less cytokines after challenged   | N/A<br>suppress IL6, TNF, IL-1β   | canonical NF-κB pathway signaling<br>LPS-induced signaling   | 26280121<br>21602809 |
|                              |       | with LPS.<br>In Tnf KO tumor tissues, tumor-promoting cytokines induced   | production<br>the expression levels of IL-<br>1b, IL-6, CXCL1 and<br>CXCL2 increased. | COX-2/PGE2, IL-1b, IL-6 and CXCL1/2 pathways   | 23975421             |
| IL1B                         | Human | For atherosclerotic therapy, incidence rates of deaths attributed<br>to infection or sepsis in Canakinumab groups were higher.  | N/A   | N/A  | 28845751             |
|                              |       | Severe infections were more frequent in Canakinumab group in patients with JIA.   | N/A   | N/A  | 23252526             |
| IL6                          | Human | Incidences of infections were about 28.8% when Sarilumab monotherapy treat patients with RA.  | N/A   | N/A  | 27856432             |
|                              |       | In multiple myeloma patients, anti-IL6 antibodies did not<br>prevent IL6 production.  | IL6   | N/A  | 8823310              |
|                              | Mouse | Treating patients with RA with Tocilizumab increased infections.<br>IL-6 provided protection against influenza A infection.   | N/A<br>Mcl-1 and Bcl-X L were<br>down-regulated.                                      | N/A<br>IL-6 or IL-6R signals   | 21884601<br>22294047 |
| IL17A                        | Human | In patients with Crohn's disease for treatment with<br>Secukinumab, 51.3% infections were observed  | CRP, and/or faecal calprotectin elevated  | N/A  | 22595313             |
|                              |       | Incidences of severe infection were 1% in Ixekizumab in the treatment of AS or RAS.   | N/A   | N/A  | 30360964             |
| IL18                         | Human | Inhibition of IL-18 using GSK1070806 did not improve glucose control  | N/A   | N/A  | 26930607             |
|                              | Mouse | Decrease in IL-18 in mice that were deficient in NLRP6 inflammasome was involved in enhanced colitogenic microbiota   | NLRP6, ASC, caspase-1   | NLRP6 flammasome pathway   | 21565393             |
|                              |       | I18 or I18 receptor KO mice led to hyperphagia, obesity and insulin resistance  | activation of STAT3 phosphorylation   | STAT3 pathway  | 16732281             |

TNF, tumor necrosis factor; LPS, Lipopolysaccharide; IL, Interleukin; IFN, interferon; NF-kB, nuclear factor kappa B; CXCL, chemokine (C-X-C motif) ligand; COX-2/PGE2, prostaglandinendoperoxide 2; McI-1, MCL1 apoptosis regulator; CRP, C-reactive protein; NLRP6, NLR family pyrin domain containing 6; ASC, apoptosis-associated speck-like protein; STAT3, signal transducer and activator of transcription 3; RA, Rheumatoid arthritis; JIA, juvenile idiopathic arthritis; AS, ankylosing spondylitis; RAS, radiographic axial spondyloarthritis; N/A, Not applicable.

The increased incidences of infections occurred when antibodies blocking proinflammatory cytokines were used to treat patients with inflammatory diseases. Experimental animal studies showed proinflammatory cytokine knockout or blocking can induce other cytokines production and activate some inflammation related pathways.

(35). Moreover, it was reported that paradoxical inflammations such as psoriasiform lesions, arthritis are induced by anti-TNF Mabs in some patients with Crohn's disease and ulcerative colitis (36). Furthermore, it has been found that anti-IL-1 $\beta$  Mab Canakinumab is associated with a higher incidence of fatal infection than placebo (30). Finally, it was reported that unfavorable responses on anti-IL-17A Mab secukinumab are driven by patients with elevated inflammatory markers such as C-reactive protein (37).

In addition, various inflammation paradoxes have been reported including new inflammations occur when: *i*) particular cytokine genes and inflammatory regulators are mutated (38); *ii)* patients experience somatic mutations (39) and inflammageing (40); *iii*) PCs are weakened due to single nucleotide polymorphism (41); *iv*) cytokine blockage therapies are used; *v*) genes encoded PCs and other regulators are knocked-out in mice; *vi*) inflammation is resurged when MHO undergoes a transition to classical metabolically unhealthy obesity (31, 32) in response to the long term stimulation of metabolic disease risk factors such as hyperlipidemia, danger associated molecular patterns (DAMPs) and conditional DAMPs as we reported (42); *vii*) an obesity paradox exists, wherein obese individuals survive sepsis at higher rates than their normal-weight counterparts (43); *viii*) inflammation paradoxes are observed in the Amazon region showing that the

indigenous Tsimane in Bolivia appears protected against noncommunicable metabolic inflammatory diseases (NCDs) such as obesity, type 2 diabetes, and CVDs despite increased inflammatory markers (44); and *ix*) A widely discussed physiological puzzle of mammalian pregnancy is the immunological paradox, the semiallogenic fetus is not attacked by the mother's adaptive immune system (45). These inflammation paradoxes were summarized in **Table S2**. In an attempt to solve these paradoxes, we examined a significant issue that remains unknown: why proinflammatory regulator blockage therapies lead to a "secondary wave of inflammation" (32).

Similar to single cytokine targeting Mab therapies discussed above, one of the current research strategies is to use genedeficient mouse models and transgenic mouse models to determine the dominant effects of these inflammatory regulators in disease models such as atherogenesis (29, 46). Numerous disease risk factors have been identified to induce metabolic CVDs and other inflammatory diseases, such as hyperlipidemia, hyperglycemia, hyperhomocysteinemia, obesity, hypertension, and cigarette smoke (29, 47). It has been documented that inflammation and metaflammation are evolutionally conserved; the underlying pathways are crosstalking (48). However, the issue remains unknown whether in proinflammatory "regulator A" deficiency conditions, disease risk factors promote the regulator A-suppressed secondary wave of inflammation as we termed in our recent report (32).

InnateDB (https://www.innatedb.com/) is a comprehensive database on innate immune regulatory genes, which has been developed to facilitate systems-level investigations of the mammalian (human, mouse and bovine) innate immune response (49). This list of innate immune regulators in the InnateDB database (innatome) is especially useful for us to analyze the expression changes of innate immune regulators in the presence and absence of certain immune regulators. In order to improve our understanding on the expression changes in the innatome in the presence and absence of proinflammatory regulators, we examined our novel hypothesis that proinflammatory cytokine blockages induce inflammatory regulators. To test this hypothesis, we performed an extensive -omics database mining, determined the expressions of 1367 innate immune regulators (innatomic genes, IGs) in 18 microarrays after deficiencies of 15 PCs and made a set of significant findings. Our findings will provide novel insights on various inflammation paradoxes and PC regulation of IGs; and may re-shape new therapeutic strategies for various inflammations.

## MATERIALS AND METHODS

### Expression Profile of IGs in Microarray Data For Patients With Various Inflammatory Diseases and Receiving Cytokine Targeting Mab Therapy for Various Proinflammatory Cytokine Gene Deficiencies

The 18 murine microarray datasets of proinflammatory cytokine gene deficiencies and eight microarray datasets of patients receiving Mab therapies were collected from National Institutes of Health (NIH)-National Center for Biotechnology Information (NCBI)-Gene Expression Omnibus (GEO) databases (https:// www.ncbi.nlm.nih.gov/gds/) and analyzed with an online software GEO2R (https://www.ncbi.nlm.nih.gov/geo/geo2r/). The detailed information of these GEO datasets was shown in **Table 2A** and **2B** and related mechanism tables or figures. The original microarray experiments used different cells, which prevented us from comparing the effects of proinflammatory regulators in regulating IGs in the same cell types. Of note, our approach was well justified. For example, as a common practice, we (50) and others (51) often studied gene expression in nonideal heterogenous peripheral blood mononuclear cell populations (PBMCs) in pathophysiological conditions, which are actually composed of many cell types (also see the Discussion section). The used IGs and ROS regulator gene -lists were listed in **Table S3**.

### **Statistical Analysis of Microarray Data**

Six house-keeping genes including ACTB, CHMP2A, RPL27, SRP14, RPL22 and OAZ1 (**Table S4**) in all GEO datasets regardless of species that were chosen for this study. The house-keeping gene list was extracted from the list provided by Eisenberg and de Jonge (52, 53). Briefly, the mean fold change (FC) of house-keeping genes between treatment and control groups vary from 0.79 to 1.13 (53). As this variation was very narrow, we concluded that the datasets (**Table 2A** and **2B**) were of high quality. Genes with expression changes more than 2-folds in microarrays were defined as the upregulated genes, while genes whose expressions decreased more than 2-fold in microarrays were defined as downregulated genes. Simply, genes with the expression changes at |log2FC|>1 and p<0.05 were defined as the differentially expressed genes.

### **Ingenuity Pathway Analysis**

We utilized Ingenuity Pathway Analysis (IPA, Qiagen, https:// www.qiagenbioinformatics.com/products/ingenuity-pathwayanalysis/) to characterize clinical relevance and molecular and cellular functions related to the identified genes in our microarray analysis. Differentially expressed genes were identified and uploaded into IPA for analysis. The core and pathways analyses were used to identify molecular and cellular pathways, as we have previously reported (54, 55).

# RESULTS

### Proinflammatory Cytokines (PCs) Suppress Innatomic Genes (IGs); Upregulated IGs in the Deficiencies of IFN $\gamma$ , IFN $\gamma$ R1, IL-17A, STAT3, and miR155 Are More Than That of the Deficiencies of TNF $\alpha$ , IL-1 $\beta$ , IL-6, IL-18, STAT1, NF-kB, and miR221

The studies using the compound gene-deficient mice established with specific cytokine deficiency crossing to two atherogenic mouse models such as apolipoprotein E deficient (ApoE<sup>-/-</sup>), and low-density lipoprotein receptor-deficient (LDLR<sup>-/-</sup>) background have significantly improved our understanding on the roles of these PCs

**TABLE 2A** | 18 microarray datasets were collected to analyze the changes of innate immunity molecules (innatomic genes, IGs) in deficiencies of proinflammatory regulators ( $\rho < 0.05$ , |log2FC|>1).

| No. | Factors   | GEO NO.        | Method                  | h              | nnatomic gei | nes (total n=1   | 376)  | Background | Cell type/tissue            | PMID     |
|-----|-----------|----------------|-------------------------|----------------|--------------|------------------|-------|------------|-----------------------------|----------|
|     |           |                |                         | Up-regulatedN% |              | Down-regulatedN% |       |            |                             |          |
|     | Proinflam | matory cytoki  | nes                     |                |              |                  |       |            |                             |          |
| 1   | TNF       | GSE43145       | Tnfa KO <sup>a</sup>    | 52             | 3.78         | 24               | 1.74  | C57BL/6    | Glandular stomach           | 23975421 |
| 2   |           | GSE33253       | Tnfr1,2 KO <sup>b</sup> | 32             | 2.33         | 171              | 12.43 | C57BL/6    | Tumor endothelial           | 23056240 |
| 3   | IFNG      | GSE9892        | lfng KO <sup>c</sup>    | 81             | 5.89         | 138              | 10.03 | BALB/c     | Liver                       | 19490417 |
| 4   |           | GSE39592       | lfngr1 KO               | 111            | 8.07         | 82               | 5.96  | C57BL/6    | CD4+ T                      | 23575689 |
| 5   | IL1B      | GSE15750       | Traf6 KO#               | 10             | 0.73         | 22               | 1.60  | C57BL/6    | CD8 T                       | 19494812 |
| 6   |           | GSE73875       | lrak1 KO                | 7              | 0.51         | 0                | 0.00  | C57BL/6    | CD4+ CD26L+ T               | 26561545 |
| 7   | IL6       | GSE63761       | II6 KO                  | 44             | 3.20         | 13               | 0.94  | C57BL/6    | adipose                     | 25738456 |
| 8   | IL17      | GSE88800       | ll17ra KO               | 141            | 10.25        | 50               | 3.63  | N/A        | kidney                      | 27814401 |
| 9   | IL18      | GSE64308       | 18 KO                   | 48             | 3.49         | 12               | 0.87  | C57BL/6    | brown adipose               | 30453990 |
| 10  |           | GSE64309       | II18 KO                 | 40             | 2.91         | 51               | 3.71  | C57BL/6    | Liver                       | 27063959 |
| 11  |           | GSE64310       | 18 KO                   | 10             | 0.73         | 6                | 0.44  | C57BL/6    | Kidney                      | 29514661 |
|     | ProInflam | matory related | d transcription fa      | actor          |              |                  |       |            |                             |          |
| 12  | STAT      | GSE40666       | Stat1 KO                | 48             | 3.49         | 25               | 1.82  | C57BL/6    | CD8 T                       | 22968462 |
| 13  |           | GSE6846        | Stat3 KO                | 108            | 7.85         | 32               | 2.33  | N/A        | pulmonary type II epithelia | 18070348 |
| 14  | NFKB      | GSE45755       | Rela KO                 | 26             | 1.89         | 3                | 0.22  | C57BL/6    | lineage-Flk2-c-kit+Sca-1+   | 23670180 |
| 15  |           | GSE30049       | lkk2 KO                 | 47             | 3.42         | 83               | 6.03  | N/A        | tumor-derived cell line     | 22327365 |
|     | Inflamma  | tory-related m | iRNAs                   |                |              |                  |       |            |                             |          |
| 16  | MIR155    | GSE45122       | mir155 KO               | 21             | 1.53         | 13               | 0.94  | C57BL/6    | CD4+ IL-17F RFP+ T          | 23686497 |
| 17  |           | GSE66815       | mir155 KO               | 86             | 6.25         | 82               | 5.96  | C57BL/6    | spleen                      | 25911753 |
| 18  | MIR221    | GSE19777       | MIR221 KD               | 18             | 1.31         | 39               | 2.83  | N/A*       | breast cancer               | 21057537 |

Up, up-regulated IGs; Down, down-regulated IGs; KO, Knockout; KD, Knockdown; N/A, Not applicable; The significant differential expressed IGs were the comparison results between the major inflammatory KO and the parallel control. Please note: <sup>a</sup>Tnfa KO Gan mice vs. WT Gan mice; <sup>b</sup>Tnfr1,2 KO B16F1 melanoma tumors vs. WT B16F1 melanoma tumors; <sup>c</sup>based on the Tgfb KO model mice of autoimmune hepatitis; #the combined data of Traf6 KO 6 days and 10 days because of the small number of the regulated innate immune genes; <sup>t</sup>Homo sapiens. Tnfr, tumor necrosis factor receptor superfamily; Ifingr1, interferon gamma receptor 1; Traf6, TNF receptor associated factor 6. It mediates signaling from members of the TNF receptor superfamily as well as the Toll/L-1 family; Irak1, interleukin-1 receptor-associated kinase 1; Rela, v-rel reticuloendotheliosis viral oncogene homolog A; Ikk2, inhibitor of kappaB kinase beta. In gene KO experiments, for the pro-inflammatory cytokines, we focus on the up-regulated innate immune genes, those maybe inhibited by the proinflammatory cytokines during inflammation.

Table showing the number and the ratio of the up-regulated and down-regulated IGs in proinflammatory molecules KO or KD microarrays. From the data, in majority microarrays, the ratio of up-regulated IGs is higher than that of down-regulated IGs (marked in bold). **Table S4** listed the housekeeping genes changes, the criteria for selecting a database in this study based on the housekeeping genes changes with p > 0.05 or Ilog2FCI<1 between treated group and control group. **Table S5** listed the detailed expression changes of IGs.

TABLE 2B | The innatomic genes (IGs) were analyzed in cytokine-monoclonal antibodies therapy microarrays.

| GEO#      | # Disease Target     |       | Drug                     | Tissue Comparation |  | I   |      | PMID     |
|-----------|----------------------|-------|--------------------------|--------------------|--|-----|------|----------|
|           |                      |       |                          |                    |  | up  | down |          |
| GSE15602  | rheumatoid arthritis | TNF   | Adalimumab               | synovium           | poor responder vs. good responder      | 73  | 67   | 19389237 |
| GSE111761 | Crohn's disease      | TNF   | Infliximab or Adalimumab | intestine          | none-responder vs. responder           | 381 | 113  | 29848778 |
| GSE92415  | ulcerative colitis   | TNF   | Golimumab                | colonic mucosa     | none-responder vs. responder (6 weeks) | 18  | 2    | 29981298 |
| GSE14580  | ulcerative colitis   | TNF   | Infliximab               | colonic mucosa     | none-responder vs. responder           | 106 | 14   | 19700435 |
| GSE24742  | rheumatoid arthritis | TNF   | Rituximab                | synovium           | good-responder 12 weeks vs.0 week      | 29  | 42   | 21337318 |
|           | rheumatoid arthritis | TNF   | Rituximab                | synovium           | moderate-responder 12 weeks vs.0 week  | 21  | 73   | 21337318 |
|           | rheumatoid arthritis | TNF   | Rituximab                | synovium           | poor-responder 12 weeks vs.0 week      | 33  | 28   | 21337318 |
| GSE45867  | rheumatoid arthrtis  | IL6R  | Tocilizumab              | synovium           | after therapy 12 weeks vs.before       | 2   | 23   | 24449571 |
| GSE31652  | psoriasis vulgaris   | IL17A | LY2439821                | skin               | LY2439821 2 weeks vs.0 weeks           | 47  | 87   | 22677045 |

The results showed that the IGs were more down-regulated than up-regulated after therapy compared with before therapy or with placebo; the IGs were more up-regulated than downregulated when poor responder or non-responder compared with responder or good responder (marked in bold). **Table S6** listed the detail expression changes of IGs in cytokinemonoclonal antibodies therapy microarrays.

on atherosclerotic progression. Deficiencies of TNF $\alpha$ , IL-1 $\beta$ , IL-18 and interferon- $\gamma$  (IFN $\gamma$ ) lead to a significant reduction of atherosclerotic lesions. However, the parts of atherosclerotic lesions remain in those proinflammatory cytokine deficient and ApoE<sup>-/-</sup> double gene KO mice. The atherosclerotic lesions remain 66% for TNF<sup>-/-</sup>/ApoE<sup>-/-</sup>, 66% for IL-1 $\beta^{-/-}$ /ApoE<sup>-/-</sup>, 65% for IL-18<sup>-/-</sup>/ ApoE<sup>-/-</sup> and 25% for IFN $\gamma^{-/-}$ /LDLR<sup>-/-</sup> mice, respectively (**Figure 1A**).

The remained atherosclerotic lesions may be contributed towards by the following factors (**Figure 1B**): *1*) the specific cytokine "A"independent proinflammatory, proatherogenic cytokines and factors, and *2*) proinflammatory, proatherogenic cytokines and factors suppressed by the specific cytokine "A". These two factors, especially the proinflammatory/proatherogenic cytokines/factors suppressed by the specific deficient cytokine "A", remained



unknown. In addition, we proposed a recently so-called "second wave of inflammatory responses" (32) for proinflammatory miR155 suppressed proinflammatory adipokines leptin and resistin, which may result from direct suppression of these proinflammatory adipokines by miR155 or indirect suppression of adipogenesis by miR155 (31). The second wave of inflammatory responses is required to protect the organism from infections or other pathologies at least when the following situations occur in the paradoxes introduced above when PCs are deficient and/or downregulated. Moreover, as shown in Table 1, proinflammatory cytokine-blocking therapies may paradoxically lead to increased inflammation, and increased incidences of infections. Finally, experimental animal studies (Table 1), with gene-deficient mouse models of PCs, proinflammatory cytokine knockout or blocking induced other cytokines production and activate some inflammation-related pathways was shown. In summary, our and others' reports demonstrated that in some diseases and pathophysiological relevant conditions when proinflammatory regulators are deficient or inhibited, other PCs and IGs are upregulated.

Since the pathways underlying inflammations and **meta**flammations are cross-talked (48), the interaction modes can be classified into three categories: *i*) agonism and synergy; *ii*) inhibition and antagonism; and *iii*) parallel and independence. To determine the mechanisms underlying cytokine targeting Mab therapies-induced inflammation and PC deficiencies-

induced inflammation, we hypothesize that the deficiencies of PCs upregulate IGs in addition to downregulating IGs. We applied the -omics database mining methods and principles that we pioneered in 2004 (56, 57) to this study. The detailed features and justification of this data mining approach were highlighted in Table 1 of our recent paper (47). We examined a comprehensive list of IGs collected in the InnateDB database (https://www.innatedb.com/), which had a total of 1367 genes. Panoramic profiling of the expressions of IGs in PC deficiency microarray datasets would lead to high throughput characterization on transcriptomic regulation of the PCs on IGs. Table 2A and 2B are the results of the changes of IGs in deficiencies of PCs and in cytokine-monoclonal antibodies therapy microarrays, respectively. Table S5 and Table S6 listed the detailed expression changes of IGs. As shown in Table 2A, we found 11 cytokine gene knock-out (KO) microarray datasets, four proinflammatory transcription factor KO datasets, three proinflammatory microRNA KO datasets, including TNFa and TNFR1,2 KO, IFNγ and IFNγ receptor 1 (IFNγR1) KO, IL-1β pathway-related TNF receptor associated factor 6 (TRAF6) and interleukin-1 receptor-associated kinase 1 (IRAK1) KO, one IL-6 KO, one IL-17 receptor A (IL-17RA) KO, three IL-18 KO, one signal transducer and activator of transcription protein 1 (STAT1) KO, one STAT3 KO, one NF-kB subunit Rela KO, one Inhibitor of NFKB kinase subunit-β (IKK2) KO, two microRNA-155 (miR155) KO and one miR221 KD (knock-down). The results

in Table 2A showed that: i) the deficiencies of all the 18 proinflammatory regulators lead to upregulation of IGs from 0.51% to 10.25% out of a total of 1367 IGs; ii) upregulated IGs in the deficiencies of IFNy, IFNyR1, IL-17A, STAT3 and miR155 are more than that of the deficiencies of TNF $\alpha$ , IL-1 $\beta$ , IL-6, IL-18, STAT1, NF-kB, and miR221; and iii) the deficiencies of IFNy, IFNyR1, IL-17RA, STAT3 and miR155 lead to high upregulation of IGs by 5.89%, 8.07%, 10.25%, 7.85% and 6.25%, respectively, in normal cell types and tissues including  $CD4^+$  T cells (IFN $\gamma$  KO), kidney (IL-17 KO), pulmonary type II epithelial cells (STAT3 KO) and spleen (miR155 KO). Of note, the roles of IL-17 in promoting atherosclerosis development have been controversial as we (58), and others reported (46). However, the pro-atherogenic roles of TNF $\alpha$  and IFN $\gamma$  have been well documented (46, 59). Therefore, our results have demonstrated for the first time that PCs suppress the expressions of some IGs; and upregulated IGs in the deficiencies of IFNy, IFNyR1, IL-17RA, STAT3 and miR155 are more than that in the deficiencies of TNF $\alpha$ , IL-1 $\beta$ , IL-6, IL-18, STAT1, NF-kB, and miR221. These results have suggested that IFNy, IFNyR1, IL-17RA, STAT3 and miR155 suppress more IGs expressions than other cytokines.

In microarray datasets of patients receiving Mab therapy (**Table 2B**), the results showed that more IGs were downregulated than upregulated when after therapy compared with the group before therapy or with placebo; more IGs were upregulated than downregulated when poor responder or non-responder compared with the group responders or good responders. On the one hand, the results confirm the efficacy of Mab in most of patients with autoimmune diseases, on the other hand, the results cannot deny the condition that in drug none-responders: "suppressed cytokines or innate immune regulator molecules" were upregulated.

We hypothesized that PCs are cross-talked and share their regulation on the expression of IGs. To test this hypothesis, we performed a Venn Diagram analysis on the upregulated IGs from proinflammatory cytokine KO datasets. Among 15 IGs lists shared by two proinflammatory cytokine pathways, the five shared cytokine pathways including TNF $\alpha$ /IFN $\gamma$ , IFN $\gamma$ /IL-18, IL-6/IL-17, IFNy/IL-17, and IL-17/IL6 pathways have the higher numbers of shared IGs (Figures 2A, B). We further examined the cross-talking among all the five cytokine pathways using the Circos Plot (http://metascape.org/gp/index.html#/main/step1) (Figure 2C), Comparing with the data analyzed with the Venn Diagram, the Circos plot analysis has advantages in including the different genes fall into the same ontology term (Blue lines) among the IGs upregulated in the deficiencies of five PCs. The outer circle showed the upregulated IGs in each cytokine pathway. The dark orange section in the inner circle indicated the shared IGs, and the light orange bar indicated the cytokine pathway unique IGs. The results showed that: 1) each cytokine deficiencyupregulated IGs were shared with other cytokine pathways; 2) the dark orange section in the inner circle indicated the shared IGs (Purple lines link the same gene), which were the same as the cytokine-shared IGs in Figure 2A; and 3) IFNy/IFNyR1 pathways have the highest numbers of upregulated IGs, which had minimal shared IGs with that of IL-6 pathway and had more shared IGs with that of IL-17, TNF $\alpha$  and IL18. Our findings were correlated well with that reported: IFN $\gamma$  is an essential cytokine expressed highly in type 1 T helper cells (Th1); and IL-17/IFN $\gamma$  double producing cells, the so-called Th17/Th1 plastic subset (21, 60), is a phenotype frequently observed in pathological conditions (61). These results have demonstrated that the deficiencies of PCs upregulate IGs, which can be in both cytokine-specific and shared manners.

### IFN $\gamma$ R1 and IL-17 Inhibit 59 and 39 Pathways, Respectively; in Contrast, TNF $\alpha$ , IL-6 and IL-18 Inhibit Only Four to Five Pathways

We then examined the signaling pathways in upregulated IGs in the deficiencies of five PCs such as TNFa, IFNy, IL-6, IL-17 and IL-18. We used IPA to perform this analysis, which is a webbased bioinformatics application that allows the uploading of microarray and RNA-Seq data for functional pathway analysis and integration. Table 3A and 3B are the IPA results of upregulated and downregulated IGs in deficiencies of PCs. The detailed IPA results were showed in Table S7 and Table S8. As shown in Table 3A, among 86 significant pathways identified, four pathways such as neuroinflammation, cardiac hypertrophy, leukocyte extravasation, and colorectal cancer metastasis were shared by four cytokine pathway deficiencies; 12 pathways including an additional eight pathways such as dendritic cell maturation, B cell receptor signaling, Tec kinase, nitric oxide and reactive oxygen species in macrophages, integrin, FGF signaling, ILK signaling and PI3 kinase in B cells, were shared by three cytokine pathway deficiencies, 28 pathways were shared by two cytokine pathways; the rest of the 58 pathways were induced by single cytokine deficiencies. In addition, the deficiencies by IFNyR1 KO and IL17R KO upregulate 59 and 39 pathways, respectively. The deficiencies of IFNyR1 and IL17RA resulted in the upregulation of many unique signaling pathways, suggesting that IFNy and IL-17 inhibit many proinflammatory pathways. However, PD-1, PD-L1 cancer immunotherapy pathway was downregulated in IFNy pathway deficiency, suggesting that IFNy is required for PD-1, PD-L1 cancer immunotherapy presumably via expanding type 1 CD4<sup>+</sup> T helper cell (Th1) pathways. Moreover, the deficiencies of TNFa, IL-6 and IL-18 resulted in fewer pathways upregulated, including four TNFa suppressed pathways (dendritic cell maturation, Tec kinase signaling, oxygen species in macrophages, and interferon signaling), five IL6 suppressed pathways (neuroinflammation signaling, leukocyte extravasation, colorectal cancer metastasis, B cell receptor signaling, and PI3K signaling in B cells), and five IL-18 suppressed pathways (neuroinflammation signaling, cardiac hypertrophy, NF-kB signaling, acute phase response signaling, endocannabinoid cancer initiation).

We also examined the signaling pathways in downregulated IGs in the deficiencies of four PCs such as TNF $\alpha$ R, IFN $\gamma$ , IFN $\gamma$ R1, and IL-18. As shown in **Table 3B**, among 70 significant pathways identified, the dendritic cell maturation pathway was downregulated in all four cytokine deficiencies investigated. Sixteen pathways such as cardiac hypertrophy signaling, systemic Lupus erythematosus in B cell signaling, etc. were



downregulated in three cytokine deficiencies. Thirty-seven pathways were downregulated in two cytokine deficiencies. In addition, TNF $\alpha$ R deficiency resulted in the downregulation of 51 pathways. IFNy deficiency led to the downregulation of 38 pathways, and IFNyR1 deficiency resulted in the downregulation of 22 pathways. IL-18 deficiency led to the downregulation of 6 pathways. Of note, the IPA is an experimental database with the focus on pathway analysis, similar to the NIH-NCBI-PubMed database, rather than bioinformatic prediction. What the IPA found that IGs inhibited by IFNyR1 and IL-17 are functionally involved in 59 and 39 pathways in a statistically significant manner, suggesting that inhibitions of IGs by those two cytokines are multiple pathways-, and multiple function-based. In comparison, the IPA found that inhibitions of IGs by TNF- $\alpha$ , IL-6 and IL-18 are four to five pathways-based, much more focused and specific than that inhibited by IFNyR1 and IL-17.

These results have demonstrated that IFN $\gamma$ /IFN $\gamma$ R1 and IL-17 inhibit 59 and 39 pathways, respectively, whereas the deficiencies of TNF $\alpha$ , IL-6 and IL-17 inhibit four to five out of 86 pathways.

### The IFNγ Promoted and -Suppressed Programs Have 4 Shared Pathways; IFNγR1-Promoted and -Suppressed Programs Have 11 Shared Pathways; and miR155-Promoted and -Suppressed Programs Have 13 Shared Pathways, Suggesting Negative-Feedback Conserved Mechanisms

It has been well documented that IFN $\gamma$  secreted from Th1 cells and natural killer cells (NK) play proinflammatory roles (62), and miR155 have strong proinflammatory/proatherogenic roles (63).

TABLE 3A | Ingenuity Pathway Analysis (IPA) results showed the significant pathways (|Z score|> 2) of up-regulated innatomic genes (IGs) in proinflammatory cytokine KO microarray datasets.

| No.      | Significant signaling pathways                                     | Tnf-/-<br>(GSE43145) | Tnfr1,2-/-<br>(GSE33253) | lfng-/-<br>(GSE9892) | lfngr1-/-<br>(GSE39592) | li6-/-<br>(GSE63761) | ll17ra-/-<br>(GSE88800) | ll18-/-<br>(GSE64308) |
|----------|--|----------------------|--------------------------|----------------------|-------------------------|----------------------|-------------------------|-----------------------|
| 1        | Neuroinflammation Signaling Pathway                                |                      |                          |                      | 1                       | 1                    | 1                       | 1                     |
| 2        | Cardiac Hypertrophy Signaling (Enhanced)                           |                      |                          | 1                    | 1                       |                      | 1                       | 1                     |
| 3        | Leukocyte Extravasation Signaling                                  |                      |                          | 1                    | 1                       | 1                    | 1                       |                       |
| 4        | Colorectal Cancer Metastasis Signaling                             |                      |                          | 1                    | 1                       | 1                    | 1                       |                       |
| 5        | Dendritic Cell Maturation  | 1                    |                          |                      | 1                       |                      | 1                       |                       |
| 6        | B Cell Receptor Signaling  |                      |                          |                      | 1                       | 1                    | 1                       |                       |
| 7        | Tec Kinase Signaling   | 1                    |                          |                      | 1                       |                      | ↑ (                     |                       |
| 8        | Production of Nitric Oxide and Reactive Oxygen                     | 1                    |                          |                      | 1                       |                      | 1                       |                       |
| 0        | Species in Macrophages   |                      |                          |                      |                         |                      |                         |                       |
| 9        | Integrin Signaling   |                      |                          | 1                    | 1<br>A                  |                      | 1                       |                       |
| 10       | FGF Signaling<br>ILK Signaling                                     |                      |                          | ↑<br>↑               | Î                       |                      | *                       |                       |
| 11<br>12 | PI3K Signaling in B Lymphocytes                                    |                      |                          | 1                    | <br>↑                   | Ť                    | ↑<br>↑                  |                       |
| 13       | PD-1, PD-L1 cancer immunotherapy pathway                           |                      |                          | l                    | 1                       | I                    | I                       |                       |
| 14       | NF-kB Signaling  |                      |                          | Ļ                    | ↓<br>↑                  |                      |                         | Ť                     |
| 15       | Role of NFAT in Regulation of the Immune Response                  |                      |                          | Ť                    | ⊺<br>↑                  |                      |                         | I                     |
| 16       | Acute Phase Response Signaling                                     |                      |                          | 1                    | I                       |                      | Ť                       | ¢                     |
| 17       | HMGB1 Signaling  |                      |                          |                      | ¢                       |                      | I<br>↑                  | I                     |
| 18       | RANK Signaling in Osteoclasts                                      |                      |                          |                      | י<br>↑                  |                      | י<br>↑                  |                       |
| 19       | Type II Diabetes Mellitus Signaling                                |                      |                          |                      | 1<br>1                  |                      | י<br>ל                  |                       |
| 20       | Adrenomedullin signaling pathway                                   |                      |                          |                      | 1                       |                      | '<br>↑                  |                       |
| 21       | LPS-stimulated MAPK Signaling                                      |                      |                          |                      | ,<br>↓                  |                      | ,<br>↓                  |                       |
| 22       | NF-kB Activation by Viruses  |                      |                          |                      | ↑                       |                      | ↑                       |                       |
| 23       | Signaling by Rho Family GTPases                                    |                      |                          |                      | ↑                       |                      | ↑                       |                       |
| 24       | Cholecystokinin/Gastrin-mediated Signaling                         |                      |                          |                      | ↑                       |                      | ↑                       |                       |
| 25       | IL-8 Signaling   |                      |                          |                      | t<br>t                  |                      | ↑<br>1                  |                       |
| 26       | PKC0 Signaling in T Lymphocytes                                    |                      |                          |                      | 1                       |                      | Ť                       |                       |
| 27       | Toll-like Receptor Signaling                                       |                      |                          |                      | ↑                       |                      | ↑                       |                       |
| 28       | IL-1 Signaling   |                      |                          |                      | ↑                       |                      | ↑                       |                       |
| 29       | Interferon Signaling   | 1                    |                          |                      |                         |                      |                         |                       |
| 30       | ERK/MAPK Signaling   |                      | 1                        |                      |                         |                      |                         |                       |
| 31       | Mouse Embryonic Stem Cell Pluripotency                             |                      | 1                        |                      |                         |                      |                         |                       |
| 32       | Fcγ Receptor-mediated Phagocytosis in<br>Macrophages and Monocytes |                      |                          | 1                    |                         |                      |                         |                       |
| 33       | Th2 Pathway  |                      |                          | ↑                    |                         |                      |                         |                       |
| 34       | Systemic Lupus Erythematosus In T Cell                             |                      |                          | ı<br>↑               |                         |                      |                         |                       |
| 04       | Signaling Pathway  |                      |                          | 1                    |                         |                      |                         |                       |
| 35       | Endocannabinoid Cancer Inhibition Pathway                          |                      |                          |                      |                         |                      |                         | Ť                     |
| 36       | NGF Signaling  |                      |                          |                      | ↑                       |                      |                         | I                     |
| 37       | Cardiac Hypertrophy Signaling                                      |                      |                          |                      | ,<br>↓                  |                      |                         |                       |
| 38       | Synaptogenesis Signaling Pathway                                   |                      |                          |                      | ↑                       |                      |                         |                       |
| 39       | Fc Epsilon RI Signaling  |                      |                          |                      | ↑                       |                      |                         |                       |
| 40       | CD28 Signaling in T Helper Cells                                   |                      |                          |                      | ↑                       |                      |                         |                       |
| 41       | EGF Signaling  |                      |                          |                      | 1                       |                      |                         |                       |
| 42       | Rac Signaling  |                      |                          |                      | ↑                       |                      |                         |                       |
| 43       | PDGF Signaling   |                      |                          |                      | ↑                       |                      |                         |                       |
| 44       | iCOS-iCOSL Signaling in T Helper Cells                             |                      |                          |                      | 1                       |                      |                         |                       |
| 45       | Pancreatic Adenocarcinoma Signaling                                |                      |                          |                      | 1                       |                      |                         |                       |
| 46       | Ephrin Receptor Signaling  |                      |                          |                      | 1                       |                      |                         |                       |
| 47       | Cdc42 Signaling  |                      |                          |                      | 1                       |                      |                         |                       |
| 48       | p70S6K Signaling   |                      |                          |                      | 1                       |                      |                         |                       |
| 49       | Phospholipase C Signaling  |                      |                          |                      | 1                       |                      |                         |                       |
| 50       | Neurotrophin/TRK Signaling   |                      |                          |                      | 1                       |                      |                         |                       |
| 51       | ErbB Signaling   |                      |                          |                      | 1                       |                      |                         |                       |
| 52       | CD27 Signaling in Lymphocytes                                      |                      |                          |                      | 1                       |                      |                         |                       |
| 53       | Neuregulin Signaling   |                      |                          |                      | 1                       |                      |                         |                       |
| 54       | Endocannabinoid Developing Neuron Pathway                          |                      |                          |                      | 1                       |                      |                         |                       |
| 55       | PFKFB4 Signaling Pathway   |                      |                          |                      | 1                       |                      |                         |                       |
| 56       | GNRH Signaling   |                      |                          |                      | 1                       |                      |                         |                       |
| 57       | Glioma Signaling   |                      |                          |                      | Î                       |                      |                         |                       |
| 58       | Melatonin Signaling  |                      |                          |                      | 1                       |                      |                         |                       |

(Continued)

#### TABLE 3A | Continued

| No. | Significant signaling pathways                 | Tnf-/-<br>(GSE43145) | Tnfr1,2-/-<br>(GSE33253) | lfng-/-<br>(GSE9892) | lfngr1-/-<br>(GSE39592) | ll6-/-<br>(GSE63761) | II17ra-/-<br>(GSE88800) | II18-/-<br>(GSE64308) |
|-----|--|----------------------|--------------------------|----------------------|-------------------------|----------------------|-------------------------|-----------------------|
| 59  | Role of NFAT in Cardiac Hypertrophy            |                      |                          |                      | ↑                       |                      |                         |                       |
| 60  | Acute Myeloid Leukemia Signaling               |                      |                          |                      | ↑                       |                      |                         |                       |
| 61  | Opioid Signaling Pathway                       |                      |                          |                      | ↑                       |                      |                         |                       |
| 62  | Sphingosine-1-phosphate Signaling              |                      |                          |                      | ↑                       |                      |                         |                       |
| 63  | G Beta Gamma Signaling                         |                      |                          |                      | ↑                       |                      |                         |                       |
| 64  | Gα12/13 Signaling                              |                      |                          |                      | ↑                       |                      |                         |                       |
| 65  | Gaq Signaling                                  |                      |                          |                      | ↑                       |                      |                         |                       |
| 66  | Wnt/β-catenin Signaling                        |                      |                          |                      | 1                       |                      |                         |                       |
| 67  | Thrombin Signaling                             |                      |                          |                      | ↑                       |                      |                         |                       |
| 68  | TREM1 Signaling                                |                      |                          |                      |                         |                      | Ŷ                       |                       |
| 69  | IL-6 Signaling                                 |                      |                          |                      |                         |                      | Ŷ                       |                       |
| 70  | LXR/RXR Activation                             |                      |                          |                      |                         |                      | $\downarrow$            |                       |
| 71  | iNOS Signaling                                 |                      |                          |                      |                         |                      | ↑                       |                       |
| 72  | PPAR Signaling                                 |                      |                          |                      |                         |                      | 1                       |                       |
| 73  | Systemic Lupus Erythematosus In B Cell         |                      |                          |                      |                         |                      | 1                       |                       |
|     | Signaling Pathway                              |                      |                          |                      |                         |                      |                         |                       |
| 74  | Type I Diabetes Mellitus Signaling             |                      |                          |                      |                         |                      | 1                       |                       |
| 75  | p38 MAPK Signaling                             |                      |                          |                      |                         |                      | ↑                       |                       |
| 76  | Antioxidant Action of Vitamin C                |                      |                          |                      |                         |                      | $\downarrow$            |                       |
| 77  | MIF Regulation of Innate Immunity              |                      |                          |                      |                         |                      | 1                       |                       |
| 78  | Inflammasome pathway                           |                      |                          |                      |                         |                      | ↑                       |                       |
| 79  | Osteoarthritis Pathway                         |                      |                          |                      |                         |                      | 1                       |                       |
| 80  | STAT3 Pathway                                  |                      |                          |                      |                         |                      | ↑                       |                       |
| 81  | VDR/RXR Activation                             |                      |                          |                      |                         |                      | ↑                       |                       |
| 82  | Role of IL-17F in Allergic Inflammatory Airway |                      |                          |                      |                         |                      | ↑                       |                       |
|     | Diseases                                       |                      |                          |                      |                         |                      |                         |                       |
| 83  | FAT10 Cancer Signaling Pathway                 |                      |                          |                      |                         |                      | 1                       |                       |
| 84  | Angiopoietin Signaling                         |                      |                          |                      |                         |                      | $\downarrow$            |                       |
| 85  | T Cell Exhaustion Signaling Pathway            |                      |                          |                      |                         |                      | ↑                       |                       |
| 86  | Endothelin-1 Signaling                         |                      |                          |                      |                         |                      | ↑                       |                       |

A total of 11 microarrays about proinflammatory cytokines in **Table 2A** were analyzed, GSE15750, GSE73875, GSE64309 and GSE64310 were not included because there were no significant (IZ scorel< 2) pathways in them.

The data showed a total of 28 shared significant signaling pathways of the up-regulated innate immune genes in PCs KO microarrays. 12 cellular immune response signals were activated and PD-1, PD-L1 cancer immunotherapy pathway was suppressed by the up-regulated IGs (marked in bold). And in 58 unique significant signaling pathways, 12 cellular immune response signals (marked in bold) are activated when one proinflammatory cytokine was KO. The detailed IPA results were showed in **Table S7**.

However, our recent papers reported that IFN $\gamma$  and TNF  $\alpha$ stimulated endothelial cells upregulate co-stimulation receptors B7-H2, CD40, SEMA4A (a member of the semaphorin family of soluble and transmembrane proteins) and CD112 and immune checkpoint receptors Galectin 9, herpesvirus entry mediator (HVEM), B7-DC, and B7-H1 (PD-L1) (64); proinflammatory adipokines leptin and resistin are significantly upregulated in the plasma and white adipose tissue in miR155 KO mice (31, 32). These findings suggest that IFNy may inhibit endothelial cells activation and inflammation via anti-inflammatory reverse signaling mediated by upregulated immune checkpoint receptors (65), and miR155 may suppress the second wave of inflammation as formulated in our recently proposed new concept (32). We hypothesized that IFNy-promoted and -suppressed innate immune programs have shared pathways; and miR155 promoted and suppressed innate immune programs have shared pathways. The rationale for us to focus on these two inflammatory regulators is that among the proinflammatory regulators examined (Table 3A), both these two have long lists of promoted and suppressed pathways. IFNy KO mice have 37 specific down-regulated innatome pathways, seven specific up-regulated innatome pathways, and four common pathways shared by both promoted and suppressed programs

including cardiac hypertrophy, integrin-linked kinase (ILK), role of NFAT in regulation of the immune response and colorectal cancer metastasis signaling (Figure 3). IFNyR1 KO mice have 11 specific downregulated innatome pathways, 49 specific upregulated innatome pathways and 11 common pathways shared by both IFNyR1-promoted and suppressed programs including NF-kB, neuroinflammation, high mobility group box 1 (HMGB1), Tolllike receptors, production of reactive nitric oxide and ROS in macrophages, IL-1, cardiac hypertrophy, dendritic cell maturation, PI3K signaling in B cells, colorectal cancer metastasis, and cardiac hypertrophy (enhanced) (Figure 4). Of note, in addition to IFNyR1/ 2, IFNy has also been shown to signal through alternative pathways, including signal transducer and activator of transcription 4 (STAT4), extracellular signal-regulated protein kinases 1 and 2 (Erk1/2), proline-rich tyrosine kinase 2 (Pyk2), and CRK like proto-oncogene (CrkL), among others (66, 67), which may explain the discrepancies between IFNy signaling and IFNyR1 signaling. In addition, miR155 KO have 89 specific downregulated pathways, six specific upregulated innatome pathways and 13 common pathways shared by both miR155promoted and suppressed programs including PI3K signaling in B cells, systemic lupus erythematosus in B cell signaling, CD28

| No.       | Significant signaling pathways                                       | Tnfr1,2-/-<br>(GSE33253) | lfng-/-<br>(GSE9892) | lfngr1-/-<br>(GSE39592) | ll18-/-<br>(GSE64309) |
|-----------|--|--------------------------|----------------------|-------------------------|-----------------------|
| 1         | Dendritic Cell Maturation  | Ļ                        | Ļ                    | Ļ                       | Ļ                     |
| 2         | Cardiac Hypertrophy Signaling (Enhanced)                             | $\downarrow$             | $\downarrow$         | $\downarrow$            |                       |
| 3         | Systemic Lupus Erythematosus In B Cell Signaling Pathway             | $\downarrow$             | $\downarrow$         | Ļ                       |                       |
| ŀ         | Interferon Signaling   | $\downarrow$             | $\downarrow$         | $\downarrow$            |                       |
| 5         | Role of Pattern Recognition Receptors in Recognition of Bacteria and | $\downarrow$             | $\downarrow$         | $\downarrow$            |                       |
|           | Viruses  |                          |                      |                         |                       |
| 6         | TREM1 Signaling  | Ļ                        | $\downarrow$         | Ļ                       |                       |
| 7         | Neuroinflammation Signaling Pathway                                  | Ļ                        | $\downarrow$         | Ļ                       |                       |
| 3         | iNOS Signaling   | $\downarrow$             | $\downarrow$         | $\downarrow$            |                       |
| )         | p38 MAPK Signaling   | $\downarrow$             | $\downarrow$         | $\downarrow$            |                       |
| 10        | Production of Nitric Oxide and Reactive Oxygen Species in            | $\downarrow$             | $\downarrow$         | $\downarrow$            |                       |
|           | Macrophages  |                          |                      |                         |                       |
| 11        | Colorectal Cancer Metastasis Signaling                               | $\downarrow$             | $\downarrow$         | $\downarrow$            |                       |
| 2         | PI3K Signaling in B Lymphocytes                                      | $\downarrow$             | $\downarrow$         | $\downarrow$            |                       |
| 3         | IL-1 Signaling   | Ļ                        | Ļ                    | Ļ                       |                       |
| 4         | Adrenomedullin signaling pathway                                     | Ļ                        | Ļ                    |                         | Ļ                     |
| 5         | Cholecystokinin/Gastrin-mediated Signaling                           | Ļ                        | Ļ                    |                         | Ļ                     |
| 6         | Toll-like Receptor Signaling   |                          | Ļ                    | Ļ                       | Ļ                     |
| 7         | HGF Signaling  | Ļ                        | Ţ                    | ÷                       | *                     |
| 18        | Tec Kinase Signaling   | Ļ                        | Ţ                    |                         |                       |
| 9         | MIF Regulation of Innate Immunity                                    | Ť                        | Ť                    |                         |                       |
| 20        | NF-κB Activation by Viruses  | ,                        | ,                    |                         |                       |
| 21        | Signaling by Rho Family GTPases                                      | ¥<br>I                   | ↓<br>I               |                         |                       |
| 22        | ERK/MAPK Signaling   | ↓<br>I                   | ↓<br>I               |                         |                       |
| 23        | IL-8 Signaling   | ¥<br>1                   | ¥<br>1               |                         |                       |
| 24        | PI3K/AKT Signaling   | ¥<br>1                   | ¥<br>1               |                         |                       |
| 5         | PKC0 Signaling in T Lymphocytes                                      | <b>↓</b>                 | <b>↓</b>             |                         |                       |
| 26        | Endothelin-1 Signaling   | ↓<br>1                   | ↓<br>1               |                         |                       |
| 27        | Synaptogenesis Signaling Pathway                                     | ↓<br>1                   | ↓<br>1               |                         |                       |
| 28        | ILK Signaling  | ↓<br>1                   | ↓<br>                |                         |                       |
|           | PDGF Signaling   | ↓<br>↓                   | 4                    |                         |                       |
| 29<br>30  |  | ↓<br>↓                   | $\downarrow$         | 1                       |                       |
|           | Activation of IRF by Cytosolic Pattern Recognition Receptors         | ↓<br>1                   |                      | ↓<br>I                  |                       |
| 31<br>32  | IL-6 Signaling<br>Th17 Activation Pathway                            | ↓<br>↓                   |                      | ¥<br>1                  |                       |
|           | -  | ↓<br>1                   |                      | ↓<br>I                  |                       |
| 33<br>34  | JAK/Stat Signaling<br>NF-κB Signaling                                | Ļ                        |                      | ¥<br>1                  |                       |
| 35<br>35  |  |                          |                      | ¥<br>1                  | $\downarrow$          |
|           | HMGB1 Signaling  |                          | 1                    | ↓<br>I                  |                       |
| 36        | Cardiac Hypertrophy Signaling  |                          | $\downarrow$         | ¥<br>1                  |                       |
| 37        | Acute Phase Response Signaling                                       |                          |                      | Ļ                       | Ļ                     |
| 38        | Rac Signaling<br>B Cell Receptor Signaling                           | ↓<br>↓                   |                      |                         |                       |
| 39        |  | ↓<br>↓                   |                      |                         |                       |
| 10        | Ephrin Receptor Signaling  | 1                        |                      |                         |                       |
| 11        | Role of IL-17F in Allergic Inflammatory Airway Diseases              | Ļ                        |                      |                         |                       |
| 12        | PPAR Signaling   | Ť                        |                      |                         |                       |
| 13        | Leukocyte Extravasation Signaling                                    | Ļ                        |                      |                         |                       |
| 14<br>15  | TNFR1 Signaling  | ↓<br>I                   |                      |                         |                       |
| <b>15</b> | MIF-mediated Glucocorticoid Regulation                               | Ļ                        |                      |                         |                       |
| 16<br>17  | Integrin Signaling   | Ļ                        |                      |                         |                       |
| 7         | RhoA Signaling   | ↓                        |                      |                         |                       |
| 8         | Type II Diabetes Mellitus Signaling                                  | 1                        |                      |                         |                       |
| 9         | Cdc42 Signaling  | Ļ                        |                      |                         |                       |
| 50        | Antioxidant Action of Vitamin C                                      | ↑                        |                      |                         |                       |
| 1         | iCOS-iCOSL Signaling in T Helper Cells                               | Ļ                        |                      |                         |                       |
| 2         | FAT10 Cancer Signaling Pathway                                       | Ļ                        |                      |                         |                       |
| 53        | PAK Signaling  | $\downarrow$             |                      |                         |                       |
| 54        | Type I Diabetes Mellitus Signaling                                   | $\downarrow$             |                      |                         |                       |
| 5         | Renin-Angiotensin Signaling  | $\downarrow$             |                      |                         |                       |
| 56        | CD28 Signaling in T Helper Cells                                     | $\downarrow$             |                      |                         |                       |
| 7         | IL-7 Signaling Pathway   | $\downarrow$             |                      |                         |                       |
| 58        | LPS-stimulated MAPK Signaling  | $\downarrow$             |                      |                         |                       |
| 59        | Fc Epsilon RI Signaling  |                          | $\downarrow$         |                         |                       |
| 60        | cAMP-mediated signaling  |                          | Ļ                    |                         |                       |

(Continued)

#### TABLE 3B | Continued

| No. | Significant signaling pathways                    | Tnfr1,2-/-<br>(GSE33253) | lfng-/-<br>(GSE9892) | lfngr1-/-<br>(GSE39592) | II18-/-<br>(GSE64309) |
|-----|---|--------------------------|----------------------|-------------------------|-----------------------|
| 61  | Osteoarthritis Pathway                            |                          | $\downarrow$         |                         |                       |
| 62  | Hepatic Fibrosis Signaling Pathway                |                          | $\downarrow$         |                         |                       |
| 63  | T Cell Exhaustion Signaling Pathway               |                          | $\downarrow$         |                         |                       |
| 64  | Oncostatin M Signaling                            |                          | $\downarrow$         |                         |                       |
| 65  | Unfolded protein response                         |                          | $\downarrow$         |                         |                       |
| 66  | Retinoic acid Mediated Apoptosis Signaling        |                          | $\downarrow$         |                         |                       |
| 67  | LXR/RXR Activation                                |                          | 1                    |                         |                       |
| 68  | Role of NFAT in Regulation of the Immune Response |                          | $\downarrow$         |                         |                       |
| 69  | PPARα/RXRα Activation                             |                          | 1                    |                         |                       |
| 70  | RhoGDI Signaling                                  |                          | 1                    |                         |                       |

A total of 10 microarrays about proinflammatory cytokines in **Supplementary Table 2A** were analyzed, GSE43145, GSE73875, GSE88800, GSE64309, GSE63761, GSE64308 and GSE64310 were not included because there were **no significant** (IZ scorel < 2) pathways in them. The data showed a total of 37 shared significant signaling pathways of the down-regulated innate immune genes in the inflammatory cytokines KO microarrays. According to the IPA classification, 19 cellular immune response signals (marked in bold) are down-regulated by the PCs KO. And in 33 unique significant signaling pathways, 8 cellular immune response signals (marked in bold) were suppressed when one PCs was KO. The detailed IPA results were showed in **Table S8**.

signaling in T helper cells, B cell receptor, inducible T-cell costimulator (iCOS)-iCOSL signaling, protein kinase C theta (PKC $\theta$ ) signaling, role of nuclear factor of activated T cells (NF-AT), dendritic cell maturation, Fc $\gamma$  receptor (one antibody receptor)mediated phagocytosis, Fc Epsilon RI, IL-6, Tec kinase, and adrenomedullin signaling (**Figure 5**).

These results have demonstrated that: first, IFNy promoted innate immune pathways (37 pathways) are more than that of IFN<sub>Y</sub>-suppressed pathways (7 pathways), suggesting that IFN<sub>Y</sub> plays roles in more upregulating IGs and less downregulating IGs; second, IFNyR1 promoted innate immune pathways (11 pathways) are less than that of IFNyR1-suppressed pathways (49 pathways), suggesting that IFNyR1 plays roles in less upregulating IGs and more downregulating IGs; third, miR155-promoted innate immune pathways (89 pathways) are more than that of miR155-suppressed pathways (6 pathways), suggesting that miR155 plays roles in more upregulating IGs and less downregulating IGs; fourth, IFNy/IFNyR1 and miR155 both have their own promoted and suppressed pathways; and fifth, IFNy/IFNyR1 has different shared pathways from that of miR155. These results have also suggested that proinflammatory molecules IFNy and miR155 have negativefeedback mechanisms underlying downstream regulation.

### Deficiencies of PCs and Transcription Factors-Suppressed, -Promoted Programs Share the Signaling Pathways and Likelihood to Develop 11 Diseases, Including Cardiovascular Disease

We hypothesized that the common signaling pathways shared in PCs-promoted-, and suppressed programs play significant roles in the initiation and development of inflammation. To examine this hypothesis, we compiled all the significantly downregulated and upregulated pathways in the deficiencies of all the proinflammatory molecules examined (**Figure 6**). The results showed that proinflammatory molecules deficiencies downregulate 19 specific pathways such as activation of interferon regulatory factor (IRF) by cytosolic pattern recognition receptors, role of pattern recognition receptors in recognition of bacteria and viruses, Th17 activation,

hepatocyte growth factor (HGF) signaling, Janus kinases (JAK)/ STAT signaling, TNFR1 signaling, macrophage migration inhibitory factor (MIF)-mediated glucocorticoid regulation, p21activated kinase (PAK) signaling, renin-angiotensin signaling, IL-7 signaling, RhoA signaling, phosphatidylinositol-3-kinase (PI3K)/ protein kinase B (AKT) signaling and cyclic adenosine monophosphate (cAMP)-mediated signaling, suggesting that these signaling pathways are essential for promoting inflammation and anti-infection innate immune responses. In addition, we found that 35 pathways were associated with upregulated IGs when proinflammatory molecules are deficient, suggesting that the 35 pathways are often suppressed by proinflammatory molecules; these 35 pathways serve as the key players in the second wave of inflammation when these PCs and molecules are deficient. Moreover, we identified 51 common pathways in IGs that are shared by proinflammatory moleculespromoted and suppressed programs, suggesting that these 51 common pathways allow the launching of effective inflammation, and innate and adaptive immune responses in the presence and absence of individual proinflammatory molecules. These common pathways are novel targets for future therapeutics to make proinflammatory cytokine blockade therapy more effective.

We then hypothesized that the common signaling pathways shared in proinflammatory transcription factors (TFs) KO, including STAT1, STAT3, NF-KB Rela and IKK2-promoted-, and suppressed programs play significant roles on initiation and development of inflammation. To examine this hypothesis, we compiled all the significantly downregulated and upregulated pathways in the deficiencies of all the proinflammatory TFs (Figure 7). The results showed that proinflammatory TFs deficiencies-downregulate four pathways (systemic lupus erythematosus in B cell signaling, interferon signaling, activation of IRF by cytosolic pattern recognition receptors, and endothelin-1 signaling) suggesting that these four pathways are promoted by the four TFs. In addition, we found 67 pathways in the IGs upregulated in the four TF deficiencies, suggesting that these four TFs suppress a long list of innate immune pathways. Moreover, we found that eight pathways are shared in the IGs promoted and suppressed when the four TFs



FIGURE 3 Venn diagram showing the overlapping significant pathways of up-regulated and down-regulated IGs in Itng KD microarray dataset (GSE9892). The shared pathways by up-regulated and down-regulated IGs were called "2nd and 1st inflammatory wave pathways". The data showed in 4 common significant "2nd and 1st inflammatory wave pathways". The data suggested that the up-regulated IGs have the same immune function to the down-regulated IGs by Ifng KO. Fcy Receptor-mediated Phagocytosis in Macrophages and Monocytes, Th2 Pathway, PD-1, PD-L1 cancer immunotherapy pathway, Leukocyte Extravasation Signaling and Systemic Lupus Erythematosus In T Cell Signaling Pathway were unique cellular immune response pathways of "2nd inflammatory wave pathways". The suppression of Interferon Signaling, Systemic Lupus Erythematosus In B Cell Signaling Pathway, and Role of Pattern Recognition Receptors in Recognition of Bacteria and Viruses, etc. 16 pathways were unique cellular immune response pathways of "1st inflammatory molecules". The cellular immune response pathways were marked in bold.

are deficient (**Table S9** lists pathways of up-regulated IGs and down-regulated IGs in each microarray). Taken together, PCspromoted and -suppressed innate immune programs have 51 shared pathways; and proinflammatory transcription factors suppress 67 innate immune pathways, which may become novel targets for the future therapeutics and also suggest strategical problems in targeting proinflammatory transcription factors for therapies.

As shown in **Table 4** and **Figure 8A**, the results demonstrated a range from multiple cytokine deficiencies to single cytokine deficiency that: 1) deficiencies of all seven cytokines including IFN $\gamma$ , IFN $\gamma$ R1, IL17RA, IL18, IL6, TNF $\alpha$ , and TNFR1,2 upregulated organismal injury and abnormalities; 2) deficiencies of five cytokines IFN $\gamma$ , IFN $\gamma$ R1, IL6, TNF $\alpha$ , and TNFR1,2 upregulated immunological diseases; 3) deficiencies of four cytokines IFN $\gamma$ , IL17ra, IL18, and IL6 upregulated inflammatory diseases; deficiencies of three cytokines IFN $\gamma$ , IFN $\gamma$ R1, TNFR1,2 upregulated cancer; 4) deficiencies another three cytokines IL17RA, IL18 and IL6 upregulated inflammatory response, connective tissue disorders; 5) deficiencies of two cytokines IFN $\gamma$ R1 and TNFR1,2 upregulated hematological disease; 6) deficiencies of another two cytokines IL17ra and IL18 upregulated skeletal and muscular disorders; 7) deficiency of cytokine TNF upregulated gastrointestinal disease, endocrine system disorders and metabolic disease; 8) deficiency of cytokine TNFR1,2 upregulated tumor morphology; 9) deficiency of cytokine IFN $\gamma$  upregulated connective tissue disorders; and 10) deficiency of cytokine receptor IFN $\gamma$ R1 increase cardiovascular disease. Similarly, we performed IPA for top disease and disorder associations of downregulated IGs in cytokine gene KO



immune response pathways of "1st inflammatory wave pathways". The cellular immune response pathways were marked in bold.

microarrays as shown in **Table 4** and **Figure 8B**. The results are significant since some cytokine blockage therapies have not used for treatment of those top diseases yet. The results demonstrated that each cytokine KO decreased the likelihood to develop certain diseases, which provide novel valuable guidance for cytokine blockage therapies based on the cytokine modulating effects on the expression of IGs.

Of note, as shown in **Figure 8C**, comparing cytokine deficiencies-downregulated IGs related diseases to that of cytokine deficiencies-upregulated IGs related diseases, the results showed that *first*, the cytokine deficiencies-downregulated IGs related disease group has five diseases including infectious disease (increased, **Figure S1**), respiratory disease, nutritional

disease, neurological disease, and hepatic system disease; *second*, cytokine deficiencies-upregulated IGs related disease group has two diseases such as tumor morphology and skeletal and muscular disorders; and *third*, the two groups share 11 diseases, suggesting that current therapeutic strategies have significant problems; and there are urgent needs to re-shape the strategies in designing cytokine blockage therapies. Taken together, our results have demonstrated that *first*, the deficiencies of PCs not only upregulate IGs and innate immune signaling pathways but also increase the likelihood to develop certain immune, inflammatory diseases and cancers; and *second*, the deficiencies of PCs not only downregulate IGs and innate immune signaling pathways but also decrease the likelihood to develop certain immune, inflammatory



FIGURE 5 | Venn diagram showing 13 overlapping significant pathways of up-regulated and down-regulated genes in mir155 KO microarray dataset (GSE66815). The data showed in 13 common significant "2nd and 1st inflammatory wave pathways", there were nine cellular immune response related pathways. The data suggested that the up-regulated IGs have the same immune function to the down-regulated IGs by inflammatory miRNA155 KO. Six pathways were unique pathways of "2nd inflammatory molecules" and three pathways were cellular immune response related pathways. 89 pathways were unique pathways of "1st inflammatory molecules" and 15 pathways were cellular immune response related pathways. That is, the main significant pathways of miR155 are "1st inflammatory molecules". And in "1st inflammatory wave pathways", Leptin Signaling in Obesity was inhibited, which can explain the pathogenesis of MHO partly. The cellular immune response pathways were marked in bold.

diseases and cancers and provide novel valuable guidance for cytokine blockage therapies.

### Deficiency of TNFα in Mice and Patients Receiving Anti-TNF Therapy Shared Upregulated IGs and Inflammatory Pathways

We made an interesting finding that, the IGs were more upregulated than downregulated when poor responder or nonresponder compared with the group responders or good responders in several microarray datasets of patients receiving monoclonal antibody (Mab) therapy (**Table 2B**). Then, we hypothesized that in drug none-responders, "suppressed cytokines or innate immune regulator molecules" were upregulated. To examine this hypothesis, Tnf KO (GSE43145, Tnf KO Gan mice vs. Gan mice) and anti-TNF therapy (GSE111761, non-responders vs. responders) microarrays were compared. The IPA results of the pathways and the involved IGs



**FIGURE 6** | Venn diagram showing 51 overlapping significant pathways of up-regulated and down-regulated innatomic genes in proinflammatory cytokine KO microarray datasets. The significant pathways from down-regulated innate immune genes have the same expression pattern to proinflammatory cytokines. The data showed in 51 common significant pathways, there were about 22 cellular immune response related pathways (account for 43.14%). The data suggested that the up-regulated innate immune genes have the same immune function to the down-regulated innate immune genes by proinflammatory cytokines KO. Additionally, the suppression of PD-1, PD-L1 cancer immunotherapy pathway, Fcγ Receptor-mediated Phagocytosis in Macrophages and Monocytes, Th2 Pathway, Systemic Lupus Erythematosus In T Cell Signaling Pathway, CD27 Signaling in Lymphocytes, PFKFB4 Signaling Pathway and Inflammasome pathway were unique cellular immune response pathways of the up-regulated innate immunity genes after cytokines KO. Activation of IRF by Cytosolic Pattern Recognition Receptors, Th17 Activation Pathway, MIF-mediated Glucocorticoid Regulation, IL-7 Signaling Pathway were unique cellular immune response pathways of the down-regulated innate immunity genes after cytokines KO. The detailed IPA results were showed in **Table S7, S8**. The cellular immune response pathways were marked in bold.

showed that four upregulated pathways in Tnf KO microarray also were all shared with that in patients receiving anti-TNF therapy; and several upregulated IGs involved in the pathways were shared (**Figure 9A**). IPA results of up-regulated innatomic genes in anti-TNF therapy microarray were listed in **Table S10**. All the significant differential expressed genes (p<0.05, |logFC|>1) of these two microarrays were further analyzed by using GSEA for pathway enrichments (68, 69). The result showed that a total of 17 pathways were shared by Tnf KO and anti-TNF therapy microarrays including inflammatory response and cytokine signalings, which were activated in these two microarrays (**Figure 9B**). The Venn diagram showed that 97 significant differentially expressed IGs were shared by Tnf KO and anti-TNF therapy microarrays. The 97 genes were analyzed for additional enrichment analysis by using the Metascape database. The result showed that the five pathways such as type I interferon signaling pathway, lymphocyte differentiation, Adaptive Immune System, regulation of innate immune response, response to bacterium etc, were the significantly enriched GO or pathways (**Figure 9C**). Taken together, based on not only from the IPA results of significant differentially expressed IGs, but also the integrated analysis results from the GSEA and Metascape of all shared significant differentially expressed genes, our analyses have demonstrated that the new inflammatory responses will be activated when TNF is suppressed, thus supporting our novel hypothesis that the "2nd inflammatory wave" contributes to non-responder patients receiving anti-TNF Mab therapy partially. In fact, our findings



FIGURE 7 | Venn diagram showing eight overlapping significant pathways of up-regulated and down-regulated innatomic genes in pro-inflammatory related transcription factor KO microarray datasets. The significant pathways from down-regulated innate immune genes have the same expression pattern to proinflammatory related transcription factors. The data showed that in 8 common significant pathways, there were 3 cellular immune response related pathways. The data suggested that the up-regulated innate immune genes have the same immune function to the down-regulated innate immune genes by proinflammatory related transcription factors KO. There are 67 significant pathways in up-regulated innate immune genes including TREM1 Signaling, Leukocyte Extravasation Signaling, CD28 Signaling in T Helper Cells etc. cellular immune response pathways. The cellular immune response pathways were marked in bold. The detailed IPA results were showed in **Tables S7–S9**. The cellular immune response pathways were marked in bold.

were well correlated with the report about GSE111761 that in patients with Crohn's disease receiving anti-TNF therapy, there were significant upregulations of mucosal Il-23p19, Il23R and Il17A in non-responders, but not in responders.

### Up-Regulated ROS Regulators Such as MPO Caused by Suppression of Major Proinflammatory Molecules Can Drive the Upregulation of "Suppressed Innatomic Genes"

Mitochondrial ROS (mtROS) are signaling molecules, which drive inflammatory cytokine production (70) and T cell activation (70, 71). In addition, CVDs, cancers, and autoimmune diseases all share a common feature of increased mtROS levels (72). Our recent study shed light on this important question and found that, during

endothelial cell activation, mtROS could be upregulated in a proton leak-coupled, but ATP synthesis-uncoupled manner (72-75). As a result, endothelial cells could upregulate mtROS production for physiological endothelial cell activation without compromising mitochondrial membrane potential and ATP generation, and consequently without causing mitochondrial damage and endothelial cell death. Thus, a novel pathophysiological role of proton leak in driving mtROS production was uncovered for lowgrade endothelial cell activation, patrolling immunosurveillance cell trans-endothelial migration and low-grade chronic inflammation without compromising cellular survival (72-76). One of the most evident features of the inflammatory response is the generation of a pro-oxidative environment due to the production of high fluxes of pro-oxidant species (77). We hypothesized that deficiencies of PCs and regulators upregulate some oxidative stress regulators. To test this hypothesis, we examined 165 ROS regulators collected in the Gene Set

| PCs         | Up-regu                                   | lated IGs           |             | Down-regulated IGs Top Diseases and disorders |                     |             |  |  |  |
|-------------|---|---------------------|-------------|---|---------------------|-------------|--|--|--|
| (upN/downN) | Top Diseases                              | and disorders       |             |   |                     |             |  |  |  |
|             | Name                                      | p-value range       | # Molecules | Name  | p-value range       | # Molecules |  |  |  |
| Tnf KO      |   |                     |             |   |                     |             |  |  |  |
| (52/24)     | Endocrine System Disorders                | 5.47E-04 - 1.07E-15 | 25          | Infectious Diseases                           | 3.34E-02 - 2.12E-05 | 4           |  |  |  |
|             | Gastrointestinal Disease                  | 5.77E-04 - 1.07E-15 | 29          | Organismal Injury and Abnormalities           | 3.60E-02 - 2.12E-05 | 22          |  |  |  |
|             | Immunological Disease                     | 7.06E-04 - 1.07E-15 | 36          | Respiratory Disease                           | 3.34E-02 - 2.12E-05 | 4           |  |  |  |
|             | Metabolic Disease                         | 3.18E-04 - 1.07E-15 | 21          | Cardiovascular Disease                        | 3.04E-02 - 7.84E-05 | 7           |  |  |  |
|             | Organismal Injury and Abnormalities       | 7.69E-04 - 1.07E-15 | 44          | Hematological Disease                         | 2.54E-02 - 7.84E-05 | 5           |  |  |  |
| Tnfr1,2 KO  | Immunological Disease                     | 4.24E-03 - 1.49E-07 | 18          | Immunological Disease                         | 1.04E-08 - 1.62E-39 | 113         |  |  |  |
| (32/171)    | Cancer                                    | 4.24E-03 - 5.41E-07 | 28          | Infectious Diseases                           | 1.07E-08 - 2.19E-33 | 87          |  |  |  |
| , ,         | Hematological Disease                     | 4.24E-03 - 5.41E-07 | 19          | Connective Tissue Disorders                   | 8.87E-09 - 1.04E-29 | 76          |  |  |  |
|             | Organismal Injury and Abnormalities       | 4.24E-03 - 5.41E-07 | 28          | Inflammatory Disease                          | 5.62E-09 - 1.04E-29 | 92          |  |  |  |
|             | Tumor Morphology                          | 4.24E-03 - 9.23E-07 | 4           | Organismal Injury and Abnormalities           | 1.18E-08 - 1.04E-29 | 152         |  |  |  |
| Ifng KO     | Cancer                                    | 5.81E-04 - 8.88E-09 | 79          | Immunological Disease                         | 3.22E-08 - 2.68E-38 | 97          |  |  |  |
| (81/138)    | Organismal Injury and Abnormalities       | 5.81E-04 - 8.88E-09 | 79          | Infectious Diseases                           | 2.26E-08 - 1.47E-34 | 82          |  |  |  |
| ()          | Immunological Disease                     | 5.81E-04 - 1.00E-08 | 43          | Connective Tissue Disorders                   | 4.62E-08 - 5.68E-33 | 69          |  |  |  |
|             | Connective Tissue Disorders               | 5.81E-04 - 1.47E-08 | 26          | Inflammatory Disease                          | 3.11E-08 - 5.68E-33 | 78          |  |  |  |
|             | Inflammatory Disease                      | 4.24E-04 - 1.47E-08 | 32          | Organismal Injury and Abnormalities           | 4.62E-08 - 5.68E-33 | 131         |  |  |  |
| lfngr1 KO   | Organismal Injury and Abnormalities       | 1.49E-04 - 1.51E-14 | 105         | Infectious Diseases                           | 2.01E-05 - 1.37E-21 | 46          |  |  |  |
| (111/82)    | Hematological Disease                     | 1.18E-04 - 9.22E-11 | 50          | Immunological Disease                         | 1.35E-05 - 9.81E-21 | 51          |  |  |  |
| ,           | Immunological Disease                     | 1.31E-04 - 9.22E-11 | 44          | Inflammatory Response                         | 1.92E-05 - 2.13E-19 | 54          |  |  |  |
|             | Cardiovascular Disease                    | 1.46E-04 - 1.04E-10 | 29          | Connective Tissue Disorders                   | 1.48E-05 - 2.82E-19 | 40          |  |  |  |
|             | Cancer                                    | 1.49E-04 - 1.19E-10 | 103         | Inflammatory Disease                          | 1.65E-05 - 2.82E-19 | 50          |  |  |  |
| II6 KO      | Inflammatory Response                     | 1.39E-03 - 3.58E-17 | 34          | Endocrine System Disorders                    | 6.76E-03 - 1.87E-06 | 5           |  |  |  |
| (44/13)     | Immunological Disease                     | 1.23E-03 - 2.76E-12 | 35          | Gastrointestinal Disease                      | 6.38E-03 - 1.87E-06 | 13          |  |  |  |
| (           | Organismal Injury and Abnormalities       | 1.40E-03 - 1.16E-10 | 40          | Metabolic Disease                             | 7.38E-03 - 1.87E-06 | 7           |  |  |  |
|             | Connective Tissue Disorders               | 1.23E-03 - 2.07E-10 | 22          | Nutritional Disease                           | 5.22E-03 - 1.87E-06 | 4           |  |  |  |
|             | Inflammatory Disease                      | 1.23E-03 - 2.07E-10 | 27          |   | 7.54E-03 - 1.87E-06 | 13          |  |  |  |
| ll17ra KO   | Inflammatory Response                     | 7.74E-12 - 1.20E-39 | 100         | Inflammatory Response                         | 4.47E-03 - 3.68E-06 | 21          |  |  |  |
| (141/50)    | Connective Tissue Disorders               | 5.90E-12 - 1.96E-37 | 72          | Neurological Disease                          | 4.47E-03 - 1.07E-05 | 21          |  |  |  |
| (11,00)     | Inflammatory Disease                      | 5.33E-12 - 1.96E-37 | 83          | Organismal Injury and Abnormalities           |                     | 49          |  |  |  |
|             | Organismal Injury and Abnormalities       | 1.52E-11 - 1.96E-37 | 115         | Cancer  | 4.37E-03 - 1.21E-05 | 48          |  |  |  |
|             | Skeletal and Muscular Disorders           | 2.96E-12 - 1.96E-37 | 78          | Gastrointestinal Disease                      | 4.47E-03 - 1.21E-05 | 46          |  |  |  |
| II18 KO     | Connective Tissue Disorders               | 6.58E-04 - 5.71E-10 | 22          | Gastrointestinal Disease                      | 1.12E-02 - 1.32E-06 | 6           |  |  |  |
| (adipose)   | Inflammatory Disease                      | 1.80E-04 - 5.71E-10 | 22          | Hepatic System Disease                        | 3.22E-03 - 1.32E-06 | 4           |  |  |  |
| (48/12)     | Inflammatory Response 6.55E-04 - 5.71E-10 |                     | 28          | Organismal Injury and Abnormalities           | 1.12E-02 - 1.32E-06 | 11          |  |  |  |
| (10,12)     | Organismal Injury and Abnormalities       |                     | 46          | Connective Tissue Disorders                   | 9.09E-03 - 7.38E-06 | 7           |  |  |  |
|             | Skeletal and Muscular Disorders           | 6.45E-04 - 5.71E-10 | 24          | Immunological Disease                         | 1.02E-02 - 7.38E-06 | 6           |  |  |  |

#### TABLE 4 | The top 5 disease and disorders of the up-regulated and down-regulated IGs in cytokines KO microarrays.

upN/down: number of up-regulated IGs/number of down-regulated IGs.

Enrichment Analysis (GSEA) database (https://www.gsea-msigdb. org/gsea/index.jsp). As shown in Table 5, 96 ROS regulators were modulated by deficiencies of PCs, transcription factors and miRs. Table S11 listed the detail expression changes of ROS regulator. Deficiencies of IL6, STAT1, NF-kB-Rela, miR155 resulted in no downregulation of ROS regulators. Venn Diagram analysis (Figure 10A) showed that: 1) deficiencies of proinflammatory regulators caused downregulation of 25 ROS regulators; 2) deficiencies of proinflammatory regulators caused upregulation of 32 ROS regulators; and 3) 39 ROS regulators were shared by upregulated and downregulated in deficiencies of proinflammatory regulators, suggesting that these 39 ROS regulators are required for the functions of modulated IGs in regardless of expressional levels of 9 proinflammatory regulators. Of note, the rest of the 69 ROS regulators were not significantly modulated in the deficiencies of major proinflammatory regulators.

Our detailed results showed that deficiencies of IL17RA, IL18 and NF-kB Rela result in upregulated heme peroxidase

myeloperoxidase (MPO) expression (78). MPO and MPOderived oxidants have been shown to contribute to the formation of foam cells, endothelial dysfunction and apoptosis, the activation of latent matrix metalloproteinases, and the expression of tissue factor that can promote the development of vulnerable plaque. Then, we hypothesized that IGs upregulated in deficiency of IL17RA are also upregulated by MPO. To examine this hypothesis, we found an anti-MPO antibodies microarray GSE89153 (Figure 10B) from the NIH-GEO database to analyze the cooperation between ROS generator MPO (Figure 10C) and proinflammatory cytokine receptor IL17RA. The cooperation analysis, as we reported (55), showed that among 197 common significantly differentially expressed IGs in IL17RA KO and Anti-MPO microarrays, 121 IGs (61.42%) were cooperatively regulated (p<0.05). 12 genes were highly cooperatively regulated (Blue line box, p < 0.05, |log2FC|>1). The GO enrichment (http://geneontology.org/) was analyzed by using Metascape software and GSEA (68, 69). The



result showed that four in seven down-regulated genes (marked in red in **Figure 10C**) were enriched in GO:0001819: positive regulation of cytokine production (**Figure 10D**). The GSEA results of all the significant differential expression genes (p<0.05, |log2FC|>1) in IL17RA KO showed the REACTIVE\_OXYGEN\_SPECIES\_METABOLIC\_PROCESS and POSITIVE\_REGULATION\_OF\_CYTOKINE\_PRODUCTION genes significantly enriched in the IL17RA KO groups with notable normalized enrichment score (NES; https://en.wikipedia. org/wiki/Gene\_set\_enrichment\_analysis) and false discovery rate

(FDR; https://en.wikipedia.org/wiki/False\_discovery\_rate) (Figure 10E). Our results have demonstrated a novel mechanism that deficiencies of IL-17RA and presumably IL-18 promote MPO upregulation, which drives a ROS-dependent inflammation.

# DISCUSSIONS

These progresses lead to the development of many cytokine blockage-based therapies for inflammatory diseases and CVDs.



therapy microarrays. The result showed that except for interferon signaling, several cancer related, inflammatory response and cytokine signalings, were activated in these two microarrays. (C) Venn diagram showed 97 significantly differentially expressed genes were shared by Tnf KO and anti-TNF therapy microarrays. The 97 genes were carried out enrichment analysis by using metascape. The result showed the type I interferon signaling pathway, lymphocyte differentiation, Adaptive Immune System, regulation of innate immune response, response to bacterium etc. were the significantly enriched GO or pathways. **Table S10** is IPA results of upand down-regulated innatomic genes in anti-TNF therapy microarray.

The CANTOS trial with the Mab Canakinumab to block proinflammatory cytokine IL-1 $\beta$  was a recent success in treating coronary artery disease (30). However, recent reports from our and others' teams suggest that inhibition of one proinflammatory regulators such as cytokines or microRNAs leads to new waves of inflammation. To approach these types of inflammation paradoxes, we performed an extensive -omics data mining analyses with the method that we pioneered in 2004 (56, 57, 79) and made a set of significant findings: 1) PCs suppress IGs; and upregulated IGs in the deficiencies of IFN $\gamma$ , IFN $\gamma$ R1, IL- 17A, STAT3 and miR155 are more than that after deficiencies of TNF $\alpha$ , IL-1 $\beta$ , IL-6, IL-18, STAT1, NF-kB, and miR221; 2) IFN $\gamma$ / IFN $\gamma$ R1 and IL-17RA inhibit 10, 59 and 39 pathways, respectively; in contrast TNF $\alpha$ , IL-6 and IL-18 inhibits four to five pathways; 3) The IFN $\gamma$ -promoted and -suppressed programs have 4 shared pathways, IFN $\gamma$ R1-promoted and -suppressed programs have 11 shared pathways; and miR155-promoted and -suppressed programs have 13 shared pathways, suggesting negative-feedback mechanisms in their regulatory pathways for IGs; 4) Deficiencies of PCs and transcription

#### TABLE 5 | 165 ROS regulators were analyzed in inflammatory molecules KO microarrays.

| No. | PCs and regula-        | GEO NO.                      | Method        |          | ROS regulators |  |    |      |   |  |  |
|-----|------------------------|------------------------------|---------------|----------|----------------|--|----|------|---|--|--|
|     | tors                   |                              |               |          |                | Up-regulated   |    |      | Down-regulated  |  |  |
|     |                        |                              |               | Ν        | %              | Genes  | Ν  | %    | Genes   |  |  |
| 1   | Proinflammatory of TNF | <b>Sytokines</b><br>GSE43145 | Tnfa KO       | 3        | 2.42           | Bst1,Cryab,Foxm1   | 4  | 2.42 | Ncf1,Noxo1,Sod1,Tlr2  |  |  |
| 2   |                        | GSE33253                     | Tnfr1,2<br>KO | 4        | 2.42           | Cyp1b1,Nfe2l2,Sirt5,Tgfbr2   | 13 | 7.88 | Acod1,Cd36,Cps1,Crp,Cybb,Ddit4<br>Edn1,Fpr2,Mmp3,Ncf1,Pdgfb,<br>Sesn1,Tnf             |  |  |
| 3   | IFNG                   | GSE9892                      | lfng KO       | 7        | 4.24           | Ace2,Bmp7,Egfr,Fbln5,Mapt,<br>Noxo1,Sod1   | 14 | 8.48 | Acod1,Apoa4,Bnip3,Bst1,Cybb,<br>Fpr2,Hk2,Nos2,P2rx7,Sftpd,Sod3,<br>Tfap2a,Xdh,Zc3h12a |  |  |
| 4   |                        | GSE39592                     | lfngr1 KO     | 10       | 6.06           | Cd177,Cdkn1a,Cps1,Cyp1b1,<br>Mapt,Mt3,Pdgfb,Pla2r1,Sesn2,<br>Sod1  | 11 | 6.67 | Acod1,Bco2,Bmp7,Bst1,Cryab,<br>Foxm1,Fpr2,Gls2,Ncf1,P2rx7,Sirt5                       |  |  |
| 5   | IL1B                   | GSE15750                     | Traf6 KO      | 0        | 0.00           | N/A  | 2  | 1.21 | Coq7,Syk  |  |  |
| 6   |                        | GSE73875                     | lrak1 KO      | 3        | 1.82           | Cybb,Fpr2,Tyrobp   | 0  | 0.00 | N/A   |  |  |
| 7   | IL6                    | GSE63761                     | II6 KO        | 11       | 6.67           | Cyba,Gch1,ltgam,ltgb2,Ncf1,<br>Ncf4,Nfe2l2,Prkcd,Tlr6,Tyrobp,<br>Vav1  | 3  | 1.82 | Agt,Ddit4,Nos3  |  |  |
| 8   | IL17                   | GSE88800                     | II17ra KO     | 23       | 13.94          | Acod1,Cd177,Cdkn1a,Ddit4,<br>Edn1,Fpr2,Gch1,Hif1a,Itgam,<br>Mmp3,Mpo,Mt3,Ncf1,Ncf4,<br>Nos2,Pdk4,Pon3,Rac2,Ripk3,<br>Sh3pxd2b,Thbs1,Tlr6,Tnf | 3  | 1.82 | Bco2,Mapt,Tigar   |  |  |
| 9   | IL18                   | GSE64308                     | II18 KO       | 6        | 3.64           | Cdkn1a,Duox1,Edn1,F2,<br>Rgn,Thbs1   | 1  | 0.61 | Alox12  |  |  |
| 10  |                        | GSE64309                     | II18 KO       | 7        | 4.24           | Apoa4,Cdkn1a,Ddit4,Gstp1,<br>Mpo,Pax2,Pdk4   | 8  | 4.85 | Bco2,Bnip3,Cd36,Duox1,Gadd45a<br>Itgam,Lep,Nqo1                                       |  |  |
| 11  | ProInflammatory        | GSE64310                     |               | 1<br>tor | 0.61           | Apoa4  | 2  | 1.21 | Bco2,Sh3pxd2a   |  |  |
| 12  | STAT                   | GSE40666                     |               | 6        | 3.64           | Cd36,Cdkn1a,Mt3,Pmaip1,<br>Sirt3,Syk   | 0  | 0.00 | N/A   |  |  |
| 13  |                        | GSE6846                      | Stat3 KO      | 8        | 4.85           | Cybb,Hif1a,Itgam,Mapk14,<br>Ncf1,Pla2r1,Syk,Tyrobp   | 3  | 1.82 | Brca1,Plin5,Sod1  |  |  |
| 14  | NFKB                   | GSE45755                     | Rela KO       | 6        | 3.64           | Cybb,Mpo,Ncf1,Ncf4,Tspo,<br>Tyrobp   | 0  | 0.00 | N/A   |  |  |
| 15  |                        | GSE30049                     | lkk2 KO       | 9        | 5.45           | Bcl2,Bmp7,Cryab,Cyp1b1,<br>Immp2l,Nox4,Pdk4,Prex1,<br>Thbs1  | 12 | 7.27 | Brca1,Cybb,Dhfr,Edn1,Ephx2,F2rl1<br>Gch1,Nos2,Pdgfb,Prcp,Ripk3,Sod                    |  |  |
|     | Inflammatory-rela      | ted miRNAs                   |               |          |                |  |    |      |   |  |  |
| 16  | MIR155                 | GSE45122                     | mir155<br>KO  | 3        | 1.82           | Bmp7,Crp,Nqo2  | 3  | 1.82 | Cyp1b1,Lrrk2,Pax2   |  |  |
| 17  |                        | GSE66815                     |               | 13       | 7.88           | Alox12,Bst1,Cyp1b1,Lrrk2,<br>Ncf2,Nos3,Pmaip1,Prex1,Rac2,Sesn1,Syk,Vav1,<br>Zc3h12a  | 10 | 6.06 | Agt,Cd177,Cdkn1a,Egfr,Foxm1,<br>Hif1a,Noxo1,Nqo1,Sirt2,Vdac1                          |  |  |
| 18  | MIR221                 | GSE19777                     | MIR221<br>KD  | 1        | 0.61           | CPS1   | 4  | 2.42 | ACOD1,CYBB,PLA2R1,SFTPD   |  |  |

Table S11 listed the detail expression changes of ROS regulator. (p < 0.05, Ilog2FCI>1).

factors-suppressed, -promoted programs share the signaling pathways and likelihood to develop 11 diseases including cardiovascular disease; 5) There are shared IGs and pathways between deficiency of TNF $\alpha$  in mice and anti-TNF therapy in clinical patients; 6) Mechanistically, up-regulated ROS regulators such as MPO caused by suppression of major proinflammatory molecules can drive the upregulation of "suppressed IGs". The original microarray experiments used different cells, which prevented us from comparing the effects of proinflammatory regulators in regulating the expressions of IGs in the same cell types. Although our database mining approach was not ideal, however, as the first step to fill in the important knowledge gap this approach was justified. Actually, this was a common practice that we (50) and others (51) often used in studying gene expression



FIGURE 10 | Mechanism: up-regulated reactive oxygen species (ROS) regulators can drive the upregulation of "suppressed innatomic genes". (A) 32 ROS regulators were up-regulated, 25 ROS regulators were down-regulated and 39 ROS regulators were common in up-regulated and down-regulated. (*p*<0.05, |log2FC|>1). Table S11 listed the detailed expression changes of ROS regulators. (B) Anti-myeloperoxidase (MPO) antibodies microarray GSE89153 was searched in GEO database to analyze the cooperation between ROS regulator MPO and proinflammatory cytokine II17ra. (C) Cooperation analysis shows 12 genes were highly cooperatively regulated by MPO and II17ra (Blue line box, *p*<0.05, |log2FC|>1). (D) GO enrichment analyzed from Metascape software showed four in seven down-regulated genes (red in (b) were enriched in GO:0001819: positive regulation of cytokine production. (E) GSEA results of all the significant differential expression genes (*p*<0.05, |log2FC|>1) in II17ra KO groups. NES, Normalized Enrichment Score; FDR, false discovery rate.

in non-ideal, heterogenous peripheral blood mononuclear cell populations (PBMCs) in pathophysiological conditions versus healthy conditions, which are actually composed of many cell types, such as B cells (~15 %), T cells (~70 %), monocytes (~5 %), and natural killer (NK) cells (~10 %) among others (80).

Indeed, in addition to PC regulation of IGs transcription examined in our study, PCs could also regulate innate immune regulators in several other modes: 1) mRNA stability (81); 2) riboclustering (82); 3) alternative splicing (83); 4) microRNA regulation (84); 5) long non-coding RNA regulation (85); 6) circular RNAs regulation (86); 7) protein translation (87); 8) protein neddylation (88); 9) ubiquitination-proteasome regulation (89); 10) epigenetic regulation (90); and 11) immune metabolism and innate immune memory (91, 92). The proof of principles demonstrated in examination of inflammatory paradoxes performed in the current manuscript are far-reaching and can be extended to other fields of study such as cancers, infectious diseases such as COVID-19 and various pathologies.

To summarize our findings presented here, we propose a novel working model (**Figure 11**) to integrate these results as follows: *first*, since proinflammatory cytokines and regulators are interconnected through evolution, single cytokine blockade therapies result in significant upregulation of a long list of IGs and signaling pathways, presumably the "second wave of inflammation" as we proposed (32). The second wave of inflammation suppressed by PCs and regulators has never been identified in this comprehensive manner. The second wave of inflammation may be the underlying mechanisms for MHO, adverse effects observed in patients receiving Mab therapies blocking PCs. Novel therapeutic strategies need to be developed based on our findings to combine several related immune therapies as demonstrated by the synergy between immune checkpoint receptor CD279 blocking therapy and

anti-TNF $\alpha$  therapy (93); *second*, the two groups of new IGs and their pathways have been identified as novel therapeutic targets including: *i*) IGs and their pathways shared by upregulated IGs and suppressed IGs after deficiencies of PCs and regulators; and *ii*) IGs and the pathways upregulated after deficiencies of PCs and regulators; *third*, deficiencies of PCs and regulators increase inflammatory diseases in up-regulated IGs. The new problems need to be seriously considered when designing blockade therapies for PCs and regulators; one new mechanism has been identified for modulating the expressions of IGs carrying out the second wave of inflammation: PCs blockade can regulate the expression of ROS regulators and up-regulated ROS regulators can drive the upregulation of "suppressed IGs". Taken together, we propose that multiple pathway convergent points can be new therapeutic targets for the future development



cytokine blockade therapies result in significant upregulation of innate immune regulators and signaling patriways, presumably "second wave of inflammation" as we proposed. (A) The second wave of inflammation may be the underlying mechanisms for metabolically healthy obesity (MHO), adverse effects observed in patients receiving monoclonal antibody (Mab) therapies in blocking proinflammatory cytokines. (B) The two groups of new innatome genes (IGs) and their pathways have been identified as novel therapeutic targets. (C) Deficiencies of proinflammatory cytokines and regulators upregulate innate immunomic genes reveal new problems and novel benefits for proinflammatory cytokine (PCs) blockade therapies. (D) Down-regulated IGs can increase infectious diseases. (E) PCs blockade can regulate the expression of ROS regulators and up-regulated ROS regulators can upregulate expression of IGs. A new mechanism, ROS regulators, has been identified for modulating the expressions of IGs carrying out the second wave of inflammation. of novel inflammation modulation therapies. The proof of principles demonstrated in the examination of inflammatory paradoxes performed in the current manuscript are far-reaching and can be extended to other fields of study such as cancers, infectious diseases such as COVID-19 and various pathologies.

One limitation of the current study is that due to the low throughput nature of verification techniques, we could not verify every result we identified with the analyses of high throughput data. We acknowledge that carefully designed *in vitro* and *in vivo* experimental models will be needed to verify the PCs and regulators deficiencies-upregulated IGs further and underlying mechanisms we report here. In addition, when -omics data with well-controlled clinical samples become available, we need to further verify and consolidate some of our new findings identified in mice here. Our findings nevertheless provide novel insights on the roles of upregulated IGs in the pathogenesis of inflammatory diseases, novel pathways underlying the multipathway convergent point suppression therapeutics models as well as new targets for the future therapeutic interventions for various inflammations.

### DATA AVAILABILITY STATEMENT

All the datasets used in this study are publicly available. The analyzed results in this study are included within the article and the **Supplementary Materials**.

### **AUTHOR CONTRIBUTIONS**

ML carried out the data gathering, data analysis and prepared tables and figures. JS, RZ, YSh, YSu, WY, JW, LuL, CD, CJ, FS, YL, KX, LiL, XW, XJ, and HW aided with analysis of the data. XY supervised the experimental design, data analysis, and manuscript writing. All authors contributed to the article and approved the submitted version.

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### SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fimmu.2020. 554301/full#supplementary-material

**SUPPLEMENTARY FIGURE S1** | The heatmap of diseases related to downregulated innatomic genes from IPA analysis comparison.

SUPPLEMENTARY TABLE S1 | Nine proinflammatory cytokine blocking monoclonal antibody therapies and clinical uses.

**SUPPLEMENTARY TABLE S2** | Ten additional inflammation paradoxes related to this study which have been reported.

 $\ensuremath{\textbf{SUPPLEMENTARY TABLE S3}}$  | The IGs and ROS regulators gene-lists used in this study.

**SUPPLEMENTARY TABLE S4** | The expression changes of housekeeping genes selected in this study.

SUPPLEMENTARY TABLE S5 | The expression changes of up-regulated and down-regulated innatomic genes in deficiencies of proinflammatory cytokines and regulators. (*p*<0.05, |Log2FC|>1)

**SUPPLEMENTARY TABLE S6** | The expression changes of up-regulated and down-regulated innatomic genes in Mab therapy microarrays. (*p*<0.05, |Log2FC|>1)

**SUPPLEMENTARY TABLE S7** | IPA results of up-regulated innatomic genes in deficiencies of proinflammatory cytokines and regulators. (|Z score|> 2)

**SUPPLEMENTARY TABLE S8** | IPA results of down-regulated innatomic genes in deficiencies of proinflammatory cytokines and regulators. (JZ score]> 2)

**SUPPLEMENTARY TABLE S9** | Pathways from IPA results of up- and downregulated innatomic genes in deficiencies of TFs. (|Z score|> 2)

**SUPPLEMENTARY TABLE S10** | IPA results of up- and down-regulated innatomic genes in anti-TNF therapy microarray.

SUPPLEMENTARY TABLE S11 | The expression changes of ROS regulators in deficiencies of proinflammatory cytokines and regulators. (p<0.05, |Log2FC|>1)

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**Conflict of Interest:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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