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Pilot investigation of circulating angiogenic and infammatory biomarkers associated with vascular malformations

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Abstract

Background: Vascular malformations in the central nervous system are difficult to monitor and treat due to their inaccessible location. Angiogenic and inflammatory proteins are secreted into the bloodstream and may serve as useful biomarkers for identifying patients at risk for complications or with certain disease phenotypes.

Methods: A validated multiplex protein array consisting of 26 angiogenic and infammatory biomarkers (Angiome) was assessed in plasma isolated from healthy controls and patients with either sporadic brain arteriovenous malformation (BAVM), familial cerebral cavernous malformation (CCM), or hereditary hemorrhagic telangiectasia (HHT). These samples were obtained from archives of ongoing research studies at the University of California San Francisco and through prospective collection at the Toronto HHT Centre at St. Michael's Hospital.

Results: We compared circulating biomarker levels from each patient group to healthy controls and analyzed each pairwise combination of patient groups for diferences in biomarker levels. Additionally, we analyzed the HHT samples to determine the association between biomarker levels and the following HHT-specifc phenotypes, BAVM, pulmonary arteriovenous malformation (PAVM), liver vascular malformation (LVM), and gastrointestinal (GI) bleeding. Compared to controls, levels of SDF1 were significantly elevated in HHT patients (Proportional Increase [PI] = 1.87, p <0.001, q = 0.011). Levels of sENG were significantly reduced in HHT patients compared to controls (PI = 0.56, *p*<0.001, q<0.001), refecting the prevalence of HHT1 patients in this cohort. Levels of IL6 (PI=3.22, *p*<0.001, q < 0.001) and sTGFβR3 (PI = 0.70, *p* = 0.001, q < 0.029) differed significantly in CCM patients compared to controls. Compared to controls, ten of the biomarkers were signifcantly diferent in sporadic BAVM patients (q-values<0.05). Among the pairwise combinations of patient groups, a signifcant elevation was observed in TGFβ1 in CCM patients compared to sporadic BAVM patients (PI=2.30, *p* < 0.001, g=0.034). When examining the association of circulating biomarker levels with HHT-specifc phenotypes, four markers were signifcantly lower in HHT patients with BAVM (q-values<0.05), and four markers were signifcantly higher in patients with LVM (q-values<0.05).

Conclusions: This pilot study suggests that the profle of circulating angiogenic and infammatory biomarkers may be unique to each type of vascular malformation. Furthermore, this study indicates that circulating biomarkers may be useful for assessing phenotypic traits of vascular malformations.

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Keywords: Vascular malformations, Biomarkers, HHT, CCM

Background

The Brain Vascular Malformation Consortium (BVMC) is a collaborative group of investigators dedicated to improving the care of patients with familial cerebral cavernous malformation (CCM), Sturge–Weber Syndrome (SWS), and hereditary hemorrhagic telangiectasia (HHT) [[1\]](#page-9-0). Due to the presence of vascular malformations in the central nervous system, these patients may experience a range of debilitating and/or life-threatening symptoms including seizures, headache, and increased risk of cerebral hemorrhage. There is a lack of effective and targeted therapies for these patients and quality of life sufers as a result. Furthermore, these vascular malformations are difficult to monitor due to a reliance on imaging and the inability to biopsy the vascular malformations, while the localization of these lesions in the central nervous system complicates treatment. Currently it is challenging to predict which patients are at risk of worse outcomes. Therefore, it would be valuable to identify biomarkers from a non-invasive tissue source, such as blood, that are associated with disease phenotypes or outcomes.

Circulating biomarkers (or the liquid biopsy) have become an area of intense research interest over the past three decades. The cancer realm has extensively studied circulating biomarkers to examine correlations with clinical outcomes after drug treatment [[2\]](#page-9-1), to identify biomarkers that predict a patient's response to a particular treatment [[3](#page-9-2)], and to monitor disease progression or recurrence. One hallmark of cancer progression is the association of localized increases in angiogenic signals, promoting the development of new vasculature neces-sary to feed the growing tumor [[4\]](#page-9-3). Secondly, numerous studies have demonstrated that tumors secrete various cytokines to recruit infammatory cells and the resulting infammation is involved in tumor progression [\[4](#page-9-3)]. Based on the angiogenic nature of many solid tumors and the rapid expansion of anti-angiogenic agents being used in the clinic, the Nixon lab developed a multiplex protein array that interrogates many key circulating biomarkers simultaneously. This biomarker panel, termed the Angiome, has been approved by the National Cancer Institute and the assay validated across numerous clinical studies [[2,](#page-9-1) [5](#page-9-4), [6\]](#page-9-5).

Similar to cancer, angiogenic and infammatory processes are dysregulated in vascular malformation diseases [[7,](#page-9-6) [8](#page-9-7)]. In recent years, there has been increased interest in identifying circulating biomarkers associated with disease phenotypes in vascular malformation diseases. For example, a recent study used computational

models to fnd associations between circulating biomarker levels and bleeding or hemorrhagic expansion of lesions in patients with CCM [\[9](#page-9-8)[–11](#page-9-9)], demonstrating the feasibility of linking circulating markers to disease traits in vascular malformation diseases. Other studies have investigated the utility of non-coding RNAs, including microRNAs, as biomarkers for disease-associated phenotypes [[12,](#page-9-10) [13](#page-9-11)]. One such study found that elevated levels of microRNA-210 in the circulation were associated with pulmonary arteriovenous malformation (PAVM) in patients with HHT [[13](#page-9-11)], providing further support for our approach investigating biomarkers in the circulation for associations with disease phenotypes. Studies have also been conducted examining circulating biomarkers in HHT [[14–](#page-9-12)[16\]](#page-9-13); however, these studies have generally been limited to a few carefully selected markers involved in angiogenic processes. Therefore, additional studies, such as the pilot study reported here, are necessary to better distinguish disease-associated phenotypes and in the future, determine if there are circulating markers associated with measurable disease outcomes.

The goal of this pilot project was to determine if there are circulating angiogenic and/or infammatory biomarkers that are associated with sporadic brain arteriovenous malformation (BAVM), familial CCM, and HHT. Although sporadic BAVM patients are not part of the BVMC, these samples were included as a comparison group to investigate whether the circulating markers in sporadically developing arteriovenous malformations (AVMs) difer from the markers in patients with inherited AVMs that occur in HHT. Many of the markers evaluated in our analysis have been previously shown to exhibit abnormal levels in each of these vascular malformation diseases [\[7](#page-9-6), [8,](#page-9-7) [17](#page-9-14)], and thus we hypothesized that diferences useful for characterizing each type of vascular malformation may be observed. This study also conducted preliminary analyses of whether circulating biomarkers may be associated with specifc phenotypes in patients with HHT. Samples were unavailable for SWS at the time of this study and are therefore not included in this analysis.

Results

Patient demographics and HHT organ involvement

Summary statistics of patient and control characteristics by sample type are reported in Table [1.](#page-3-0) A total of 90 samples were included in the dataset (42 HHT, 20 controls, 18 CCM, and 10 sporadic BAVM). The mean patient age across all sample groups was 47.9 years old. Females

Table 1 Patient characteristics

Table 2 HHT organ involvement

*Information about liver involvement was only available for 37 patients

made up 61% of the total samples. Of the 82 samples with race and ethnicity information available, 61 (74%) were non-Hispanic Caucasians and 21 (26%) were Hispanic. A summary of organ involvement among HHT patients is presented in Table [2](#page-3-1). Among HHT patients, 20 (48%) had BAVM, 30 (71%) had pulmonary arteriovenous malformation (PAVM), 9 (21%) had gastrointestinal (GI) bleeding, and 3 of 37 with information (8%) had symptomatic liver vascular malformations (LVM). HHT organ involvement was defned as previously described [\[18](#page-9-15)].

Biomarker levels in patients with vascular malformations compared to healthy controls

We compared circulating levels of each biomarker for each patient population (HHT, CCM, sporadic BAVM) to healthy controls. The regression results are presented in Table [3.](#page-4-0) When comparing HHT samples to healthy controls, stromal cell-derived factor 1 (SDF1) levels were signifcantly higher in HHT patients (Proportional Increase $[P1] = 1.87, 95\%$ confidence interval [CI] 1.34 to 2.62, p <0.001, q=0.011) and soluble endoglin (sENG) levels were significantly lower (PI=0.56, 95% CI 0.45 to 0.69, p <0.001, q<0.001). When comparing CCM samples to healthy controls, interleukin 6 (IL6) levels were signifcantly higher in CCM patients ($PI = 3.22$, 95% CI 2.08 to 4.98, *p*<0.001, q<0.001, Fig. [1](#page-4-1)) and soluble transforming growth factor beta receptor 3 (sTGFβR3) levels were significantly lower (PI = 0.70, 95% CI 0.57 to 0.86, $p = 0.001$, $q=0.029$). When sporadic BAVM samples were compared to healthy controls, several markers were found to difer signifcantly from controls, including glycoprotein 130 (GP130), IL6, soluble IL6 receptor (sIL6R), plateletderived growth factor AA (PDGF-AA), transforming growth factor beta 1 (TGFβ1), sTGFβR3, tissue inhibitors of metalloproteinases 1 (TIMP1), thrombospondin 2 (TSP2), soluble vascular cell adhesion molecule 1 (sVCAM1), and soluble vascular endothelial growth factor receptor 1 (sVEGFR1) (see Table [3](#page-4-0) for PI, CI, *p* values, and q-values). When we compared between the disease groups (i.e., HHT vs. CCM, HHT vs. sporadic BAVM, and CCM vs. sporadic BAVM), the only signifcant fnding was an elevation of TGFβ1 in CCM samples compared to sporadic BAVM samples ($PI = 2.30$, 95% CI 1.45 to 3.63, *p*<0.001, q=0.034) (Additional fle [1:](#page-8-0) Table S1).

Biomarker levels associated with disease phenotypes in HHT patients

Finally, we performed analyses using only HHT samples to assess the association of biomarker levels with disease phenotypes in HHT patients. The results for the HHT-specifc analyses are presented in Table [4](#page-5-0). We found that HHT patients with BAVM had lower levels of GP130 (PI=0.78, 95% CI 0.68 to 0.89, *p*<0.001, $q=0.017$), soluble vascular endothelial growth factor receptor 3 (sVEGFR3) (PI=0.75, 95% CI 0.63 to 0.88, $p=0.001$, $q=0.017$), soluble intracellular adhesion molecule 1 (sICAM1) (PI=0.74, 95% CI 0.62 to 0.88, $p=0.001$, q=0.017), and TSP2 (PI=0.59, 95% CI 0.44 to 0.80, $p = 0.001$, $q = 0.017$) compared to HHT patients without BAVM. We found that HHT patients with LVM had higher levels of TSP2 (PI=3.39, 95% CI 2.08 to 5.53, *p*<0.001, q<0.001), sENG (PI=2.07, 95% CI 1.35 to 3.18, *p*=0.001, q=0.028), GP130 (PI=1.65, 95% CI 1.30 to 2.09, $p < 0.001$, $q = 0.002$), and TIMP1 (PI=1.94, 95% CI 1.29 to 2.92, $p = 0.002$, $q = 0.034$) compared to patients without LVM documented. There were no biomarkers signifcantly associated with PAVM and GI bleeding among HHT patients.

Discussion

In this pilot study, we characterized the plasma profle of 24 biomarkers that are known to drive angiogenesis and infammation. We identifed markers that were diferentially expressed in patients with either sporadic BAVM, CCM, or HHT compared to healthy controls without known vascular anomalies. Among the diferent patient

CI confdence interval; *PI* proportional increase

Bold values indicate markers with a q-value less than 0.05. Sample sizes vary from 53 to 62 for HHT versus controls, 31 to 57 for CCM versus controls, and 25 to 30 for Sporadic BAVM versus controls

populations, we found that unique subsets of circulating markers existed across each group, with the exception of IL6, which was signifcantly higher in CCM and sporadic BAVM patients and trending higher in HHT patients. These data suggest that unique angiogenic and inflammatory processes may be involved in each disease, which may be useful for future monitoring of the patients as well as identifying the best course of treatment, at both the individual and disease level.

We identifed several statistically signifcant associations that may be relevant to disease pathogenesis and phenotype presentation. When comparing the patient groups to healthy controls, we found a statistically signifcant elevation in IL6 levels in patients with CCM and sporadic BAVM and a non-signifcant elevation in patients with HHT (Fig. 1). These data suggest a shared role for IL6 in the pathology of vascular malformations. IL6 is a well-known multifunctional cytokine with reported roles in cardiovascular disease and endothelial dysfunction [\[19\]](#page-9-16). In recent years, there has been

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increased focus on the role of IL6 in the pathophysiology of vascular malformations. For example, polymorphisms in IL6 have been associated with hemorrhage in patients with sporadic BAVM [\[20](#page-9-17)]. More recently, another study found decreased levels of IL6 in patients with hemorrhagic activity of a lesion compared to an initial blood sample [[9\]](#page-9-8). Since our study only assessed a single blood sample from each patient, we were unable to determine if these fndings hold true in our patient population. Together, these fndings indicate an important role for IL6 in the pathophysiology of vascular malformations, warranting further study.

When comparing CCM patients to healthy controls, we also found reduced levels of circulating TGFβR3, which has not been previously reported. Transforming growth factor beta (TGF-β) signaling is involved in regulating vascular development [\[21](#page-9-18)]. TGFβR3 belongs to one of the three types of TGF-β receptors, and it is widely expressed [[21\]](#page-9-18). Although this receptor lacks kinase activity, and thus does not result in downstream signaling upon ligand binding, TGFβR3 is known to participate in ligand presentation to the other TGF-β receptors, especially to transforming growth factor beta receptor 2 (TGFβR2) [[21\]](#page-9-18). Pertinent to this study, the soluble extracellular domain of TGFβR3 binds TGF-β in the circulation to antagonize signaling $[21]$ $[21]$. Increased TGF-β signaling has been implicated in the pathology of CCM [\[22](#page-9-19), [23](#page-9-20)], specifcally in the endothelial-mesenchymal transition in mature CCM lesions [[23\]](#page-9-20). Together, these results indicate that further investigation into the role of TGF-β signaling in the context of CCM may be informative.

When comparing HHT samples to healthy controls, a statistically signifcant reduction in sENG was noted. However, when we restricted our analysis to the HHT samples for which genotyping information was available, we found that patients with HHT1 (mutations in *ENG*) had a 54% reduction in sENG compared to patients with HHT2 (mutations in *ACVRL1*) (PI=0.54, 95% CI 0.42 to 0.69, *p*<0.001, q<0.001) (Additional fle [2](#page-8-1): Figure S1). Given that approximately 60% of the HHT cases with genetic information in our cohort have mutations in *ENG*, which matches the rates reported in other studies [[24\]](#page-10-0), these data indicate that the reduction observed in sENG is explained by the genetic basis of disease. This is further supported by a previous study demonstrating that HHT1 patients had signifcantly lower levels of sENG in the plasma compared to both HHT2 and healthy control groups $[25]$ $[25]$. These data also demonstrate that the HHT samples behave as expected with these ELISAbased arrays, strengthening the validity of our fndings. Our current study also found signifcantly elevated levels of SDF1 only when comparing plasma samples from patients with HHT to healthy controls, which suggests the possibility of a unique role for this chemokine in the pathology of the vascular malformations in HHT. SDF1, also known as CXCL12, is a chemokine with a multitude of functions, including recruitment of bone marrow-derived endothelial progenitor cells (EPCs) [[26](#page-10-2)] and involvement in patterning of the pulmonary arterial system [[27\]](#page-10-3). With regards to vascular malformations, increased levels of SDF1 have been reported in the nidus of sporadic BAVMs, specifcally in the endothelial and vascular smooth muscle cells of the malformation and is believed to contribute to the recruitment of EPCs to the AVM [\[28\]](#page-10-4). In the context of HHT, in vitro and animal model studies have suggested an interaction between SDF1 and ENG [[29\]](#page-10-5), including a role in regulating leukocyte transmigration across the endothelium [[30\]](#page-10-6) and in the regulation of SDF1 in the endothelium via BMP9 and ENG $[31]$ $[31]$. Therefore, further investigation into the role of SDF1 in the context of HHT, a form of familial AVMs, is warranted.

We found several statistically signifcant associations between the biomarkers assessed and HHT-associated BAVMs and LVMs. These associations may suggest different infammatory and angiogenic processes infuencing vascular malformations in specifc organs. Among HHT patients with BAVMs compared to HHT patients without BAVM, we found signifcant reductions in sICAM1 and sVEGFR3, suggesting a unique role for these proteins in BAVMs among HHT patients. Elevated levels of sICAM1 have been reported in patients with subarachnoid hemorrhage [[32](#page-10-8), [33\]](#page-10-9), and thus further investigation into the role of ICAM1 in HHT-associated BAVM may yield useful insights. VEGFR3 is one of three receptors for the vascular endothelial growth factors (VEGF) and is critically involved in the development of lymphatic vessels, a process known as lymphangiogenesis $[34]$ $[34]$. This receptor may also play a role in regulating blood vessel angiogenesis and permeability $[34]$ $[34]$, suggesting that further investigation into the role of VEGFR3 in vascular malformations may be informative. We also found elevated levels of sENG and TIMP1 associated with LVMs among HHT patients. Since LVMs are more common in patients with mutations in *ACVRL1* [[35,](#page-10-11) [36](#page-10-12)], the increase in sENG observed in this study is likely due to the genetic basis of disease, rather than a further increase above normal levels. TIMP1, one of four tissue inhibitors of metalloproteinases (TIMP), participates in the regulation of extracellular matrix proteins. Elevated levels of several TIMPs, including TIMP1, have been reported in the nidus of BAVMs from patients with sporadic BAVM [\[37](#page-10-13)], difering from the results published in this study. Further study is required to determine if this diference is due to the sample type assessed or clinical diference in the patient populations. In addition to the markers found to

be associated with vascular involvement in a single organ, we found that GP130 and TSP2 had signifcantly diferent circulating levels in association with both BAVM and LVM in HHT patients. Interestingly, these markers were decreased in association with BAVMs, but increased in association with LVMs. These results may reflect different angiogenic and infammatory environments to promote and maintain vascular malformations in these distinct organs or may refect the underlying genetic basis of HHT since BAVMs are much more common in patients with HHT1, whereas LVMs are more common in patients with HHT2 [[35](#page-10-11), [36\]](#page-10-12).

A limited number of studies have examined select circulating biomarkers, including angiogenic proteins and regulatory molecules such as microRNAs, in HHT patient populations [\[14](#page-9-12)[–16](#page-9-13), [38\]](#page-10-14). An older study reported reduced levels of TGFβ1 in the circulation of HHT1 patients $[14]$ $[14]$, but this marker did not differ significantly in any of the comparisons assessed in our study. More recently, one study reported reduced levels of sVEGFR1 in the circulation of HHT2 patients compared to healthy controls [\[16](#page-9-13)]. Our current study failed to replicate these fndings, which may be due to diferences in anti-coagulant agents (EDTA vs. heparin) or due to the fact that our analysis did not stratify HHT patients based on genotype. Finally, one group found elevated levels of pentraxin 3 in plasma from HHT patients compared to healthy controls [[15\]](#page-9-21). Interestingly, this marker was also more strongly associated with epistaxis-related scores than any other marker they assessed [\[15](#page-9-21)], supporting the hypothesis that there are indeed circulating biomarkers associated with disease-specific phenotypes. These studies, along with the data from our current study, highlight the need for further investigation into circulating factors that are associated with disease-specifc phenotypes and events.

There are several caveats to this study that warrant discussion. First, this study of limited sample size is meant only to provide initial hypotheses that require validation in larger cohorts. Due to the limited sample size, we did not have sufficient power to conclusively show whether the underlying genetic cause of each disease (e.g., mutations in *ENG* vs. *ACVRL1* for HHT patients) infuenced the profle of circulating biomarkers. Furthermore, this study was not sufficiently powered to detect small changes in circulating biomarker levels, unless these changes were very consistent among a disease group. Additional prospective, multi-site studies are required to expand the number of patients in each cohort to answer these important research questions. A second caveat of this study is that there were diferences in the length of storage time between sample groups. Specifcally, the sporadic BAVM and CCM samples were exclusively from bio-banked samples available through the BVMC, while approximately two-thirds of the HHT samples and all of the healthy control samples were collected prospectively from a single site. However, when we included the acquisition site as a correction factor in our analysis, as a proxy of storage time, the results did not appreciably change. Moving forward, future studies will be conducted with prospective sample collection. A third caveat is that this study was conducted using heparin plasma samples, which may skew some of the biomarker levels due to the presence of heparin-binding domains on some of the proteins, such as VEGF. However, this is a minor caveat since all samples analyzed were heparin plasma and this study was focused on characterizing in broad terms which markers were diferentially present, rather than the absolute concentration of a particular marker in the blood.

Conclusion

In conclusion, this pilot study found that the profle of circulating angiogenic and infammatory biomarkers difers between patients with diferent types of vascular malformations, suggesting the importance of assessing individual conditions for relevant biomarkers. Our study also suggests that circulating biomarkers may represent a non-invasive method for assessing organ involvement in HHT patients, but this requires further validation. Future work should include patients with diferent types of vascular malformations and genetic etiologies, and address associations with prospective disease outcomes in patients with rare vascular malformations through longitudinal studies.

Methods

Samples and eligibility criteria

Heparin plasma samples were used to assess circulating angiogenic and infammatory biomarkers levels. Frozen samples from sporadic BAVM and familial CCM patients were obtained from cases enrolled at the University of California San Francisco (UCSF) as part of ongoing research studies. HHT samples were obtained from either cases enrolled at UCSF as part of ongoing research studies $(N=26$ patients) or were collected prospectively at the Toronto HHT Centre at St. Michael's Hospital ($N=16$ patients), after obtaining informed consent. Healthy control samples were prospectively collected at the Toronto HHT Centre at St. Michael's Hospital, after obtaining informed consent.

All sporadic BAVM cases with confrmed diagnosis of shunting on conventional angiography who were seen at UCSF for evaluation or treatment were eligible to be enrolled into the parent study. Familial CCM cases were eligible to be enrolled at UCSF if they had a confrmed genetic mutation in one of the 3 known CCM

genes or met 2 of 3 clinical criteria of CCM diagnosis, multiple brain lesions, and/or family history of CCM in frst-degree relatives.

HHT cases were eligible to be enrolled if they had a confrmed genetic mutation in one of the 3 known HHT genes or met defnite diagnosis of HHT by the clinical Curaçao criteria [[39\]](#page-10-15), which include: (1) recurrent and spontaneous epistaxis; (2) numerous telangiectasias present on the skin of the hands or in and around the nose and mouth; (3) vascular malformations, specifcally AVMs and telangiectasias, afecting internal organs such as the brain, liver, and gastrointestinal tract; and (4) a family history of HHT. Cases with a history of severe anemia (hemoglobin $[HB] < 80$ g/L) in the last month or a blood transfusion within one month of the visit date were excluded from the study. HHT samples from both UCSF and St. Michael's Hospital were included in this study.

Healthy controls were eligible for enrollment if they were 18 years of age or older. Individuals were excluded from the control arm using the following criteria: (1) a defnite, probable, or likely HHT diagnosis; (2) a history of severe anemia (HB < 80 g/L) in the last month; and (3) a blood transfusion within one month of the visit date.

Determination of circulating biomarker levels

Circulating biomarker levels were assessed using a panel multiplexed ELISA, termed the Angiome, as previously described [[2,](#page-9-1) [5](#page-9-4), [6\]](#page-9-5). Since the amount of plasma was limited for selected samples, not every biomarker was able to be assessed across all samples. We determined which markers to assay for each sample by assessing the volume requirements for each assay and selected the combination of markers that yielded the greatest number of biomarker data points for each sample. Of the 26 markers available as part of the Angiome panel, a total of 24 biomarkers were included in the analysis (Table 5). We were unable to run regression analyses on two of the markers, VEGF-C and VEGF-D, due to insufficient numbers of disease samples with data available.

Table 5 List of biomarkers assessed

*Data not presented due to insufficient sample size for linear regression

Statistical methods

We used linear regression models to test whether individual biomarker levels were associated with individual phenotypes, while adjusting for age and sex. Phenotypes tested included patient type (e.g., HHT vs. control) and HHT-related organ involvement (e.g., HHT-related BAVM vs. non-BAVM). Models testing for HHT-related organ involvement included only HHT patients. Since many biomarkers were heavily right-skewed in distribution, we log-transformed all biomarker values to lessen the impact of outliers and better adhere to linear regression model assumptions. Two biomarkers, ANG2 and VEGF, had several readings below the limits of detection (LOD); for the purpose of data analysis, we set these readings to the midpoint between zero and the LOD before log-transformation. All results are presented as exponentiated coefficients, which we labeled as proportional increases (PI). A PI greater than one indicates an increase; for example, a PI of 1.2 is interpreted as 20% higher biomarker levels compared to the reference group. We additionally provide 95% confdence intervals (CI), *p* values, and q-values (q) derived from the Yekutieli method to correct for multiple testing. We focus on results with q-values less than 0.05. Stata version 15.1 was used to perform statistical analyses (College Station, TX: StataCorp LLC.).

Abbreviations

AVM: Arteriovenous malformation; BAVM: Brain arteriovenous malformation; BVMC: Brain Vascular Malformation Consortium; CCM: Cerebral cavernous malformation; CI: Confdence interval; EPC: Endothelial progenitor cell; GI: Gastrointestinal; GP130: Glycoprotein 130; HB: Hemoglobin; HHT: Hereditary hemorrhagic telangiectasia; LOD: Limit of detection: LVM: Liver vascular malformation; PAVM: Pulmonary arteriovenous malformation; PDGFAA: Plateletderived growth factor AA; PI: Proportional increase; SDF1: Stromal cell-derived factor 1; sENG: Soluble endoglin; sICAM1: Soluble intracellular adhesion molecule 1; IL6: Interleukin 6; sIL6R: Soluble interleukin 6 receptor; sTGFβR3: Soluble transforming growth factor beta receptor 3; sVCAM1: Soluble vascular cell adhesion molecule 1; sVEGFR1: Soluble vascular endothelial growth factor receptor 1; sVEGFR3: Soluble vascular endothelial growth factor receptor 3; SWS: Sturge–Weber Syndrome; TGFβ: Transforming growth factor beta; TGFβ1: Transforming growth factor beta 1; TIMP: Tissue inhibitors of metalloprotein‑ ases; TIMP1: Tissue inhibitors of metalloproteinases 1; TSP2: Thrombospondin 2; UCSF: University of California San Francisco; VEGF: Vascular endothelial growth factor.

Supplementary Information

The online version contains supplementary material available at [https://doi.](https://doi.org/10.1186/s13023-021-02009-7) [org/10.1186/s13023-021-02009-7](https://doi.org/10.1186/s13023-021-02009-7).

Additional fle 1: Table S1. Linear regression of biomarker levels between vascular malformation diseases. $Cl =$ confidence interval; $Pl =$ proportional increase; Bold values indicate markers with a q-value less than 0.05. Sample sizes vary from 45 to 59 for HHT vs. CCM, 38 to 52 for HHT vs. Sporadic BAVM, and 17 to 27 for CCM vs. Sporadic BAVM.

Additional fle 2: Figure S1. Soluble endoglin levels among HHT patients stratifed by genotype. Log-transformed levels of sENG among HHT patients with genotype information were plotted. This analysis included

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Not applicable.

Authors' contributions

SWS, HK, MF, AN, and DM designed the study, interpreted the results, helped draft the manuscript, and reviewed the final version. JN performed the statistical analysis, interpreted the results, helped draft the manuscript, and reviewed the fnal version. SW and DC interpreted the results, provided revisions for the manuscript, and reviewed the fnal version. LP assisted with study design and reviewed the fnal version. MF, DC, and HK conducted recruitment and sample collection. MS and YL acquired the data, helped revise the manuscript, and reviewed the fnal version. All authors read and approved the fnal manuscript.

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Availability of data and materials

The datasets generated and analyzed during this current study will be made publicly available without patient identifers.

Declarations

Ethics approval and consent to participate

All participants provided written informed consent and the study was approved by the University of California, San Francisco Institutional Review Board (reference numbers 10-02012, 10-04632, and 14-15411) and by the Unity Health Toronto (St. Michael's Hospital) Research Ethics Board (reference number 12-010).

Consent for publication

Not applicable.

Competing interests

The authors declare no competing interests.

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