Sarpogrelate is an antiplatelet agent widely used to treat arterial occlusive diseases. Evaluation of platelet aggregation is essential to monitor therapeutic effects of sarpogrelate. Currently, no molecular signatures are available to evaluate platelet aggregation. Here, we performed comprehensive proteome profiling of platelets collected from 18 subjects before and after sarpogrelate administration using LC-MS/MS analysis coupled with extensive fractionation. Of 5423 proteins detected, we identified 499 proteins affected by sarpogrelate and found that they strongly represented cellular processes related to platelet activation and aggregation, including cell activation, coagulation, and vesicle-mediated transports. Based on the network model of the proteins involved in these processes, we selected three proteins (cut-like homeobox 1; coagulation factor XIII, B polypeptide; and peptidylprolyl isomerase D) that reflect the platelet aggregation-related processes after confirming their alterations by sarpogrelate in independent samples using Western blotting. Our proteomic approach provided a protein profile predictive of therapeutic effects of sarpogrelate. **Molecular & Cellular Proteomics** 15: 3461–3472, 2016.

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1 The abbreviations used are: 5-HT, 5-hydroxytryptamine; FASP, filter-aided sample preparation; FTICR, Fourier transform ion cyclotron resonance mass spectrometer; iPE-MMR, integrated post experiment monoisotopic mass refinement; UMC, unique mass class; AMT DB, accurate mass and time tag database; NET, normalized elution time; FDR, false discovery rate; ESI, electrospray ionization; DEP, differentially expressed protein; GOBP, Gene Ontology Biological Process; GOCC, Gene Ontology Cellular Component; GOMF, Gene Ontology molecular function.
(10–12). In these studies, the search for a protein profile indicative of the response of a drug was facilitated by the use of proteomic technologies. Platelets in blood play important roles in hemostatic or thrombotic mechanisms, inflammatory process, and cardiovascular pathogenesis. Platelets undergo considerable alterations by sarpogrelate. Moreover, because platelets are anucleated cells, protein profiles can provide more relevant information regarding the responses to sarpogrelate, compared with transcriptomic or genomic profiles. Several proteomic studies provided global proteome profiles of platelets under various conditions (13–16). For example, Burkhart et al. (13) and Qureshi et al. (16) identified 4191 and 1507 proteins, respectively, from human platelets in resting states. Also, several studies provided proteomes associated with responses of antiplatelet drugs. For example, Azcona et al. (17) compared platelet proteomes of type 2 diabetic patients with stable coronary ischemia after treatment of aspirin and clopidogrel + aspirin. As a proteome profile indicative of clopidogrel + aspirin, they proposed downregulated actin-binding protein isotypes 2 and 5 associated with cytoskeleton organization in patients treated with clopidogrel + aspirin, compared with aspirin treated patients. Lopez-Farre et al. (18) and Mateos-Caceres et al. (19) compared the proteomes of platelets from aspirin resistant and sensitive coronary ischemic patients and proposed, as proteome profiles indicative of aspirin resistance, up- and down-regulated proteins associated with platelet functions (cytoskeleton, energetic metabolism, oxidative stress, and cell survival) in aspirin resistant patients. However, to our knowledge, no proteomic analyses have been performed to identify a platelet proteome profile indicative of the response to sarpogrelate.

Here, we performed a comprehensive proteome profiling of platelets collected from 18 healthy subjects before and after administration of sarpogrelate. For each subject, platelets were isolated before and then again after drug administration to investigate the alteration in the platelet proteome by sarpogrelate. A sample preparation method involving filter-aided sample preparation (FASP) (20) was used to improve extraction of proteins including both soluble and membranous proteins. Moreover, an ultrahigh pressure liquid chromatography-tandem mass spectrometry (UHPLC-MS/MS) coupled with extensive fractionation was used to generate a comprehensive proteome of platelets. The platelet proteome obtained from LC-MS/MS analyses included 47,045 peptides for 5423 proteins. Of them, we identified hundreds of differentially expressed proteins (DEPs) in platelets by sarpogrelate, which are involved in cellular responses related to platelet activation and aggregation induced by 5-HT. Finally, of these proteins, we selected three proteins indicative of the response to sarpogrelate in platelets.

**EXPERIMENTAL PROCEDURES**

**Sample Preparation**—We collected two independent sets of platelet samples from healthy male Korean volunteers. The first set, including platelet samples from 18 subjects before and after administration of sarpogrelate, was used for the proteome profiling (supplemental Table S1A). The second set, including independent platelet samples from 5 subjects, which were not included in the first set, before and after sarpogrelate administration, was used to confirm the validity of the selected proteins by Western blotting (supplemental Table S1B). The eligibility was determined after a complete medical and laboratory examination. The exclusion criteria used were as follows: a history of cardiovascular, hepatic, renal, endocrine, gastrointestinal, hemorrhagic, or bleeding disorders; clinically significant findings on routine clinical laboratory testing or on physical examination; a history of hypersensitivity to sarpogrelate or other antiplatelet agents; and any medication history within 1 week prior to the enrollment in this study. Characteristics of the subjects in the two sets, such as age, body weight, and platelet counts, were summarized in supplemental Table S1. The subjects were admitted to the Clinical Trial Center at Samsung Medical Center on the day before the drug administration. All the subjects provided written informed consents, and the study protocol (SMCCPT-DP-1202) was approved by the institutional review board (IRB No. 2011–11–006). The food was standardized and strictly controlled during the whole study period. All volunteers were given 100 mg of sarpogrelate hydrochloride (Anplug 100 mg, Yuhan Corporation, Seoul, Korea) orally after an overnight fast. Blood samples were obtained before and 6 h after the drug administration.

**Experimental Design and Statistical Rationale**—For the proteomic analysis, we obtained a total of 18 pairs of platelet samples before and after the administration of sarpogrelate (supplemental Table S1A). The samples from 15 of 18 subjects were pooled and then used to generate a master accurate mass and time tag (AMT) database (DB). Next, the pairs of platelet samples for 14 of 18 subjects before (controls) and after the administration of sarpogrelate were used for LC-MS/MS profiling (supplemental Table S1A). According to power analysis (21) for one sample t test, which was used to identify differentially expressed proteins (DEPs; see below for justification), the sample size required to reliably detect an effect size of 1.3-fold with false negative rate (β) = 0.05 was 9. In the power analysis, the control distribution was defined as a normal distribution with $\mu = 7.32 \times 10^{-2}$ and $\sigma = 0.76$ estimated from the mean log$_{2}$-fold changes of proteins in our data sets. Considering that our sample size (14 paired platelet samples) was larger than 9, our sample size is sufficient to detect the DEPs with 2-fold (≥ effect size of 1.3-fold used in power analysis), which was used as the cutoff to identify the DEPs in this study. For each of the 14 biological replicates, we performed three LC-MS/MS experiments as technical replicates, resulting in 42 data sets for the samples before (controls) and after sarpogrelate administration, respectively.

**Platelet Preparation**—Eight milliliters of whole blood from each subject was collected using Acid-Citrate-Dextrose (ACD) as anticoagulant and then transferred into new polypropylene tubes. Platelet-rich plasma (PRP) was prepared by centrifugation at 200 $\times$ g for 20 min at room temperature. Two thirds of the PRP were transferred into a new tube, washed, and isolated by centrifugation at 800 $\times$ g for 10 min. Isolated platelets were resuspended in Tyrode’s Buffer containing 134 mM NaCl, 12 mM NaHCO$_3$, 2.9 mM KCl, 0.34 mM Na$_2$HPO$_4$, 1 mM MgCl$_2$, and 10 mM Hepes (pH 7.4). The platelet count was measured with a Coulter LH780 system (Beckman Coulter, Inc., Brea, CA). Because the protein contents of leukocytes are much higher than those of platelets, the contamination of platelets with leukocytes can affect significantly the quality of the measured platelet proteome. Thus, we checked the purity of our platelet samples and leukocyte contamination during our platelet preparation by flow cytometric analysis with CD45 and CD61 labeling, as previously described (22, 23), using the FACSCanto II Flow Cytometer (Becton Dickinson, San Jose, CA) and the Kaluza software (Beckman Coulter, Brea, CA). The flow cytometric assessment showed that our platelet samples contained 99.5–99.73% CD61 positive cells (platelets), but only 0.02–0.06%
CD45 positive cells (leukocytes) (supplemental Fig. S1), which corresponded to 2–6 leukocytes per 1 × 10⁵ platelets and also to 1–3% protein contamination based on the estimate previously described (24, 25). In this study, we used multiple centrifugation for platelet isolation and flow cytometric analysis to measure leukocyte contamination. In the four previous studies using these methods (16, 26–28), leukocyte contamination was in the range between 1 per 1 × 10⁵ and 1 × 10³ platelets. Thus, the leukocyte contamination in this study (2–6 per 1 × 10⁵ platelets) was within this range, implying that the purity of platelet samples and leukocyte contamination were comparable to those in previous studies.

**Protein Extraction and Digestion**—Platelet samples were dissolved in 200 μl of lysis buffer (4% SDS in 0.1 M Tris-HCl, pH 7.6) by 1 min of vortexing. Samples were then lysed by sonication using hand-type sonicator (Q55 Sonicator, QSONICA, CT) for 10 s at 30 W on ice. This lysis step was repeated five times. Protein concentration of each platelet samples was determined by BCA assay (Pierce, Rockford, IL). All platelet proteins were digested using slightly modified Filter-Aided Sample Preparation (FASP) method as previously described (29). Briefly, the protein sample was reduced with the SDT buffer (4% sodium dithionite in 0.1 M Tris-HCl, pH 7.6) for 45 min at 37 °C and boiled for 10 min at 95 °C on a thermodemix (Thermomixer, Eppendorf, Hamburg, Germany). Subsequently, it was sonicated for 10 min in bath sonicator (Power sonic 505, Hwashin Technology, Seoul, Korea) followed by centrifugation at 16,000 × g and 20 °C for 5 min. The supernatant was transferred to a membrane filter (YM-30, Millipore Corporation, Bedford, MA) and added 200 μl of 8 M urea in 0.1 M Tris-HCl (pH 8.5) to membrane filter. The protein sample on the membrane filter was centrifuged at 14,000 × g and 20 °C for 60 min to remove SDS. This wash step was repeated three times. Subsequently, reduced protein sample was alkylated on membrane filter with 100 μl of 50 mM iodoacetamide in 8 M urea for 25 min at room temperature in dark and followed by centrifugation at 14,000 × g for 30 min. The filter was washed with 200 μl of 8 M urea four times and again washed with 100 μl of 50 mM ammonium bicarbonate (pH 8.0) twice to buffer exchange. And then trypsin was added to the filter at an enzyme to protein ratio of 1:50 (w/w) and protein sample was digested at 37 °C for overnight. After the first digestion, the sample was digested with trypsin (1:100 w/w ratio) at 37 °C for 6 h again. Finally, the tryptic peptides were eluted by centrifugation at 14,000 × g and at 20 °C for 30 min and the filter was rinsed with 60 μl of 50 mM ammonium bicarbonate by centrifugation at 14,000 × g and at 20 °C for 20 min. The resulting peptide sample was dried by vacuum centrifugation and kept in −80 °C until the subsequent LC-MS/MS analysis.

**Basic pH Reversed Phase Liquid Chromatography Fractionation (BRP fractionation)**—Fifteen pairs of peptide samples (i.e. 15 before and 15 after sarpogrelate administration; supplemental Table S1A) were pooled and immediately fractionated into twelve fractions by high pH reverse-phase liquid chromatography fractionation method as previously described (29). The fractionation was performed using an Agilent 1260 Infinity HPLC system (Palo Alto, CA) equipped with an analytical column (Xbridge C18, 4.6 mm × 250 mm, 130 Å, 5 μm) and a guard column (Xbridge C18, 4.6 mm × 20 mm, 130 Å, 5 μm). For the peptide separation, a 115 min gradient was used at a flow rate of 500 μl/min: at 0% solvent B for 10 min, from 0% to 5% solvent B over 10 min, from 5 to 35% solvent B over 60 min, from 35 to 70% solvent B over 15 min, 70% solvent B for 10 min, from 70 to 0% solvent B over 10 min. Solvents A and B were 10 mM ammonium formate in water (pH 10) and 10 mM ammonium formate in 90% acetonitrile (ACN, pH 10), respectively. A total of 96 fractions were collected continuously into 96-well plate by a fraction collector (G1364C, Agilent, Palo Alto, CA) in every 1 min from 10 to 105 min. The 96 fractions were divided into four sections of early (from #1 to #24), first mid (from #25 to #48), second mid (from #49 to #72) and late (from #73 to #96) sections according to their elution time. The collected fractions were noncontiguously concatenated into 12 fractions by pooling two fractions from each section (i.e. #1 – #13 – #25 – #37 – #49 – #61 – #73 – #85, #2 – #14 – #26 – #38 – #50 – #62 – #74 – #86, ... #12 – #24 – #36 – #48 – #60 – #72 – #84 – #96). The concatenated fractions were dried by vacuum centrifugation and stored at −80 °C until further LC-MS/MS analysis.

**LC-MS/MS Analysis**—The 14 pairs of unfractionated peptide samples (supplemental Table S1A) and 12 mRFP fractions were analyzed by a 7-T Fourier transform ion cyclotron resonance mass spectrometer (LTQ-FT, Thermo Electron, San Jose, CA) coupled with a modified nanoACQUITY UPLC system (Waters, Milford, MA). LC-MS/MS experiments were performed triplicate on each of 28 unfraccionated peptide samples (i.e. a total of 84 LC-MS/MS experiments). The nanoACQUITY system was modified to dual-online ultra-high pressure liquid chromatography (DO-UHPLC) system for the high throughput analysis (30). Two capillary analytical columns (75 μm × 100 cm) and two solid phase extraction column (SPE) columns (150 μm × 3 cm) were manufactured in house with C18 bonded particles (Jupiter, 300 Å, 3 μm, Phenomenex, Torrence, CA) as previously described (31). Solvent A and B were 0.1% formic acid in water and 0.1% formic acid in ACN, respectively. A 240 min gradient was used at a flow rate of 300 nL/min: from 1 to 40% solvent B over 220 min, from 40 to 80% solvent B over 5 min, 80% solvent B for 10 min, and 1% solvent B for 5 min. The temperature of column was maintained at 60 °C (32). The electrospray voltage was 3.0 kV and the mass spectrometer was operated by data-dependent MS/MS mode. MS precursor scans (m/z range of 500–2,000 Th) were acquired at an automated gain control (AGC) target value of 1.0 × 10⁶ and a resolution of 1.0 × 10⁵ and maximum ion injection time (IT) of 1,000 ms. Up to 7 most abundant ions in a precursor scan were selected with isolation window of 3 Th with the exclusion duration of 30 s and fragmented using collision induced dissociation (CID) at normalized collision energy (NCE) of 35. The intensity threshold of initiating fragmentation was set to 500. Tandem mass spectra were acquired at an AGC target value of 1.0 × 10⁶ and maximum IT of 100 ms.

**Database Search for Peptide Identification**—The MS/MS data from a total of 96 LC-MS/MS experiments (i.e. 86 for unfraccionated samples and 12 for fractionated samples) were processed using iPE-MMR (33) for the refinement of precursor masses. The resultant MS/MS data was searched against uniprot human reference database (released September 2012; 69,391 entries) and the common contaminants (180 entries) using MS-GF+ search engine (V9012) (34). The mass tolerance for the precursor ion was set at 15 ppm and the number of tryptic termini was 1. Carbamidomethylation of cysteine was set to static modification. Oxidation of methionine and the carboxylation of N termini were set to variable modifications. Peptide-spectrum matches at the peptide-level false discovery rate (FDR) of 0.01 were used for further analyses. The mass spectrometry proteomics data have been deposited to the ProteomeXchange Consortium via the PRIDE partner repository with the data set identifier PXD003613 and 10.6019/PXD003613 (35).

**Label-free Peptide Quantification**—An MS intensity based label-free quantitative analysis was performed to platelet LC-MS/MS data as previously described (12). Briefly, in an LC-MS/MS experiment, all MS features of a peptide in different charge states that have similar monoisotopic masses (i.e. within the mass tolerance of 10 ppm) but different LC elution times over a period of elution times were grouped into a unique mass class (UMC) (36). UMC mass was calculated as intensity weighted average of monoisotopic masses of all the components of each UMC. Sum intensity of a UMC was calculated by summing the spectral intensities of all MS components of a UMC. During the PE-MMR analysis, the precursor mass of the MS/MS data
which each row contained sum intensities of UMC for each of the pairs of peptide samples) were combined into an alignment table in proteins, we then performed one sample test using log 2-fold values. The FDR cutoff of 0.1 was applied to the auto-scaled X- and Y-blocks. After the PLS-DA was performed, 5 selected proteins and also a Y-block data matrix were used to predict platelet activation and aggregation (cell activation, vesicle-mediated transport, Golgi vesicle transport, protein transport, and coagulation). We then constructed a network model for the DEPs, which was used to evaluate the abundance of the five selected proteins that can separate platelet samples obtained before and after administration (50). We generated an X-block data matrix (14 × 5) containing relative abundances of the 5 selected proteins and also a Y-block data matrix (14 × 1) containing group information (zeros and ones for before and after the administration). The data matrices were then auto-scaled for each column to have zero mean and unit standard deviation. PLS-DA was applied to the auto-scaled X- and Y-blocks. After the PLS-DA application, the three PLS latent variables (LV1–3) were selected after 10-fold cross-validations as previously described (51).

Western Blot—Briefly, 1 μg of the total protein from each sample was resolved on 4–12% NuPAGE gradient SDS-PAGE and then electrotransferred to a nitrocellulose membrane (Invitrogen, San Diego, CA). The blots were incubated overnight at 4 °C with primary antibodies against CD1 (1:600 dilution; Abcam, Cambridge, UK), PPD1 (1:500 dilution, Abcam), CD36 (1:500 dilution; R&D Systems, Minneapolis, MN), F13B (1:500 dilution; ProSci, Atlanta, GA), HOOK2 (1:500 dilution; Abcam), and CUX1 (1:500 dilution; Abcam) after blocking with 5% skim milk in PBS. The blots were treated with a horseradish peroxidase-conjugated (HRP) secondary polyclonal antibody (1:5,000 dilution; Abcam), detected using an ECL Western blotting detection system (Amersham Bioscience, GE Healthcare Life Science), and then monitored with a LAS-4000 (Fuji Film, Tokyo, Japan). We measured β-actin levels as a loading control. The blots were then quantified with Fujifilm Multi Gauge version 3.0. The list of primary antibodies for the selected proteins is summarized in supplemental Table S2.
Results

Comprehensive Profiling of Platelet Proteomes—We first carefully selected healthy male subjects \( n = 18 \) with no history of vascular diseases or hypersensitivity to antiplatelet agents, as well as no abnormal findings from clinical laboratory testing (see Experimental Procedures). The characteristics of the subjects, such as ages, body weights, and platelet counts, are summarized in supplemental Table S1. From each subject, we isolated platelets before and six hours after the administration of sarpogrelate (100 mg) to investigate platelet proteomes affected by sarpogrelate. To improve the coverage of proteomes to include membranous proteins, we used the FASP (20) method for protein digestion after obtaining the lysates of platelets (see Experimental Procedures).

To extensively profile platelet proteomes, we generated a master accurate mass and time tag (AMT) database (DB). To this end, we first pooled the peptide samples from 15 of the 18 pairs of platelet samples (supplemental Table S1A) obtained before and after the administration of sarpogrelate, respectively, performed high pH reverse phase fractionation of the pooled peptides into 12 fractions, and then analyzed these fractions using ultra-high pressure LC-MS/MS (Fig. 1A, left column). This resulted in 12 LC-MS/MS data sets (supplemental Fig. S2). In addition, we performed triplicate experiments on 14 of 18 pairs of the platelet samples (supplemental Table S1A), resulting in 84 \( (14 \times 2 \times 3) \) LC-MS/MS data sets (Fig. 1A, right column; supplemental Fig. S3). A total of 96 \( (12 + 84) \) LC-MS/MS data sets from the fractionation and triplicate experiments were used to construct a master AMT DB of platelet proteome.

We first generated unique mass classes (UMCs) of peptide MS features from individual data sets using iPE-MMR analysis (33) and then assigned both peptide IDs and normalized elution times (NETs) to UMCs (identified UMCs) after target-decoy MS-GF+ search (FDR < 0.01) and NET calculation. All identified UMCs from the 96 data sets were compiled into the master AMT DB (see Experimental Procedures; supplemental Table S3), which comprised 49,429 peptides (or AMTs; dots in Fig. 1B, left). For each of the 84 LC-MS/MS data sets, we then used the master AMT DB to assign peptide IDs to unidentified UMCs by matching them with AMTs using the mass and NET tolerances (10 ppm and 0.025 NET, respectively; Fig. 1B, right). Of the 49,429 peptides in the master AMT DB, we selected 47,045 peptides that cover 5423 platelet proteins with two or more sibling peptides and then used them for
protein quantitation in 84 LC-MS/MS data sets (supplemental Tables S4 and S5).

Characteristics of Platelet Proteome Profiles—To assess the comprehensiveness of our platelet proteome, we first compared our proteome (5,423 proteins) with the platelet proteomes previously reported (Fig. 2A). Four previous studies profiled the proteomes of resting platelets and then identified 4191 (13), 1373 (14), 837 (15), and 1507 (16) platelet proteins, respectively. Of these studies, Burkhart et al. (13) provided the largest platelet proteome including 4191 proteins by profiling the proteomes of resting platelets collected from four individuals using LC-MS/MS analysis after isobaric tag for relative and absolute quantitation (iTRAQ) labeling. The comparison of our proteome with the largest previous platelet proteome showed that of the 4191 proteins previously reported, 3121 (74.5% of 4191) were also detected in our proteome. These data indicate that our proteome can serve as one of comprehensive proteomes of platelets.

We then examined cellular processes represented by the 5423 platelet proteins by performing enrichment analysis of GOBPs using DAVID software (42). The cellular processes significantly represented by the platelet proteome included the processes related to major functions of platelets: adhesion to the interrupted endothelium (cell-substrate and cell-matrix adhesions and regulation of cell adhesion); activation involving shape changes and granule secretion (actin cytoskeleton organization, small GTPase mediated signal transduction, and vesicle-mediated transport); and aggregation (coagulation, wound healing, and regulation of fibrinolysis) (Fig. 2C; supplemental Table S6A). Moreover, the enrichment analysis of GOCCs revealed that a majority of the platelet proteins were localized in cellular components related to secretory granule that has been shown to be associated with platelet activation and aggregation (endoplasmic reticulum, Golgi apparatus, vesicle, secretory granule, and extracellular region) (28.8%), as well as plasma membrane (18.0%); cytosol (13.2%); cytoskeleton (11.3%); and mitochondrion (9.2%) (Fig. 2D; supplemental Table S6B). Specifically, our proteome included platelet granular proteins including 44 platelet α-granule and 5 platelet δ-granule proteins (secretory granule with 1.6% in Fig. 2D). These data indicate that our platelet proteome can provide a broad spectrum of information related to cellular processes occurring during platelet activation and aggregation in diverse cellular compartments.

Identification of Platelet Proteins Affected by Sarpogrelate—To identify platelet proteins whose abundances were affected by sarpogrelate, we first aligned each of 47,045 peptides for the 5423 proteins in the 84 LC-MS/MS data sets
(42 data sets for platelets collected before administration of sarpogrelate and the other half for those after sarpogrelate administration) and then determined the ratios of abundances of the 5423 platelet proteins measured before and after the administration of sarpogrelate in individual samples using the linear programming method previously reported (see Experimental Procedures) (40). By applying t-test to the protein ratios in 14 samples, we then identified 499 differentially expressed proteins (DEPs; FDR \( \leq 0.1 \) from t-test) before and after the administration of sarpogrelate (see Experimental Procedures; supplemental Table S7). Of the 499 DEPs, 348 proteins were up-regulated by the administration of sarpogrelate, whereas 151 were downregulated.

To understand the association of the DEPs with functions of sarpogrelate in platelets, we identified cellular processes represented by the 499 DEPs in platelets using DAVID software. This analysis revealed that the DEPs were mainly involved in the processes related to platelet activation and aggregation (cell activation, cell component morphogenesis, vesicle-mediated transport/Golgi vesicle transport/protein transport, actin cytoskeleton organization, coagulation, and regulation of small GTPase mediated signal transduction) (Fig. 3A; supplemental Table S8), consistent with the effect of sarpogrelate on platelet activation and aggregation involving shape changes and granule secretion (5, 52, 53). Interestingly, these processes were represented by both the up- and downregulated proteins (Fig. 3B), suggesting that the up- and downregulated proteins by sarpogrelate collectively act to define the function of sarpogrelate in the processes related to platelet activation and aggregation, such as coagulation and granule-mediated transports.

To explore collective functions of the DEPs in the aforementioned processes affected by sarpogrelate, we reconstructed a network model describing the interactions among the DEPs. In this network modeling, we focused on the DEPs involved in the processes relevant to granule secretion during platelet activation (cell activation, vesicle-mediated transport, Golgi vesicle transport, and protein transport); and platelet aggregation (coagulation) (Fig. 3C). First, the network model showed the alteration of the pathways associated with platelet activation (CD36-GNA11-VASP, ADRA1B-PLCB2, and FERMT3 pathways) and a thrombin-coagulation pathway for platelet aggregation involving FGG and F13B, suggesting the effect of sarpogrelate on these pathways associated with platelet activation and aggregation. Second, the network model showed the alteration of 1) Golgi-secretory granule trafficking involving COPG2, PPID, ACAP2/3-ARF1, and SEPT5 DEPs and 2) the endosomal network for vesicle trafficking involving PI5PS1A, AP2B1, CUX1, HOOK2, and ATP6V1B2 DEPs. The DEPs are involved in the components in these trafficking networks, suggesting the effect of sarpogrelate on the trafficking networks associated with granule secretion during platelet activation (Fig. 3C). The collective alteration of these processes further indicates that the processes related to platelet activation and aggregation are highly integrated and their collective contribution of these processes to the effects of sarpogrelate on platelet activation and aggregation, consistent with the previous findings (54–56).

A Proteome Profile Representing Antiplatelet Functions of Sarpogrelate—The network model above showed the alteration of the pathways associated platelet activation and the thrombin-coagulation pathway associated with platelet aggregation, as well as Golgi-secretory granule and the endosomal networks for vesicle trafficking associated with granule secretion during platelet activation (Fig. 3C). Thus, to select a proteome profile that can collectively represent the functions of sarpogrelate in platelets, we focused on the DEPs that can represent these pathways and trafficking networks. The up-regulated proteins can be preferred as biomarker candidates because of the easiness to detect their alterations, compared with the downregulated proteins (57–59). Moreover, the DEPs with large fold-changes can be further preferred for the increased accuracy in detecting their alterations. Based on these preference criteria, we selected the following five up-regulated proteins five up-regulated proteins for which (1) the average of fold-changes in 14 samples was larger than 2, and (2) the number of samples having fold-changes \( > 1.5 \) should be larger than half of 14 samples, as a proteome profile that represents the pathways and trafficking networks associated with platelet activation and aggregation in the network model (supplemental Fig. S4): (1) CD36 for platelet activation pathways, (2) F13B for the thrombin-coagulation pathway, (3) PPID for the Golgi-secretory granule network, and (4–5) CUX1 and HOOK2 for the endosomal network.

Validation of the Selected Protein Profile—Based on the network model, the five proteins were selected as a protein profile that can represent the effect of sarpogrelate on platelet activation and aggregation. These proteins showed up-regulation in 14 subjects used for LC-MS/MS analysis by sarpogrelate (Fig. 4A). For the five selected proteins, we first examined whether they are capable of distinguishing platelet samples collected before and after administration of sarpogrelate using partial-least square-discriminant analysis (PLS-DA; Fig. 4B) (12). The PLS-DA analysis showed that all platelet samples obtained after the administration of sarpogrelate (red dots in Fig. 4B) were correctly separated from those before the administration (blue triangles in Fig. 4B) using three latent variables (LV1–3; supplemental Table S9; Experimental Procedures).

To test the validity of the five selected proteins, we next collected the platelets from an independent set of five subjects based on the same criteria (see Experimental Procedures) employed for the collection of the samples at the discovery phase using LC-MS/MS analysis (supplemental Table S1). For these new samples, using Western blotting, we then tested differential expression of the five selected proteins measured by LC-MS/MS analysis. Of the five proteins, we
Fig. 3. Network models delineating cellular processes affected by sarpogrelate. A, Cellular processes (GOBPs) represented by the differentially expressed proteins (DEPs) between platelets before and after administration of sarpogrelate. The bars (A) represent -log_{10}(P) where P represents the significance of each GOBP being enriched by the DEPs. B, Numbers of the DEPs involved in the GOBPs. The numbers of up- and down-regulated proteins involved in each GOBP were separately shown. C, A network model describing the interactions of the DEPs involved in the GOBPs related to platelet activation and aggregation. Node colors represent the increase (red) and the decrease (green) in the abundance after administration of sarpogrelate. The color bar denotes the gradient of log_2-fold changes. Edges represent protein-protein interactions (gray) collected from five interactome databases (see Experimental Procedures). The arrows denote the reactions between the proteins, vesicle trafficking information, and flows of intracellular signaling obtained from the KEGG pathway database. The repression symbols denote suppressive reactions between the proteins obtained from the KEGG pathway database. See Experimental Procedures for further details regarding network modeling.
finally selected the three proteins (CUX1, PPID, and F13B) that showed the changes in the independent samples consistent to those shown in the LC-MS/MS data (Fig. 4C–F). These data indicate that the three proteins can serve as a protein profile that represents the effects of sarpogrelate in platelets.

**DISCUSSION**

Sarpogrelate, as an antagonist of 5-HT receptors, has been widely used to treat the diseases involving platelet aggregation induced by 5-HT. However, there are no assay methods that can be used to monitor the effect of sarpogrelate on platelet aggregation. In this study, we thus searched for a protein profile that can be used to evaluate platelet aggregation. In this search, we used the following approach that involves (1) a comprehensive proteome profiling of platelets with generation of a master AMT DB and ultra-high pressure LC-MS/MS analysis; (2) identification of the DEPs before and after administration of sarpogrelate; (3) selection of a protein profile that can represent cellular processes associated with platelet aggregation and activation by analyzing the network model of the DEPs involved in such cellular processes; and (4) validation of the selected protein profile in independent platelet samples using Western blotting. Using this approach, we identified a protein profile composed of three up-regulated proteins involved in the following platelet aggregation-related processes: F13B, CUX1, and PPID in platelet samples treated with sarpogrelate were confirmed. The data are shown as mean ± S.D. *p < 0.05 by Student’s t test.
ing platelet activation. These data suggest the validity of the selected proteins as a protein profile that can represent platelet aggregation. However, none of these proteins have been reported to be altered in their protein levels by sarpogrelate, suggesting the novelty of the three protein panel.

Platelets are anucleated cells, and the proteome data thus provide the more relevant information regarding functions of platelets, compared with genomic data. A number of studies have profiled the proteomes of platelets. The four studies (13–16) provided the proteomes of platelets in resting states. Although they could have served as useful resources for various studies of platelets, none of them have performed comparative proteomic analysis, thus providing no lists of DEPs related to platelet functions (e.g. the DEPs related to platelet activation and aggregation identified in this study). All of the three proteins selected as a protein profile indicative of platelet aggregation were detected in at least one of the previous studies. However, our study reported for the first time differential expression of the three selected proteins in platelets by sarpogrelate, thereby suggesting their potential use as the indicators of the effect of sarpogrelate on platelet aggregation in clinical settings.

Sarpogrelate was shown to negatively regulate platelet activation and aggregation (5). In this study, to investigate the proteins affected by sarpogrelate, we treated sarpogrelate on platelets obtained from healthy subjects. Because of the inhibitory effect of sarpogrelate on platelet aggregation, the proteins involved in the processes associated with platelet activation and aggregation are expected to be down-regulated by sarpogrelate. Unexpectedly, however, many of these proteins were up-regulated at 6 hours after treatment of sarpogrelate (Fig. 3B). Previously, Volpi et al. (63) profiled platelet proteomes at two different time points (12 and 24 h) after treatment of clopidogrel, an antiplatelet agent, and found up- and down-regulation of the proteins affected by clopidogrel at the different time points. For example, the abundances of the proteins (PFN1, MTPN, and MYL9) associated with actin organization were increased at 12 h after the loading dose of clopidogrel, but decreased below to the basal level at 24 h after stenting. This may account for the up-regulation of the proteins affected by sarpogrelate (e.g. proteins associated with actin organization) at 6 h after the treatment. Also, the secretion of 5-HT stored in platelets is not perturbed in healthy subjects, unlike the activated platelets under pathological conditions. Thus, the action of sarpogrelate can be different in platelets obtained from healthy subjects, which may lead to the up-regulation of the proteins affected by sarpogrelate. Detailed studies that examine temporal expression of the selected proteins in platelets from healthy subjects and activated platelets under pathological conditions can be carried out to understand how these proteins reflect the effects of sarpogrelate on platelet activation and aggregation. Moreover, the clinical implications of the three selected proteins can be further tested with a larger number of subjects. In addition, longitudinal studies can be designed to further demonstrate the nature of dynamic changes of the proposed protein profile after administration of sarpogrelate. Furthermore, more detailed functional studies can be carried out to understand the mechanistic contributions of the selected protein profiles to platelet aggregation.

In addition to the three proteins selected in this study, our approach provided a comprehensive list of DEPs related to platelet aggregation, thus extending extensively the current list identified by the conventional small-scale experiments or approaches. For example, deficiency or inhibition of growth arrest-specific gene 6 (GAS6), peptidylprolyl isomerase A (PPIA), serglycin (SRGN), and secreted protein, acidic, cysteine-rich (SPARC) were reported to be associated with thrombosis, inflammation, atherosclerosis, and metastasis, respectively (64–70). Thus, the list of DEPs can serve as a comprehensive resource to biologists who study the cellular processes associated with platelet aggregation (Fig. 3A). Moreover, the network model can provide a basis for understanding of the interplays of the cellular processes to collectively define platelet activation and aggregation induced by 5-HT (Fig. 3C). The GOBP enrichment analysis (supplemental Table S8) further showed that protein homeostasis-related processes (e.g. protein synthesis, protein folding, protein transport, and protein degradation) could be associated with platelet aggregation induced by 5-HT. This can suggest that protein homeostasis can serve as a potential measure to monitor the effect of sarpogrelate on the 5-HT-induced platelet aggregation. Moreover, the inhibition of protein homeostasis can be proposed as alternative targets of antiplatelet agents to the 5-HT receptors. In summary, our approach successfully identified a protein profile that can be used to monitor the effect of sarpogrelate on platelet aggregation induced by 5-HT, and the protein profile can provide new insights into the mechanism associated with functions of sarpogrelate in platelets.

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