#### Knowledge-Driven Mechanism Enrichment of the Preeclampsia Ignorome

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#### SUPPLEMENTAL MATERIAL

This section provides additional information on the preeclampsia ignorome studies obtained from the Gene Expression Omnibus that were examined as part of our meta-analysis.

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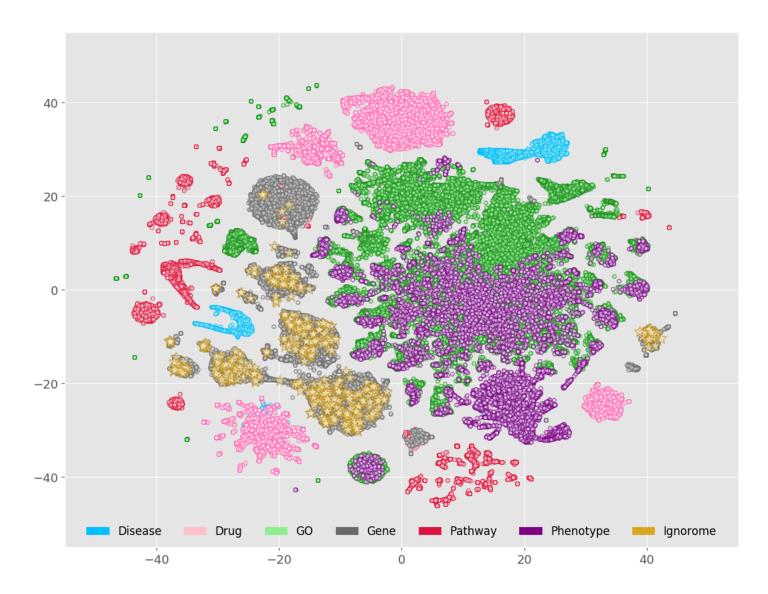
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#### **Keyword lists**

**Literature-Driven Keywords:** "Preeclampsia", "HELLP Syndrome", "Severe Preeclampsia", and "Placenta Disease"

**Gene-Driven Keywords:** "HELLP Syndrome", "gestational hypertension", "hypertensive disorders of pregnancy", "pre-eclampsia", "pre-eclamptic patient", "pre-eclamptic toxaemia", "pre-eclamptic toxaemia", "preeclampsia", "preeclamptic toxaemia", "preeclamptic toxaemia", "pregnancy hypertension", "pregnancy-related hypertensive disorder", "toxaemia of pregnancy", "toxaemic mother", "toxaemic pregnancy", "toxaemia of pregnancy", "toxaemic mother", "toxaemic pregnancy"



**Supplemental Figure 1.** t-SNE plot of PheKnowLator Node Embeddings with Preeclampsia Ignorome Genes.

The nodes are colored by biological type (i.e., disease [blue], drugs [pink], gene ontology concepts [green], genes [gray], pathways [red], and phenotypes [purple]) and ignorome genes indicated with gold stars.

# **Supplemental Table 1.** Status of Reviewed Preeclampsia GEO Studies.

| Source | GSE      | Decision | Exclusion Reason                                                    |
|--------|----------|----------|---------------------------------------------------------------------|
| GEO    | GSE10588 | Include  |                                                                     |
| GEO    | GSE24129 | Include  |                                                                     |
| GEO    | GSE73374 | Include  |                                                                     |
| GEO    | GSE14722 | Include  |                                                                     |
| GEO    | GSE4707  | Include  |                                                                     |
| GEO    | GSE74341 | Include  |                                                                     |
| GEO    | GSE25906 | Include  |                                                                     |
| GEO    | GSE35574 | Include  |                                                                     |
| GEO    | GSE30186 | Include  |                                                                     |
| GEO    | GSE44711 | Include  |                                                                     |
| GEO    | GSE60438 | Include  |                                                                     |
| GEO    | GSE43942 | Include  |                                                                     |
| GEO    | GSE75010 | Exclude  | May help with post hoc interpretation                               |
| GEO    | GSE12767 | Exclude  | May help with post hoc interpretation                               |
| GEO    | GSE85307 | Exclude  | May help with post hoc interpretation                               |
| GEO    | GSE91189 | Exclude  | Laser microdissection of cell types                                 |
| GEO    | GSE93839 | Exclude  | Laser microdissection of cell types                                 |
| GEO    | GSE94643 | Exclude  | Laser microdissection of cell types                                 |
| GEO    | GSE94644 | Exclude  | Laser microdissection of cell types                                 |
| GEO    | GSE6573  | Exclude  | Only 2 samples in the placenta condition                            |
| GEO    | GSE47187 | Exclude  | Control and case occur on the same probe, but in different channels |
| GEO    | GSE12216 | Exclude  | Not preeclampsia                                                    |
| GEO    | GSE13155 | Exclude  | Not preeclampsia                                                    |
| GEO    | GSE41681 | Exclude  | Not placenta biopsy; cultured HUVECs                                |
| GEO    | GSE13475 | Exclude  | Not placenta biopsy; cell culture                                   |
| GEO    | GSE4100  | Exclude  | Not placenta biopsy; cell culture                                   |
| GEO    | GSE54400 | Exclude  | Not placenta biopsy                                                 |
| GEO    | GSE86200 | Exclude  | Not placenta biopsy                                                 |
| GEO    | GSE48424 | Exclude  | Not placenta biopsy                                                 |
| GEO    | GSE91077 | Exclude  | Not placenta biopsy                                                 |
| GEO    | GSE79782 | Exclude  | Not placenta biopsy                                                 |

| Source | GSE      | Decision | Exclusion Reason                                              |
|--------|----------|----------|---------------------------------------------------------------|
| GEO    | GSE79781 | Exclude  | Not placenta biopsy                                           |
| GEO    | GSE79783 | Exclude  | Not placenta biopsy                                           |
| GEO    | GSE99007 | Exclude  | May help cell type contribution of DEG signature              |
| GEO    | GSE38747 | Exclude  | May help cell type contribution of DEG signature              |
| GEO    | GSE93020 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE49343 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE84260 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE69452 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE63743 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE57767 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE73375 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE75196 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE44667 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE59274 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE75941 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE41336 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE63999 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE50783 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE98938 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE97898 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE15789 | Exclude  | Not gene expression; not transcriptome                        |
| GEO    | GSE65271 | Exclude  | In vitro HTR8svneo                                            |
| GEO    | GSE37901 | Exclude  | Gestational age inconsistent with study design                |
| GEO    | GSE36083 | Exclude  | First trimester explants                                      |
| GEO    | GSE59686 | Exclude  | Fetal membranes; not true placental biopsy                    |
| GEO    | GSE74446 | Exclude  | Ex vivo cultured placental explants                           |
| GEO    | GSE40182 | Exclude  | Ex vivo cultured placental cells                              |
| GEO    | GSE41331 | Exclude  | Ex vivo cultured placental cells                              |
| GEO    | GSE73377 | Exclude  | Contains GSE73375 and GSE73374 (used GSE73374 for expression) |
| GEO    | GSE44712 | Exclude  | Contains GSE4467 and GSE44711 (used GSE44711 for expression)  |
| GEO    | GSE31679 | Exclude  | Cells cultures in vitro                                       |
| GEO    | GSE64272 | Exclude  | In vitro hESCs and iPSCs                                      |

| Source | GSE      | Decision | Exclusion Reason                                          |  |
|--------|----------|----------|-----------------------------------------------------------|--|
| GEO    | GSE72712 | Exclude  | In vitro hESCs                                            |  |
| GEO    | GSE22526 | Exclude  | No control samples; may help with post hoc interpretation |  |
| GEO    | GSE13299 | Exclude  | No control samples; may help with post hoc interpretation |  |
| GEO    | GSE9984  | Exclude  | May help with post hoc interpretation                     |  |
| GEO    | GSE25861 | Exclude  | May help cell type contribution of DEG signature          |  |
| GEO    | GSE54618 | Exclude  | Questionable, recommend excluding                         |  |

Supplemental Table 2. Final Set of GEO Studies and Differentially Expressed Gene Count by Study.

| GSE ID    | PMID     | Date | Platform<br>Details            | Study Groups                                         | Analysis<br>Groups                 | Sample             | DEGs                 |
|-----------|----------|------|--------------------------------|------------------------------------------------------|------------------------------------|--------------------|----------------------|
| GSE4707   | 16860862 | 2006 | Agilent-012391<br>G4112A       | Control (n=4)<br>EO (n=5)<br>LO (n=5)                | Control vs. EO<br>Control vs. LO   | Placenta           | EO: 4091<br>LO: 2075 |
| GSE10588  | 19249095 | 2008 | ABI Human<br>Genome V2.0       | Control (n=26)<br>SPE (n=17)                         | Control vs. SEP                    | Placenta           | 5049                 |
| GSE25906  | 21183218 | 2010 | Illumina<br>Human-6 v2.0       | Control (n=37)<br>PE (n=23)                          | Control vs. PE                     | Placenta           | 2616                 |
| GSE14722  | 18818296 | 2009 | Affymetrix<br>U133A/U133B      | PT Basal Plate<br>(n=11)<br>PE Basal Plate<br>(n=12) | Control vs. PE                     | Basal plate        | 551                  |
| GSE24129  | 21810232 | 2010 | Affymetrix HG<br>1.0           | Control (n=8)<br>FGR (n=8)<br>PE (n=8)               | Control vs. FGR<br>Control vs. PE  | Placenta           | FGR: 0<br>PE: 981    |
| GSE30186  | 22702245 | 2011 | Illumina<br>HumanHT-12<br>V4.0 | Control (n=6)<br>PE (n=6)                            | Control vs. PE                     | Placenta           | 201                  |
| GSE43942* | 23544093 | 2013 | NimbleGen<br>HG18              | Control (n=12)<br>PE (n=12)                          | Control vs. PE                     | placenta           | 1411                 |
| GSE74341  | 27016783 | 2015 | Agilent<br>SurePrint G3        | AT (n=5)<br>EO (n=7)<br>PT (n=5)<br>LO (n=8)         | PT vs. EO<br>AT vs. LO             | Placenta           | EO: 9627<br>LO: 6589 |
| GSE35574  | 23639576 | 2012 | Illumina<br>Human-6 v2.0       | Control (n=40)<br>IUGR (n=35)<br>PE (n=19)           | Control vs. IUGR<br>Control vs. PE | Placenta           | IUGR: 0<br>PE: 4519  |
| GSE44711  | 23770704 | 2013 | Illumina<br>HumanHT-12<br>V4.0 | Control (n=8)<br>EO PE (n=8)                         | Control vs. EO                     | Chorionic<br>villi | 500                  |
| GSE60438  | 26010865 | 2014 | Illumina<br>HumanWG-6<br>v3.0  | Control (n=23)<br>PE (n=25)                          | Control vs. PE                     | Decidua<br>basalis | 7228                 |
| GSE73374  | 26510177 | 2015 | Affymetrix HG<br>2.0           | Control (n=17)<br>PE (n=19)                          | Control vs. PE                     | Placenta           | 2678                 |

Acronyms - AT: At Term; DEGs: Differentially Expressed Genes (p < 0.05); EO: Early Onset; FGR: Fetal Growth Restriction; IUGR: Intrauterine Growth Restriction; LO: Late Onset; PE: Preeclampsia; PT: Preterm; SEP: Severe Preeclampsia. \*Downloaded differentially expressed gene list directly from authors.

# **Supplemental Table 3.** Entrez Gene Identifiers by Preeclampsia-Annotated Article Count.

| Article Count | Gene Symbols                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                |
|---------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| 0             | PRRG1, ZFPL1, ZNF84, ZNF646, TM9SF1, LMAN2, ILVBL, SMG5, NIPSNAP3A, ZNF330, CCDC59, SCCPDH, NIN, MBIP, KLHL28, EPS8L1, MRPS18A, LRRC1, ZNF83, CCDC47, PRRG4, RPAP3, SFXN3, RPF2, MIDN, ZNF439, TIGD7, SNX29, RDH13, LENG8, LRRC56, PUSL1, HINT3, ZNF555, CRYGN, CXorf38, ZNF114, LONRF2, DCP2, C6orf89, EP400NL, RNF222                                                                                                                                                                                                                                                     |
| 1             | ACTR3B, ADAMTSL3, AGFG1, ANXA7, ARHGAP9, ATXN7L2, BZW1, CHKA, CNOT3, CRIM1, DNAJB2, DNAJC1, DOK3, DOK6, ECM2, ENTPD4, ERRFI1, FAM120A, FBXO9, FRMD3, FXYD3, GART, HDGF, HERC4, HPCAL1, IL1RAP, IREB2, KTN1, LEO1, MAGT1, MBNL1, MFAP5, MRPL18, NFIA, NKTR, NRP2, OLFML3, ORMDL1, OSTF1, PAM, PCYOX1, PHYHIPL, POLR2H, PPP1R14B, PRKD3, PSPC1, RAPGEF3, RASGRP2, RBPMS, RFK, RGL1, RHOQ, RHPN1, SH3BGRL, SH3KBP1, SHPRH, SLC35F2, SNX3, SRP9, TARBP1, TBC1D22A, TBL1XR1, TCF7, TCP1, TGOLN2, TMEM136, TUBB, UBE2H, UPF3A, WDFY3, XPOT, YPEL4, ZFAND5, ZNF440, ZNF473         |
| 2             | APLP2, BIN2, ELL2, ENTPD1, KIAA0753, KLHL7, LASP1, MICAL1, MRPL3, NAALAD2, POGZ, PPP6R3, SCP2, SDF2L1, SNAPC4, SSFA2, STK11IP, THAP5, TMEM30A, TRIM14, WBP2, ZBTB48, ZCCHC2, ZFAND2B, ZNF7, CUL2, DST, HOXB5, MBD2, MPHOSPH8, MPPE1, PTP4A1, RARRES1, SLC28A1, SLC2A3, SLC2A5, SLC9A9, TPR, ANAPC4                                                                                                                                                                                                                                                                          |
| 3             | AP3S1, ATP11B, CLIC4, CSNK1G3, DSCC1, EEF1A1, GON4L, GOSR2, GPR155, HIGD1A, LIMCH1, MPHOSPH10, PNCK, PSMA2, RNF13, RPL18, SPTLC3, SSNA1, TAOK1, UGP2, CDH15, GGA1, NSF, PTGDS, TPT1, ANTXR1, LONP1, NECTIN4, PROCR, SETD1A, TRAF3, TRIM24                                                                                                                                                                                                                                                                                                                                   |
| 4-5           | CLASP2, EFHD1, HMGCS1, KCNMB4, KIF2A, MARCH6, PDZRN3, GFPT1, H3F3B, QPCT, HIP1, NAIP, RNF123, APMAP, ARHGEF4, COBLL1, HIPK3, NOC3L, RGS11, SLC30A5, NDFIP1, NEBL, MARS, PHF10, STX1A, IQGAP1                                                                                                                                                                                                                                                                                                                                                                                |
| 6-10          | BRWD1, COPS8, DNAJC10, LYPLA1, METAP1, NR2C1, PDE4DIP, TMEM45A, TRAK1, MAN1A1, PARP6, ZNF644, SLC35A2, STX16, TSPAN7, ACSS1, ALDH9A1, ARL6IP1, GDPD5, NFYC, RPS2, SLBP, TBCD, WTAP, FRMD4B, NEK11, PPM1K, SPATA13, BCAS4, KCTD11, BMP6, NDUFS7, TAF15, LRPPRC, DNAJC3, ERGIC1, GREM2, OMA1, PGLYRP1, PKP4, SPON1, YME1L1, YWHAB, DMTF1, IFITM2, ME2, MYO1B, ALDOA, HERC2, ACO2, ARRDC3, DDR1, HBD, ATXN10, ANKRD26, PBX2, RNF8, ACTR3, PPP2R5C, RASEF, USP10, JUP, CRIP2, NFIX, SCARB1, SLCO2A1, ASCC3, HIF3A, IGSF8, ARHGAP21, BAIAP2, MYT1, PDXK, LAMB1, MCFD2, MME, TFAM |
| 11-20         | BASP1, CEP72, CSNK2B, FASTK, USP11, CD164, ETNK1, TMED5, UCHL5, KRT19, MNT, NUS1, CCND2, QKI, SPG7, MXI1, TSNAX, PCBP2, STK38, E2F5, CETN2, STK17B, SEC63, RASSF8, DERL3, OLFM1, ZNF185, ANXA4, TPI1, PLOD1, CCAR1, RPS6KA5, BTF3, SSR1, STK24, PLA2G16, CFLAR, NCOA1, CTTN, SEMA7A, LRRFIP1, TLE4, GSR, HNMT, HDAC9, LMAN1, GALE, TAOK2, ATRN, FAM107B, TMED1, TMED10, RPN2, MGAT3, MKNK1, SLC27A2, NUDT6, CCNC, CSNK1A1, BCORL1, RAB6B, MATR3, PIK3CB                                                                                                                     |
| 21-30         | ARID3A, CD37, SLC44A1, PAQR3, ACSL3, RAP1GDS1, POLR3A, RHEB, ECD, DVL2, HILPDA, FOXF1, NEDD4L, BCAT1, CDO1, EXOSC6, CHD8, DYRK1A, ELL, RBBP4, PPP1R15A, ING5, CXXC1, PRPS1                                                                                                                                                                                                                                                                                                                                                                                                  |
| 31-50         | TRIM29, PSMC6, CALM1, KDM3A, YES1, CSNK2A2, DNM2, FBLN5, C2, ANGPTL1, ITPR1, SNAI2, KLF10, TUG1, CTSZ, CDH23, VPS35, PSME3, NPL, CTSK, SMG1, YWHAE, VPS13A, AGL, AMD1, GLUL, HEXB, BSG                                                                                                                                                                                                                                                                                                                                                                                      |
| 51-100        | LSP1, NUCB2, CEBPZ, SLC16A3, SLC6A8, PICALM, RASSF7, CSTB, SREBF1, MKKS, LPIN1, TRAF2, TPP1, PTPRU, BACH1, RNPC3, FHIT, LGALS3, AKAP12, EDNRB, BMP1, DCK                                                                                                                                                                                                                                                                                                                                                                                                                    |
| >100          | STS, SET, GHR, NDRG2, CLN3, ATXN2, KHDRBS1, SPP1, PDXP, DMPK, NPEPPS, GBA, CIB1, PMP22, IDH1, TARDBP, BRAF                                                                                                                                                                                                                                                                                                                                                                                                                                                                  |

### Supplemental Table 4. PheKnowLator-Derived Novel Phenotype Associations.

| Identifier                                                 | Ignorome Hits               | Domain Expert-Derived Evidence                                                                                                                                                                       |
|------------------------------------------------------------|-----------------------------|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Abnormal Mitochondria in Muscle Tissue (HP:0008316)        | NDUFS7<br>(ncbigene:374291) | Mitochondrial dysfunction is central to the pathophysiology of preeclampsia (PMID: 33417666). Trophoblast mitochondrial function is impaired in preeclampsia (PMID: 27939475).                       |
| Systemic Lupus Erythematosus (HP:0002725)                  | C2 (ncbigene:717)           | Women diagnosed with systemic lupus erythematosus are at increased risk of preeclampsia (PMID: 31754886).                                                                                            |
| Persistence of Hemoglobin F (HP:0011904)                   | HBD (ncbigene:3045)         | Increased fetal hemoglobin accumulation in the placenta is associated with preeclampsia (PMID: 25628568; PMID: 24185004).                                                                            |
| Elevated Plasma Branched Chain<br>Amino Acids (HP:0008344) | PPM1K<br>(ncbigene:152926)  | Plasma branched chain amino acids were higher in women with gestational diabetes mellitus than control (PMID: 31497040). Gestational diabetes mellitus increases preeclampsia risk (PMID: 25644816). |
| Microcytic Anemia (HP:0001935)                             | HBD (ncbigene:3045)         | Severe anemia is associated with higher risk of preeclampsia (PMID: 21867566).                                                                                                                       |

Acronyms - HP: Human Phenotype Ontology; NCBIGene: National Center for Biotechnology Information Entrez gene identifier.

### **Supplemental Table 5.** PheKnowLator-Derived Novel Pathway Associations.

| Identifier                                                           | Ignorome Hits                                                                                                                             | Domain Expert-Derived Mechanism(s)                                                                                                                                                                                                                                                                                                          |
|----------------------------------------------------------------------|-------------------------------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Complex I Biogenesis (R-HSA-6799198)                                 | NDUFS7 (ncbigene: 374291)                                                                                                                 | Trophoblasts cultured under hypoxic conditions have decreased Complex I respiration rate (PMID: 23383105). Hypoxia is thought to be central to the pathophysiology of preeclampsia (PMID: 30968806).                                                                                                                                        |
| Mitochondrial Translation Termination (R-HSA-5419276)                | MRPL3 (ncbigene:11222), MRPS18A (ncbigene:55168), MRPL18 (ncbigene:29074)                                                                 | Mitochondrial dysfunction is central to the pathophysiology of preeclampsia (PMID: 33417666). Trophoblast mitochondrial function is impaired in preeclampsia (PMID: 27939475).                                                                                                                                                              |
| Respiratory Electron Transport (R-HSA-611105)                        | NDUFS7 (ncbigene: 374291),<br>LRPPRC (ncbigene: 10128)                                                                                    | Placentas from preeclamptic pregnancies had decreased expression of essential electron transport chain proteins (PMID: 32916282). Abnormal electron transport is associated with early-onset preeclampsia (PMID: 29676857).                                                                                                                 |
| Elastic Fibre Formation (R-HSA-1566948)                              | MFAP5 (ncbigene: 8076),<br>FBLN5 (ncbigene: 10516)                                                                                        | The elastic fibre system is altered in umbilical cord vessels from pregnancies complicated by preeclampsia (PMID: 10794169).                                                                                                                                                                                                                |
| Diseases Associated with O-glycosylation of Proteins (R-HSA-3906995) | ADAMTSL3 (ncbigene: 57188),<br>SPON1 (ncbigene: 10418)                                                                                    | Altered o-glycosylation is associated with aberrant immune cell dynamics at the maternal-fetal interface (PMID: 32760395). In severe preeclampsia, altered glycosylation of maternal plasma proteins is associated with increased monocyte adhesion (PMID: 23757314).                                                                       |
| Rho GTPase Cycle<br>(R-HSA-194840)                                   | RHOQ (ncbigene:23433),<br>RHPN1 (ncbigene:114822),<br>ARHGEF4 (ncbigene:50649),<br>ARHGAP9 (ncbigene:64333),<br>ARHGAP21 (ncbigene:57584) | Human trophoblast migration is modulated by Rho GTPases (PMID: 21940708). Rho GTPases, RAC1 and CDC42, are required for prostaglandin E2-mediated human trophoblast migration (PMID: 18235104).                                                                                                                                             |
| Protein Folding (R-HSA-391251)                                       | TCP1 (ncbigene: 6950), RGS11 (ncbigene: 8786), TBCD (ncbigene: 6904)                                                                      | Protein misfolding and protein aggregation are associated with preeclampsia (PMID:31817906).                                                                                                                                                                                                                                                |
| Resolution of Sister<br>Chromatid Cohesion<br>(R-HSA-2500257)        | TAOK1 (ncbigene: 57551),<br>CLASP2 (ncbigene: 23122)                                                                                      | TAOK1 negatively regulates IL-17 signaling (PMID: 29400705). In preeclampsia, IL-17 is increased in maternal serum and placentas (PMID: 32416889). Human extravillous trophoblasts undergo endoreduplication (PMID: 22877079). Abnormalities of extravillous trophoblasts have been extensively described in preeclampsia (PMID: 29701150). |
| Interferon Signaling<br>(R-HSA-913531)                               | TRIM29 (ncbigene: 23650), IFITM2 (ncbigene: 10581), TRIM14 (ncbigene: 9830)                                                               | Alterations in placental expression of IFN-gamma and its receptor are associated with preeclampsia pathophysiology (PMID: 15585559). Increased expression IFN-gamma is associated with impaired trophoblast invasion and migration <i>in vitro</i> (PMID: 33335575).                                                                        |
| Epigenetic Regulation of Gene Expression (R-HSA-212165)              | MBD2 ( <u>ncbigene:8932</u> )                                                                                                             | Placentas from pregnancies complicated by preeclampsia exhibit alterations in methylation and gene expression (PMID: 31212604).                                                                                                                                                                                                             |

Acronyms - R-HSA: Reactome Pathway Database; NCBIGene: National Center for Biotechnology Information Entrez gene identifier.

### Supplemental Table 6. PheKnowLator-Derived Novel Drug Associations.

| Identifier                                      | Ignorome Hits               | Domain Expert-Derived Mechanism(s)                                                                                                                                                                                                                                                                                               |
|-------------------------------------------------|-----------------------------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Flavin Mononucleotide (MeSH: D005486)           | RFK (ncbigene: 55312)       | Riboflavin-deficient women are more likely to develop preeclampsia (PMID:10862839).                                                                                                                                                                                                                                              |
| 17-benzyl-5-androstane-3,17-diol (MeSH:C445526) | STS (ncbigene: 412)         | 17-benzyl-5-androstane-3,17-diol is an inhibitor of steroid sulfatase (PMID: 11600235). Steroid sulfatase is increased during preeclampsia in both placenta and maternal blood and modulates s-Flt1 (PMID: 27871476).                                                                                                            |
| Sodium Borate<br>(MeSH: C010634)                | STS (ncbigene: 412)         | Boron participates in Vitamin D metabolism (PMID: 29207789). Maternal Vitamin D levels are associated with preeclampsia risk (PMID: 27841759).                                                                                                                                                                                   |
| Estranes<br>(MeSH: D004962)                     | STS (ncbigene: 412)         | Oral contraceptive use for 8 or more years before pregnancy is associated with increased risk of preeclampsia (PMID: 10640157).                                                                                                                                                                                                  |
| HDL Cholesteryl Ester (MeSH: C059714)           | SCARB1 (ncbigene: 949)      | In preeclampsia, decreased levels of HDL-c have been observed during the third trimester (PMID: 24989239). The HDL-c of women with preeclampsia exhibits oxidative damage (PMID: 28511654).                                                                                                                                      |
| Glycogen<br>(MeSH: D006003)                     | AGL (ncbigene:178)          | Villous syncytiotrophoblast microvesicles isolated from placentas from pregnancies complicated by preeclampsia have increased glycogen content (PMID: 8514882).                                                                                                                                                                  |
| Enrasentan<br>(MeSH:C098288)                    | EDNRB (ncbigene:1910)       | Enrasentan is a high-affinity antagonist of Endothelin Type A Receptor (PMID: 12595914). Endothelin Type A Receptor antagonism has been suggested as a potential therapeutic strategy for preeclampsia (PMID: 28264495, PMID: 31221823).                                                                                         |
| Anti-Asthmatic Agents (MeSH: D018927)           | MME (ncbigene: 4311)        | Women who experience symptomatic asthma during pregnancy have an increased risk of preeclampsia (PMID: 16572909).                                                                                                                                                                                                                |
| Magnesium Oxide<br>(MeSH: D008277)              | CFLAR (ncbigene:8837)       | During a clinical trial, significantly fewer women developed hypertension during pregnancy when supplemented with magnesium oxide (PMID: 1492408).                                                                                                                                                                               |
| Sitagliptin Phosphate<br>(MeSH: D000068900)     | NAALAD2<br>(ncbigene:10003) | In gestational diabetes mellitus, Sitagliptin Phosphate ameliorates insulin resistance (PMID: 28213841). Preeclampsia is associated with increased risk of gestational diabetes mellitus in later pregnancies (PMID: 28542483). Women who experience preeclampsia are at increased risk of developing diabetes (PMID: 27646865). |

Acronyms - MeSH: Medical Subject Headings; NCBIGene: National Center for Biotechnology Information Entrez gene identifier.

## **Supplemental Table 7.** PheKnowLator-Derived Novel Gene Associations.

| Identifier                   | Ignorome Hits                                                                                                                                                                                                                                                                               | Domain Expert-Derived Mechanism(s)                                                                                                                                                                                                                                                            |
|------------------------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| PLOD2<br>(ncbigene:5352)     | PLOD1 (ncbigene:5351),<br>FBLN5 (ncbigene:10516), PTGDS<br>(ncbigene:5730)                                                                                                                                                                                                                  | Plod2, a protein associated with extracellular matrix remodeling, is upregulated in trophoblast stem cells cultured under hypoxic conditions (PMID: 27807143). Hypoxia is thought to be central to the pathophysiology of preeclampsia (PMID: 30968806).                                      |
| KCNMB3<br>(ncbigene:27094)   | KCNMB4 (ncbigene: 27345)                                                                                                                                                                                                                                                                    | KCNMB3 was differentially methylated at 2 CpG sites in cord blood samples obtained from pregnancies conceived using assisted reproductive technologies (PMID: 25580569). Women who conceive using assistive reproductive technologies are at increased risk of preeclampsia (PMID: 31046710). |
| NDUFB3 (ncbigene: 4709)      | NDUFS7 (ncbigene:374291),<br>SPG7 (ncbigene:6687),<br>LRPPRC (ncbigene:10128),<br>YME1L1 (ncbigene:10730)                                                                                                                                                                                   | Trophoblasts cultured under hypoxic conditions have decreased Complex I respiration rate (PMID: 23383105). Hypoxia is thought to be central to the pathophysiology of preeclampsia (PMID: 30968806).                                                                                          |
| MRPL32<br>(ncbigene:64983)   | MRPL3 (ncbigene:11222),<br>MRPS18A (ncbigene:55168),<br>MRPL18 (ncbigene:29074)                                                                                                                                                                                                             | Increased oxidative stress is central to preeclampsia pathogenesis ( <u>PMID: 20110125</u> ). Oxidative stress is associated with alterations in folding and degradation of MrpL32 ( <u>PMID: 21610694</u> ).                                                                                 |
| HBG1 (ncbigene:3047)         | HBD (ncbigene: 3045)                                                                                                                                                                                                                                                                        | Increased fetal hemoglobin accumulation in the placenta is associated with preeclampsia (PMID: 25628568, PMID: 24185004).                                                                                                                                                                     |
| RBBP7<br>(ncbigene:5931)     | RBBP4 (ncbigene:5928), HDAC9 (ncbigene:9734), SETD1A (ncbigene:9739), ING5 (ncbigene:84289), CSNK2A2 (ncbigene:1459), E2F5 (ncbigene:1875), H3F3B (ncbigene:3021), KDM3A (ncbigene:55818), MPHOSPH8 (ncbigene:54737), MBD2 (ncbigene:8932), CXXC1 (ncbigene:30827), BCORL1 (ncbigene:63035) | RBBP7 was identified using co-expression network analysis as a gene to prioritize for investigation for association with preeclampsia (PMID: 24219996).                                                                                                                                       |
| SLC30A7<br>(ncbigene:148867) | SLC30A5 ( <u>ncbiqene:64924</u> )                                                                                                                                                                                                                                                           | SLC30A7 is involved in regulation of cellular zinc and low levels of serum zinc are associated with preeclampsia (PMID: 26389947).                                                                                                                                                            |
| SLC44A5<br>(ncbigene:204962) | SLC44A1 (ncbigene:23446)                                                                                                                                                                                                                                                                    | SLCA44A5 is a choline transporter, and choline supplementation down-regulates preeclampsia-associated protein sFLT1 (PMID: 23195033).                                                                                                                                                         |

| Identifier             | Ignorome Hits                                                                                                                                                                                             | Domain Expert-Derived Mechanism(s)                                                                                                                                                      |
|------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| RHOU (ncbigene: 58480) | RHOQ (ncbigene:23433), RHPN1 (ncbigene:114822), BIN2 (ncbigene:51411), ARHGEF4 (ncbigene:50649), ARHGAP9 (ncbigene:64333), ARHGAP21 (ncbigene:57584), RAP1GDS1 (ncbigene:5910), SPATA13 (ncbigene:221178) | JAK/STAT signaling alters EGF-induced trophoblast invasion <i>in vitro</i> (PMID: 28542650). RhoU is downstream of the JAK/STAT signaling pathway (PMID: 29440639).                     |
| CCT2 (ncbigene:10576)  | TCP1 (ncbigene: 6950),<br>STK24 (ncbigene: 8428),<br>DNAJC3 (ncbigene: 5611),<br>USP11 (ncbigene: 8237),<br>MKKS (ncbigene: 8195),<br>RGS11 (ncbigene: 8786),<br>DNAJB2 (ncbigene: 3300)                  | Analysis of differentially expressed genes in preeclampsia reveals disruption of the CCT2-containing pathway "formation of tubulin-folding intermediates by CCT/Tric" (PMID: 30589053). |

Acronyms - HP: Human Phenotype Ontology; NCBIGene: National Center for Biotechnology Information Entrez gene identifier.

## **Supplemental Table 8.** PheKnowLator-Derived Novel Gene Ontology Associations.

| Identifier                                                   | Ignorome Hits                                                                                                                                                           | Domain Expert-Derived Mechanism(s)                                                                                                                                                                                                                                                                                                          |
|--------------------------------------------------------------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Mitochondrial Translational Elongation (G0:0070125)          | MRPL3 (ncbigene:11222), MRPS18A (ncbigene:55168), MRPL18 (ncbigene:29074)                                                                                               | Mitochondrial dysfunction is central to the pathophysiology of preeclampsia (PMID: 33417666). Trophoblast mitochondrial function is impaired in preeclampsia (PMID: 27939475).                                                                                                                                                              |
| Cellular Zinc Ion Homeostasis (GO: 0006882)                  | SLC30A5 (ncbigene: 64924)                                                                                                                                               | Preeclampsia is associated with lower levels of zinc in maternal serum (PMID: 26389947).                                                                                                                                                                                                                                                    |
| Mitochondrial Respiratory<br>Chain Complex I<br>(GO:0005747) | NDUFS7 (ncbigene: 374291)                                                                                                                                               | Trophoblasts cultured under hypoxic conditions have decreased Complex I respiration rate (PMID: 23383105). Hypoxia is thought to be central to the pathophysiology of preeclampsia (PMID: 30968806).                                                                                                                                        |
| Cul2-RING Ubiquitin Ligase<br>Complex<br>(GO:0031462)        | CUL2 (ncbigene: 8453)                                                                                                                                                   | miRNA-584 is differentially expressed in preeclampsia and targets CUL2 (PMID: 27529341).                                                                                                                                                                                                                                                    |
| Hemoglobin Complex (GO:0005833)                              | HBD (ncbigene: 3045)                                                                                                                                                    | Maternal hemoglobin concentration is associated with higher odds of preeclampsia (PMID: 30994929).                                                                                                                                                                                                                                          |
| Calmodulin Binding (GO: 0005516)                             | CALM1 (ncbigene:801),<br>IQGAP1 (ncbigene:8826),<br>BASP1 (ncbigene:10409),<br>MYO1B (ncbigene:4430),<br>PNCK (ncbigene:139728)                                         | CALM1 (Calmodulin 1) is differentially expressed in severe early-onset preeclampsia (PMID: 33754042). A protein-protein interaction network identified IQGAP1 as related to preeclampsia but poorly explored or of unknown preeclampsia pathophysiology (PMID: 22873350).                                                                   |
| Sister Chromatid Cohesion (GO:0007062)                       | TAOK1 (ncbigene: 57551),<br>CLASP2 (ncbigene: 23122)                                                                                                                    | TAOK1 negatively regulates IL-17 signaling (PMID: 29400705). In preeclampsia, IL-17 is increased in maternal serum and placentas (PMID: 32416889). Human extravillous trophoblasts undergo endoreduplication (PMID: 22877079). Abnormalities of extravillous trophoblasts have been extensively described in preeclampsia (PMID: 29701150). |
| Histone Binding (GO:0042393)                                 | H3F3B (ncbigene: 3021), MPHOSPH8 (ncbigene: 54737), SET (ncbigene: 6418)                                                                                                | Human trophoblast differentiation is associated with epigenetic changes ( <u>PMID: 31294776</u> ). Preeclampsia is associated with epigenetic alterations ( <u>PMID: 31343798</u> ). H3F3B is induced in preeclampsia ( <u>PMID: 16129025</u> ).                                                                                            |
| mRNA Splicing, via<br>Spliceosome<br>(GO:0000398)            | RNPC3 (ncbigene:55599),<br>ECD (ncbigene:11319),<br>CCAR1 (ncbigene:55749),<br>PCBP2 (ncbigene:5094)                                                                    | Alternative splicing affects many placental and preeclampsia-related genes (PMID: 33433680). Alternative splice variants of sFlt1 (PMID: 19147226) mineralocorticoid receptor (PMID: 31197761) are associated with preeclampsia.                                                                                                            |
| Actin Filament Binding (GO: 0051015)                         | ACTR3 (ncbigene:10096), NEBL (ncbigene:10529), ACTR3B (ncbigene:57180), MYO1B (ncbigene:4430), COBLL1 (ncbigene:22837), ZNF185 (ncbigene:7739), ITPRID2 (ncbigene:6744) | Preeclampsia is associated with altered actin polymerization via endothelial protein C receptor (PMID: 32003123).                                                                                                                                                                                                                           |

Acronyms - GO: Gene Ontology; NCBIGene: National Center for Biotechnology Information Entrez gene identifier.

### Supplemental Table 9. PheKnowLator-Derived Novel Disease Associations.

| Identifier                                            | Ignorome Hits           | Domain Expert-Derived Mechanism(s)                                                                                                                                                                                                                                                                                                                                                                  |
|-------------------------------------------------------|-------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Galactosemia (DOID: 9870)                             | GALE (ncbigene: 2582)   | Galactosemia is caused by mutations in one of three genes needed to metabolize galactose to glucose: GALT, GALK1, and GALE (PMID: 30451973). Hypoglycemia can present clinically as galactosemia (PMID: 9832597). Preeclampsia increases the risk of neonatal hypoglycemia (PMID: 22525036).                                                                                                        |
| X-linked Ichthyosis (DOID: 1700)                      | STS (ncbigene: 412)     | X-linked ichthyosis is a rare dermatological condition caused by STS deficiency ( <u>PMID: 30768640</u> ). STS expression is increased in preeclamptic placentas and maternal whole blood ( <u>PMID: 27871476</u> ).                                                                                                                                                                                |
| Progressive Bulbar Palsy (DOID: 681)                  | RFK<br>(ncbigene:55312) | Riboflavin Kinase is an essential enzyme for catalyzing the phosphorylation of riboflavin (PMID:12623014). Progressive bulbar palsy is caused by riboflavin transporter deficiency (PMID: 26973221). Riboflavin deficiency is a known risk factor for preeclampsia (PMID: 10862839).                                                                                                                |
| Amyotrophic Lateral Sclerosis (DOID: 332)             | TARDBP (ncbigene:23435) | TARDBP encodes the protein TDP-43 which accumulates in amyotrophic lateral sclerosis (PMID: 28476168). AhR agonists increase TDP-43 in neurons. Placentas with high AhR expression during fetal development are highly susceptible to environmental toxicants (PMID:20354149). AhR has been proposed as a mechanism for the protective effects of cigarette smoke on preeclampsia (PMID: 21864991). |
| Attention Deficit Hyperactivity Disorder (DOID: 1094) | STS (ncbiqene: 412)     | The association between attention deficit hyperactivity disorder and STS dysfunction has been well established (PMID: 21255266). Offspring of preeclamptic mothers are 3-fold more likely to be diagnosed with attention deficit hyperactivity disorder (PMID: 30605798).                                                                                                                           |
| Pleural Cancer (DOID: 5158)                           | SPP1 (ncbigene: 6696)   | SPP1 (secreted) has been shown to both regulate angiogenesis and inflammation associated with tumor growth and promote cancer cell survival, elements vital to the pathogenesis of pleural cancer (PMID: 22370646). SPP1 has been to be increased in preeclamptic patients with endothelial injuries (PMID: 19943814).                                                                              |
| Gaucher's Disease<br>(DOID:1926)                      | GBA(ncbigene:2629)      | Gaucher's disease is caused by mutations in GBA ( <u>PMID: 18338393</u> ). It's been hypothesized that increased GBA expression might relate to placentation through decreased BMP4 signaling or vascularization through downregulation of TFEB ( <u>PMID: 25552189</u> ).                                                                                                                          |
| Fatty Liver Disease (DOID: 9452)                      | STS (ncbigene: 412)     | STS expression has been shown to be induced in response to inflammation-activated NF-kB, a recognized mechanism in the development of chronic inflammatory liver disease (PMID: 26220752). STS expression is increased in the placenta and maternal whole blood samples of preeclamptic patients (PMID: 27871476).                                                                                  |

Acronyms - DOID: Human Disease Ontology; NCBIGene: National Center for Biotechnology Information Entrez gene identifier.