

High prevalence of KRAS/BRAF somatic mutations in brain and spinal cord arteriovenous malformations

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Brain and spinal arteriovenous malformations are congenital lesions causing intracranial haemorrhage or permanent disability especially in young people. We investigated whether the vast majority or all brain and spinal arteriovenous malformations are associated with detectable tumour-related somatic mutations. In a cohort of 31 patients (21 with brain and 10 with spinal arteriovenous malformations), tissue and paired blood samples were analysed with ultradeep next generation sequencing of a panel of 422 common tumour genes to identify the somatic mutations. We used droplet digital polymerase chain reaction to confirm the panel sequenced mutations and identify the additional low variant frequency mutations. The association of mutation variant frequencies and clinical features were analysed. The average sequencing depth was $1077 \pm 298 \times$. High prevalence (87.1%) of KRAS/BRAF somatic mutations was found in brain and spinal arteriovenous malformations with no other replicated tumour-related mutations. The prevalence of KRAS/BRAF mutation was 81.0% (17 of 21) in brain and 100% (10 of 10) in spinal arteriovenous malformations. We detected activating BRAF mutations and two novel mutations in KRAS (p.G12A and p.S65_A66insDS) in CNS arteriovenous malformations for the first time. The mutation variant frequencies were negatively correlated with nidus volumes of brain (P = 0.038) and spinal (P = 0.028) arteriovenous malformations but not ages. Our findings support a causative role of somatic tumour-related mutations of KRAS/BRAF in the overwhelming majority of brain and spinal arteriovenous malformations. This pathway homogeneity and high prevalence implies the development of targeted therapies with RAS/RAF pathway inhibitors without the necessity of tissue genetic diagnosis.

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Abbreviations: BAVM = brain arteriovenous malformation; ddPCR = droplet digital polymerase chain reaction; NGS = next generation sequencing; SAVM = spinal arteriovenous malformation

Introduction

Arteriovenous malformations are fast-flow vascular malformations characterized by connections between feeding arteries and draining veins, and although rare, are 20 times more common in the CNS, including the brain and spinal cord (Gomes and Bernatz, 1970; Milton et al., 2012). Brain arteriovenous malformations (BAVMs) occur in 1.3 per 100 000 patient years and are equally distributed across populations, while the prevalence of spinal arteriovenous malformations (SAVMs) is 1/10th of BAVMs and account for ~20-30% in all spinal vascular malformations (Cogen and Stein, 1983). Germline mutations can be associated with hereditary syndromes hallmarked by arteriovenous malformations, such mutations in the TGF-β/SMAD pathway (Gallione et al., 2004) in hereditary haemorrhagic telangectasia (HHT) or in the RAS p21 protein activator 1 (RASA1) in the capillary malformation-arteriovenous malformation syndrome (CM-AVM) (Eerola et al., 2003; Lapinski et al., 2018). However, sporadic vascular malformations are much more common and seem to be associated with somatic and not germline mutations. These include sporadic arteriovenous malformations, cavernous malformations (Couto et al., 2017; Al-Olabi et al., 2018; Nikolaev et al., 2018), vascular anomalies found in Sturge-Weber syndrome (Shirley et al., 2013; Nakashima et al., 2014), lymphatic and venous malformations (Limaye et al., 2009, 2015; Castel et al., 2016; Castillo et al., 2016) as well as vascular tumours such as haemangiomas. From these studies, the emerging picture is that most of these lesions are associated with mutations commonly found in cancer, mainly in the PI3K-AKT-mTOR in low vascular malformations including venous and lymphatic malformations (Karpathiou et al., 2017) and RAS-MAPK pathway in high flow lesions including BAVMs (Al-Olabi et al., 2018; Nikolaev et al., 2018). Specifically, activating mutations in KRAS, such as p.G12V and p.G12D, which are major cancer drivers, are associated with BAVMs (Nikolaev et al., 2018). However, only about 60% of BAVMs harboured KRAS mutations with a significant number of BAVMs remaining without detected mutations and no somatic mutations have been reported in SAVMs. Here, using ultradeep next generation sequencing (NGS) with a panel of 422 tumour genes, we investigated whether the vast majority or all BAVMs and SAVMs are associated with detectable tumour-related somatic mutations.

Materials and methods

Patient enrolment and sample preparation

Twenty-one BAVM patients and 10 SAVM patients who underwent surgical resection of the nidus at the Beijing Xuanwu Hospital in China were recruited to this study. The study was approved by the ethics committee of Beijing Xuanwu Hospital (NO.2016032) and written informed consents from all patients or their guardians was obtained before surgery. All of the arteriovenous malformation diagnoses were made with imaging and pathological examinations by the study team. Patients demonstrating sporadic unifocal BAVMs/SAVMs with defined nidus structure were included. Patients with family history of arteriovenous malformations or documented genetic vascular diseases were excluded.

After surgical resection, the nidus was dissected from the tissue and was cut into equal samples. Together with matched whole blood samples, one of the tissue samples was sent to the sequencing facility of Nanjing Geneseeq Biotechnology Inc. (Nanjing, China) for NGS and droplet digital polymerase chain reaction (ddPCR) analyses.

Sample processing and library preparation

Genomic DNA was extracted from tissue samples and matched whole blood samples using DNeasy® Blood and Tissue Kit (Qiagen) following the manufacturer's recommended protocols. For each sample, 1-2 µg genomic DNA was fragmented using the Covaris M220 sonication system (Covaris) to 300-350 bp. Fragmented DNA was processed through end-repairing, A-tailing, and adaptor ligation using KAPA Hyper Prep Kit (KAPA Biosystems, KK8504), followed by size selection and purification using Agencourt AMPure XP beads (Beckman Coulter) with an optimized manufacturer's protocol. Finally, libraries were amplified by PCR and purified using Agencourt AMPure XP beads. Sample quality control was performed using NanoDropTM 2000 (Thermo Fisher Scientific) for A260/280 and A260/230 ratios, and Bioanalyzer 2100 with High Sensitivity DNA kit (Agilent Technologies, 5067-4627) for size distribution. Sample and library quantification was performed using Qubit 3.0 dsDNA HS Assays (Life Technology).

Target enrichment and NGS

For targeted sequencing, a customized biotinylated probe panel (Integrated DNA Technologies) covering the exonic regions of 422 solid tumour-related genes and the intronic regions of a

selected subset of the genes was used for hybridization enrichment. Libraries with different sample indices were pooled together in desirable ratios for up to 2 ug of total library. Human Cot-1 DNA (Life Technologies) and xGen® Universal Blocking Oligos (Integrated DNA Technologies) were added as blocking reagents. Liquid-phase probe-based capture was performed with Dynabeads M-270 (Life Technologies) and xGen® Lockdown Hybridization and Wash Kit (Integrated DNA Technologies) according to the manufacturer's protocols. Captured libraries were on-beads **PCR** amplified with Illumina p5 (5'-AATGATACGGCGACCACCGA-3') and p7 primers (5'-CAAGCAGAAGACGGCATACGAGAT-3') by KAPA HiFi HotStart ReadyMix (KAPA biosystems), followed by purification using Agencourt AMPure XP beads.

Target-enriched libraries were quantified by qPCR using KAPA Library Quantification Kit (KAPA Biosystems). Sequencing was carried out on HiSeq4000 NGS platforms (Illumina) according to the manufacturer's instructions, with paired-end 150 bp sequencing chemistry. Sequencing depth was anticipated to be $1000 \times$ and $100 \times$ for tissue sample and whole blood samples, respectively.

Sequencing data analysis

Sample demultiplexing was carried out using bcl2fastq v2.16.0.10 (Illumina). Adaptor nucleotides and low quality base cells were removed by Trimmomatics (Bolger *et al.*, 2014). Paired-end sequencing reads were aligned to the human reference genome hg19 (Genome Reference Consortium Human Reference 37, GRCh37) using Burrows-Wheeler Aligner v0.7.12 (BWA-MEM) (Li and Durbin, 2009). Samtools v1.6 was used to sort and index the aligned bam file (Li *et al.*, 2009). The bam file was further processed for PCR-duplicate removal by Picard v1.119 (https://broadinstitute.github.io/picard/) and for base recalibration and indel realignment by the Genome Analysis Toolkit v3.6 (GATK) (McKenna *et al.*, 2010).

MuTect somatic mode with default parameters was used for single nucleotide variant (SNV) identification (Cibulskis *et al.*, 2013). SNV displaying >1% population frequency within the 1000 Genomes project and dbSNP were also excluded (Sherry *et al.*, 2001; Genomes Project *et al.*, 2015). Small insertions and deletions (indels) were detected using Scalpel (Fang *et al.*, 2016). Identified SNVs and indels were annotated with ANNOVAR (Wang *et al.*, 2010), and manually reviewed on Integrative Genomics Viewer (IGV).

Droplet digital polymerase chain reaction

To validate the NGS results, and to screen additional low variant frequency mutations that were below the detection limit of NGS method, ddPCR was carried out on all of our samples.

Detection of rare variants in *KRAS* (NM_004985.3) and *BRAF* (NM_004333.4) was performed on the QX200 ddPCR system (Bio-Rad). Primers and probes for *KRAS* c.191_196 dupACAGTG p.Ser65_Ala66insAspSer were customized and synthesized at Integrated DNA Technologies (IDT) with the following sequences: forward primer 5'-TGGAGAAACCTGTCT CTTGGA-3', reverse primer 5'-CCCTCCCCAGTCCTCATG TA-3', reference allele locked nucleic acid (LNA) probe 5'-

FAM-TCTCGACACAGCA-3', insertion allele specific LNA probe 5'-HEX-ACAGTGACAGTGCA-3'. Each reaction was set up containing 50 ng genomic DNA, 9 pmol of each primer, 5 pmol of each probe, and 10 µl of 2× ddPCR Supermix for probes (No dUTP) (Bio-Rad) in a 20 µl reaction volume. The following PCR conditions were used: (i) an initial activation step at 95°C for 10 min; (ii) followed by 45 cycles of denaturation at 94°C for 30 s and annealing/elongation at 60°C for 1 min; (iii) followed by a final elongation at 60°C for 5 min. PCR temperature ramp rate was set at 2°C/s for every step. Primers and probes for KRAS c.35G>A p.Gly12Asp (dHsa MDV2510596), KRAS c.35G>T p.Gly12Val (dHsaMDV251 0592), KRAS c.35G>C p.Gly12Ala (dHsaMDV2510586), KRAS c.183A>T p.Gln61His (dHsaMDV2010131), KRAS c.181C>A p.Gln61Lys (dHsaMDV2511862), KRAS c.34G>T p.Gly12Cys (dHsaMDV2510584), and BRAF c.1799T>A p.Val600Glu (dHsaCP2000027 and dHsaCP2000028) were purchased from Bio-Rad. Each reaction was set up following the manufacturer's instructions and containing 50 ng genomic DNA. PCR was carried out following the manufacturer's instructions for each commercial assay. PCR products were then subjected to analysis by the QX-200 droplet reader and QuantaSoftTM Analysis Software (Bio-Rad). A sample is considered positive if it displays at least three positive droplets, and if the number of positive droplets is at least three times the average number of positive droplets observed in five replicates of NA18535 negative control. The concentrations of target alleles were calculated using QuantaSoftTM version 1.7.4 (Bio-Rad) based on Poisson distribution.

Statistical analysis

Student's *t*-test and Pearson correlation were used to assess the difference and correlation between two groups of quantitative variables. A two-tailed probability value of 0.05 or less was considered statistically significant. Additional information can be found in the Supplementary material.

Data availability

The authors are willing to provide the raw data related to this manuscript upon request.

Results

Clinicopathological characteristics of patients

This cohort consisted of 22 males (71.0%) and nine (29.0%) females with a mean age of 28.6 ± 14.0 years (range 5–54 years). All patients had fresh nidus samples and matched blood samples. Twenty cases (64.5%) had ruptured BAVMs or SAVMs. Of the 21 patients with BAVMs, five had a Spetzler-Martin (SM) grade I, six a SM grade II, nine a SM grade III and one a SM grade IV lesion. Of the 10 patients with SAVMs, four had a type II (glomus) and six a type III (juvenile) SAVM (Table 1 and Fig. 1).

Table | Study participants, tissue samples and study overview

34 M Y Cervical spinal cord (C5) 20.31 × 12.38 × 10.07 Y 28 M N Right frontal lobe of brain 23.69 × 19.46 × 17.86 N 54 F Y Right forntal lobe of brain 32.35 × 29.71 × 28.02 N 44 M N Right femporal lobe of brain 23.58 × 23.64 × 17.82 N 21 F N Left cerebellum 44.18 × 34.71 × 27.00 Y 45 F Y Cervical spinal cord (T5) 13.17 × 77.8 × 90.1 N 45 M Y Cervical spinal cord (C3) 16.99 × 11.75 × 10.19 N 45 M Y Left parietal lobe of brain 27.32 × 22.80 × 19.49 Y 5 M Y Left cerebellum 27.32 × 22.80 × 19.49 Y 5 M Y Left cerebellum 27.32 × 22.80 × 19.49 Y 10 M Y Left cerebellum 27.32 × 22.80 × 19.49 Y 20 M Y Right cerebellum 47.05 ×	Patient lype	Age	Gender	Rupture	Location	Size, mm	High risk structure ^a	Deep venous drainage	Spetzler-Martin grades (BAVM)	Glomus/juvenile type (SAVM)
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BAVM 15 M Y Right cerebellum 40.01 x 28.16 x 24.60 Y BAVM 43 F Y Right parietal lobe of brain 38.63 x 38.41 x 24.13 Y SAVM 28 M Y Cervical spinal cord (C2) 13.54 x 9.90 x 6.89 N SAVM 28 M N Thoracic spinal cord (T12) 24.21 x 12.21 x 8.09 Y SAVM 16 M N Thoracic spinal cord (T12) 24.21 x 12.21 x 8.09 Y BAVM 48 M Y Left parietal lobe of brain 32.58 x 31.45 x 31.45 Y BAVM 41 F Y Right parietal lobe of brain 40.71 x 25.34 x 40.31 Y BAVM 43 M N Left temporal lobe of brain 33.91 x 28.40 x 15.45 Y BAVM 14 M Y Left temporal lobe of brain 33.91 x 28.40 x 15.45 Y BAVM 42 F Y Right temporal lobe of brain 26.79 x 25.71 x 23.95 Y	BAVM	2	Σ	z	Left occipital lobe of brain	$27.56 \times 22.26 \times 18.45$	z	>	_	•
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SAVM 28 M Thoracic spinal cord (T12) 24.21 × 12.21 × 8.09 Y SAVM 16 M N Thoracic spinal cord (T7) 7.37 × 4.32 × 4.02 N BAVM 48 M Y Left parietal lobe of brain 32.58 × 31.45 × 31.45 Y BAVM 11 F Y Right parietal lobe of brain NA ^b N BAVM 43 M N Left temporal lobe of brain 40.71 × 25.34 × 40.31 Y BAVM 14 M Y Thoracic spinal cord (T12) 20.38 × 9.90 × 9.26 Y SAVM 11 M Y Cervical spinal cord (C4-5) 14.77 × 10.05 × 8.26 Y BAVM 42 F Y Right temporal lobe of brain 26.79 × 25.71 × 23.95 Y	SAVM	28	Σ	>	Cervical spinal cord (C2)	$13.54 \times 9.90 \times 6.89$	z			Juvenile
SAVM 16 M Thoracic spinal cord (T7) 7.37 × 4.32 × 4.02 N BAVM 48 M Y Left parietal lobe of brain 32.58 × 31.45 × 31.45 Y BAVM 11 F Y Right parietal lobe of brain NA ^b N BAVM 43 M N Left temporal lobe of brain 40.71 × 25.34 × 40.31 Y BAVM 14 M Y Thoracic spinal cord (T12) 20.38 × 9.90 × 9.26 Y BAVM 22 F Y Left temporal lobe of brain 33.91 × 28.40 × 15.45 Y BAVM 42 F Y Right temporal lobe of brain 26.79 × 25.71 × 23.95 Y	SAVM	28	Σ	z	Thoracic spinal cord (T12)	$24.21 \times 12.21 \times 8.09$	≻	ı		Juvenile
BAVM 48 M Y Left parietal lobe of brain 32.58 × 31.45 × 31.45 × 31.45 × Y Y BAVM 11 F Y Right parietal lobe of brain NAb NA BAVM 43 M N Left temporal lobe of brain 40.71 × 25.34 × 40.31 Y SAVM 14 M Y Thoracic spinal cord (T12) 20.38 × 9.90 × 9.26 Y BAVM 22 F Y Left temporal lobe of brain 33.91 × 28.40 × 15.45 Y SAVM 11 M Y Cervical spinal cord (C4-5) 14.77 × 10.05 × 8.26 Y BAVM 42 F Y Right temporal lobe of brain 26.79 × 25.71 × 23.95 Y	SAVM	91	Σ	z	Thoracic spinal cord (T7)	$7.37\times4.32\times4.02$	z			Juvenile
BAVM II F Y Right parietal lobe of brain NAb NA BAVM 43 M N Left temporal lobe of brain 40.71 × 25.34 × 40.31 Y SAVM 14 M Y Thoracic spinal cord (T12) 20.38 × 9.90 × 9.26 Y BAVM 22 F Y Left temporal lobe of brain 33.91 × 28.40 × 15.45 Y SAVM II M Y Cervical spinal cord (C4-5) 14.77 × 10.05 × 8.26 Y BAVM 42 F Y Right temporal lobe of brain 26.79 × 25.71 × 23.95 Y	BAVM	48	Σ	>	Left parietal lobe of brain	×	>	z	=	
BAVM 43 M Left temporal lobe of brain 40.71 x 25.34 x 40.31 Y SAVM 14 M Y Thoracic spinal cord (T12) 20.38 x 9.90 x 9.26 Y BAVM 22 F Y Left temporal lobe of brain 33.91 x 28.40 x 15.45 Y SAVM 11 M Y Cervical spinal cord (C4-5) 14.77 x 10.05 x 8.26 Y BAVM 42 F Y Right temporal lobe of brain 26.79 x 25.71 x 23.95 Y	BAVM	=	ш	>	Right parietal lobe of brain	NAb	z	z	=	
SAVM 14 M Y Thoracic spinal cord (T12) 20.38 × 9.90 × 9.26 Y BAVM 22 F Y Left temporal lobe of brain 33.91 × 28.40 × 15.45 Y SAVM 11 M Y Cervical spinal cord (C4-5) 14.77 × 10.05 × 8.26 Y BAVM 42 F Y Right temporal lobe of brain 26.79 × 25.71 × 23.95 Y	BAVM	43	Σ	z	Left temporal lobe of brain	$40.71 \times 25.34 \times 40.31$	>	z	=	
BAVM 22 F Y Left temporal lobe of brain 33.91 x 28.40 x 15.45 Y SAVM 11 M Y Cervical spinal cord (C4-5) 14.77 x 10.05 x 8.26 Y BAVM 42 F Y Right temporal lobe of brain 26.79 x 25.71 x 23.95 Y	SAVM	4	Σ	>	Thoracic spinal cord (T12)	$20.38 \times 9.90 \times 9.26$	≻	ı		Juvenile
SAVM 11 M Y Cervical spinal cord (C4–5) 14.77 × 10.05 × 8.26 Y BAVM 42 F Y Right temporal lobe of brain 26.79 × 25.71 × 23.95 Y	BAVM	22	ш	>	Left temporal lobe of brain	$33.91 \times 28.40 \times 15.45$	>	>	=	
BAVM 42 F Y Right temporal lobe of brain 26.79 x 25.71 x 23.95 Y	SAVM	=	Σ	>		$14.77 \times 10.05 \times 8.26$	≻			Glomus
	BAVM	42	ш	>	Right temporal lobe of brain	$26.79 \times 25.71 \times 23.95$	>	>	=	
18 M N Left parietal lobe of brain 49.61 × 49.45 × 46.23 N	BAVM	8	Σ	z	Left parietal lobe of brain	49.61 \times 49.45 \times 46.23	z	z	≡	

^aHigh risk structure includes aneurysm, pseudoaneurysm, venectasia and high-flow fistula. ^bNidus volume and largest diameter were not detected in Patient 25 due to emergency surgery.

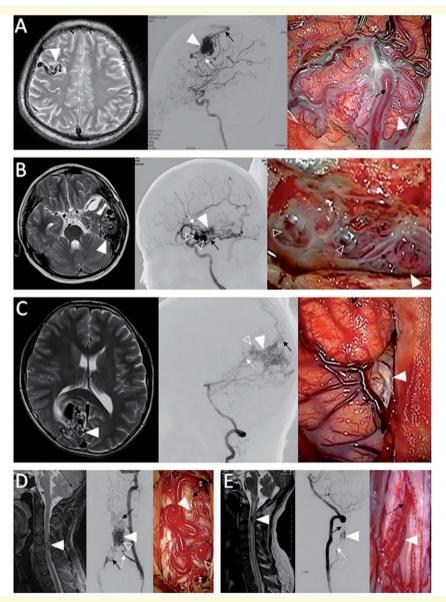


Figure 1 Representative MRI T₂-weighted, digital subtraction angiography (DSA) and intraoperative images of BAVMs/SAVMs included in this study. (A) Patient 2, right frontal lobe BAVM, KRAS p.G12D, ddPCR variant frequencies = 5.61%. (B) Patient 16, left temporal lobe BAVM, BRAF p.V600E, ddPCR variant frequencies = 2.99%. (C) Patient 17, occipital lobe BAVM, negative. (D) Patient 1, cervical SAVM, KRAS p.G12D, ddPCR variant frequencies = 4.40%. (E) Patient 21, cervical SAVM, BRAF p.V600E, ddPCR variant frequencies = 7.29%. Typical dark flow void signal on the MRI T₂-weighted images (*left*) indicate the niduses (white arrowhead) of arteriovenous malformation, which are surrounded by feeding arteries and draining veins. Feeding arteries (white arrow), nidus (white arrowhead), draining veins (black arrow) and high risk structure (white hollow arrowhead) can be identified clearly on the DSA (*middle*). Intraoperative images (*right*) demonstrate the tortuous dilated vessels on the surface of brain/spinal cord, of which the feeding arteries, nidus (white arrowhead), high risk structure (white hollow arrowhead) can be recognized easily.

Identification of somatic genetic variants by exome sequencing

Our panel included 422 tumour-related genes, the details of which can be found in Supplementary Table 1. As shown in Table 2, the average sequencing depth was $1077 \pm 298 \times$. Among the 31 patients, 21 carried activating *KRAS* mutations and two carried *BRAF* mutations in tissue samples.

None of patients were detected with corresponding mutations in paired blood samples. Except for mutations in genes of the RAS/RAF signalling pathway, no other gene mutations were found in nidus samples from more than two patients (Supplementary Table 1).

We found five single nucleotide missense variants and one insertion variant in the *KRAS* gene, with variant frequencies ranging from 0.13% to 8.82%. *KRAS* (NM_004985.3)

Table 2 The results of NGS and ddPCR

		Tumour p	panel with 422 genes	ddPCR			
Patient	Туре	Depth ^a	Mutant genes	KRAS/BRAF mutations	VF, %	KRAS/BRAF mutations ^b	VF, %
1	SAVM	1570.71	KRAS	KRAS c.35G>A	4.65	KRAS p.G12D	4.40
2	BAVM	1535.78	KRAS	KRAS c.35G > A	6.57	KRAS p.G12D	5.61
3	BAVM	1640.67	KRAS	KRAS c.35G > A	0.60	KRAS p.G12D	0.45
4	BAVM	1163.57	KRAS/TET2	KRAS c.35G > A	2.01	KRAS p.G12D	1.39
5	BAVM	775.55	KRAS	KRAS c.35G > A	2.50	KRAS p.G12D	2.95
6	SAVM	412.07	KRAS	KRAS c.35G > A	3.60	KRAS p.G12D	5.16
7	BAVM	1263.04	KRAS	KRAS c.35G>T	0.81	KRAS p.G12V	0.53
8	SAVM	1293.91	KRAS	KRAS c.35G>T	2.85	KRAS p.G12V	2.33
9	SAVM	443.22	KRAS	KRAS c.35G>T	8.82	KRAS p.G12V	7.10
10	SAVM	1187.50	KRAS	KRAS c.35G>C	4.86	KRAS p.G12A	4.85
П	BAVM	1469.84	KRAS	KRAS c.191_196dupACAGTG	5.56	KRAS p.S65_A66insDS	7.09
12	BAVM	1289.46	None	-	-	KRAS p.G12D	0.27
13	BAVM	1346.49	None	-	-	KRAS p.G12D	0.14
14	BAVM	1125.61	None	-	-	KRAS p.G12V	0.03
15	BAVM	1123.18	KRAS/FLT4	KRAS c.35G > A	1.52	KRAS p.G12D	1.47
16	BAVM	1296.57	BRAF/KMT2C	BRAF c.1799T>A	1.93	BRAF p.V600E	2.99
17	BAVM	1033.87	None	-	-	Negative	_
18	BAVM	1116.77	None	-	-	Negative	_
19	BAVM	994.44	KRAS/CYP2D6	KRAS c.35G > A	3.64	KRAS p.G12D	2.28
20	BAVM	978.54	None	-	-	KRAS p.G12V	1.20
21	SAVM	784.63	BRAF	BRAF c.1799T>A	6.54	BRAF p.V600E	7.29
22	SAVM	951.59	KRAS	KRAS c.183A>T	2.50	KRAS p.Q61H	2.22
23	SAVM	1269.42	KRAS	KRAS c.35G > A	5.58	KRAS p.G12D	5.72
24	BAVM	1154.37	KRAS/DNMT3A/WAS	KRAS c.35G>T	2.02	KRAS p.G12V	1.77
25	BAVM	898.58	KRAS	KRAS c.35G > A	0.72	KRAS p.G12D	0.44
26	BAVM	807.56	None	-		Negative	_
27	SAVM	1098.06	KRAS	KRAS c.34G>T	1.79	KRAS p.G12C	2.01
28	BAVM	946.65	KRAS/FRG1	KRAS c.35G > A	2.86	KRAS p.G12D	3.19
29	SAVM	950.56	KRAS	KRAS c.35G>T	7.23	KRAS p.G12V	7.13
30	BAVM	703.56	KRAS	KRAS c.35G > A	1.11	KRAS p.G12D	1.48
31	BAVM	776.58	None	-	_	Negative	_

^aAverage depth of the 422 tumour-related genes.

mutations were found at codon 12: c.35G>A p.Gly12Asp, c.35G>T p.Gly12Val, c.34G>T p.Gly12Cys, and c.35G>C p.Gly12Asp mutations; at codon 61 c.183A>T p.Gln61His mutation; and at codon 66 c.191_196dupACAGTG p.S65_Ala66insAspSer mutation. Activating mutation in BRAF (NM_004333.4) c.1799T>A p.Val600Glu was also observed in one SAVM patient and one BAVM patient. For simplicity, we use p.G12D, p.G12V, p.G12C, p.G12A, p.Q61H, p.S65_A66insDS, and p.V600E in this manuscript when referring to these mutations, respectively. Representative NGS results of these mutations were shown in Fig. 2. None of the seven mutations were annotated in the 1000 Genomes database. KRAS p.G12V, p.G12A and p.Q61H were not annotated in the ExAC Browser databases. KRAS p.G12D, p.G12C and BRAF p.V600E had ExAC allele counts of 2/101 204, 2/101 218 and 2/121 220, respectively. The other two mutations KRAS p.G12A, and p.S65_A66insDS have never previously been reported in SAVM and BAVM.

Confirmation of NGS mutations and identification of additional low variant frequency mutations with droplet digital PCR

The 21 KRAS and two BRAF mutations detected by panel sequencing of 422 panel genes were confirmed with ddPCR. Representative ddPCR results of these mutations are shown in Fig. 2. As shown in Table 2, four additional KRAS mutations were detected in eight exome sequencing-negative samples. The total prevalence of KRAS/BRAF mutations was therefore 87.1% (27 of 31) in our cohort. The variant frequencies of mutations verified by ddPCR ranged from 0.03% to 7.29%. The variant frequencies of the mutations determined by ddPCR showed strong correlation with the variant frequencies determined by NGS-based methods (r = 0.950, P < 0.001) (Supplementary Fig. 1).

^bNegative indicates that no positive mutations were found with KRAS p.G12A, p.G12D, p.G12V, p.Q61H, p.Q61K, p.A66delinsDSA, or BRAF p.V600E primers and probes. VF = variant frequencies.

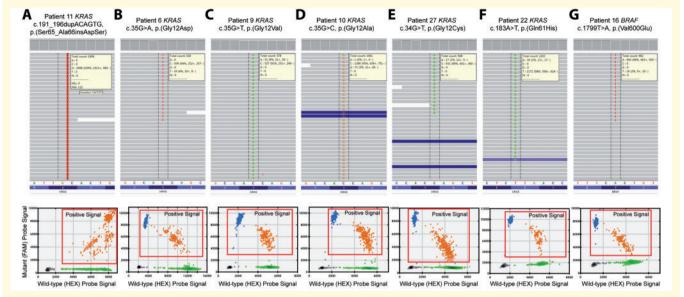


Figure 2 Representative Integrative Genomics Viewer snapshot of the NGS and ddPCR results of the seven KRAS/BRAF mutations identified in this study. Top: IGV snapshot. Each grey bar represents a sequencing read with base pairs matching the reference genome. Base cells deviating from the reference genome are considered as variants and are labelled. Bottom: 2D scatterplot of ddPCR results. Each dot represents a droplet. Blue: the droplet encloses at least one copy of mutant template. Green: the droplet encloses at least one copy of wildtype template. Orange: the droplet encloses at least one copy of wild-type and mutant template. Black: the droplet encloses no target molecular.

Spinal and brain arteriovenous malformations share mutations in KRAS and BRAF

The prevalence of KRAS/BRAF mutations was 81.0% (17 of 21) in BAVM and 100% (10 of 10) in SAVM. Both panel sequencing and ddPCR results showed that SAVMs and BAVMs shared the mutation pattern in KRAS and BRAF, with comparable prevalence. For example, KRAS p.G12D and p.G12V were mutation hotspots both in SAVMs and BAVMs, with a prevalence of 30.0% and 30.0% in SAVMs, and 52.4% and 19.0% in BAVMs, respectively, whereas BRAF p.V600E was rare and found in only one BAVM and one SAVM patient (Fig. 3).

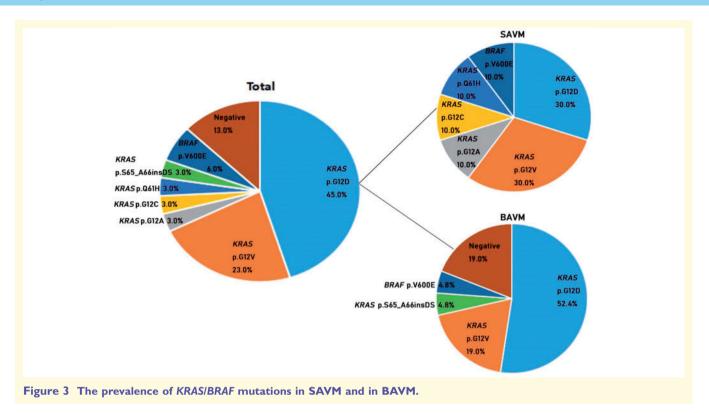
Tumour-related somatic mutations in CNS arteriovenous malformations

Mutation variant frequencies are negatively correlated with nidus volumes and largest diameters, but not patient ages

Because of significant differences on nidus volume between SAVMs and BAVMs, we separately analysed their correlation with mutation variant frequencies in 10 patients with SAVM. The mutation variant frequency was negatively correlated with nidus volumes and largest diameters (r = -0.686, P = 0.028 in nidus volumes, and r = -0.764,P = 0.010 in nidus largest diameters, respectively). Similarly, in 20 patients with BAVM (nidus volume and largest diameter were not available in Patient 25 due to emergency surgery), the mutation variant frequencies were also negatively correlated with the two indices (r = -0.522, P = 0.038 in nidus volumes, and r = -0.524, P = 0.037 in nidus largest diameters, respectively). Furthermore, no significant correlation was found between mutation variant frequencies and ages (r = -0.338, P = 0.085) (Fig. 4). Furthermore, patients were divided into two groups with the same number of patients according to variant frequencies. Significant differences on nidus length and volume were observed between the two subgroups with low and high variant frequencies. As shown in Table 3, patients with low variant frequencies showed significantly larger lengths and volumes both in SAVM and in BAVM. In these analyses, we used ddPCR variant frequencies as the mutation variant frequencies.

Discussion

In this study, we profiled 31 CNS arteriovenous malformations, including BAVMs and SAVMs, for somatic mutations in a panel of 422 tumour-related genes. The key findings of our study are (i) high prevalence (nearly 90%) of KRAS/BRAF somatic mutations in BAVMs and SAVMs with no other tumour gene mutations replicated using ultradeep panel sequencing; (ii) the first evidence of activating BRAF mutations in BAVMs and SAVMs; and (iii) evidence that SAVMs, a disease previously uncharacterized at the genetic level, share the same highly prevalent mutations in KRAS and BRAF with BAVMs. Moreover, we also observed two novel mutations in KRAS (p.G12A and p.S65_A66insDS) in CNS arteriovenous malformations. Finally, we found that mutation variant frequencies negatively correlated with nidus volumes and largest diameters



but not with age, a finding that may have implications for the understanding of the pathogenesis of arteriovenous

High prevalence of somatic KRAS/BRAF mutation

malformations.

Recently, activating somatic KRAS mutations were observed with a relatively high prevalence of 64% in BAVMs, and associated with the activation of the MAPK/ ERK pathway, one of the major intracellular signalling pathway downstream of KRAS (Nikolaev et al., 2018). Consistently, activated mosaic mutations in four MAPK pathway genes, i.e. KRAS, NRAS, BRAF and MAP2K1 were described in intracranial and extracranial vascular malformations including high flow arteriovenous malformations (Couto et al., 2017; Al-Olabi et al., 2018), reinforcing the role of the RAS/RAF/MAPK/ERK pathway in arteriovenous malformations. Interestingly, BAVMs without detectable KRAS mutations also had high levels of phorphorylated ERK1/2, suggesting that the RAS/RAF/ MAPK/ERK pathway activation is a hallmark of all BAVMs (Nikolaev et al., 2018). Intriguingly, KRAS mutations as well as its downstream effector BRAF mutations also occurred at high frequency in endoderm-derived tumours and played a role in their progression, through the RAS-RAF-MEK-MAPK pathway or the PI3K-AKT-PTENmTOR pathway (shared the same upstreaming tyrosine kinase with RAS-RAF-MEK-MAPK) (Quinlan et al., 2008; Millington, 2013; Simanshu et al., 2017). Our

study not only confirms the presence of activating KRAS mutations in BAVMs, but also finds a much higher prevalence of 87.1% of KRAS/BRAF mutation in BAVMs/ SAVMs than previously reported values (Al-Olabi et al., 2018; Nikolaev et al., 2018). This difference is most likely accredited to the ultradeep sequencing $(1077 \times)$ of a restricted panel of genes used in our study compared to the lower depth whole exome sequencing used by Nikolaev et al. (2018) and possibly differences in tissue preparation, ddPCR methodology and calling thresholds. Importantly, our study provides the first evidence of BRAF mutations in CNS arteriovenous malformations both in the brain and spinal cord. Knowing that a BRAF mutation has previously been found in only one arteriovenous malformation sample from an extracranial skin arteriovenous malformation (Al-Olabi et al., 2018), which is again consistent with the centrality of the RAS/RAF/MAPK pathway in arteriovenous malformations.

The fact that all of the mutations found in arteriovenous malformations, including *KRAS* p.G12V and p.G12D, and *BRAF* p.V600E and *MAP2K1*, result in oncogenic activation of these genes and are all drivers of cancer growth in humans (Cichowski and Janne, 2010; Prior *et al.*, 2012; Simanshu *et al.*, 2017) contrasts with their presence in the majority of arteriovenous malformations, which are not tumoural vascular growths. This points to a tissue-specific and context-dependent role of the RAS/RAF/MAPK pathway in vascular tissue or perhaps a need for multiple additional genetic hits to sustain cancer as opposed to a monogenetic nature of arteriovenous malformations. This

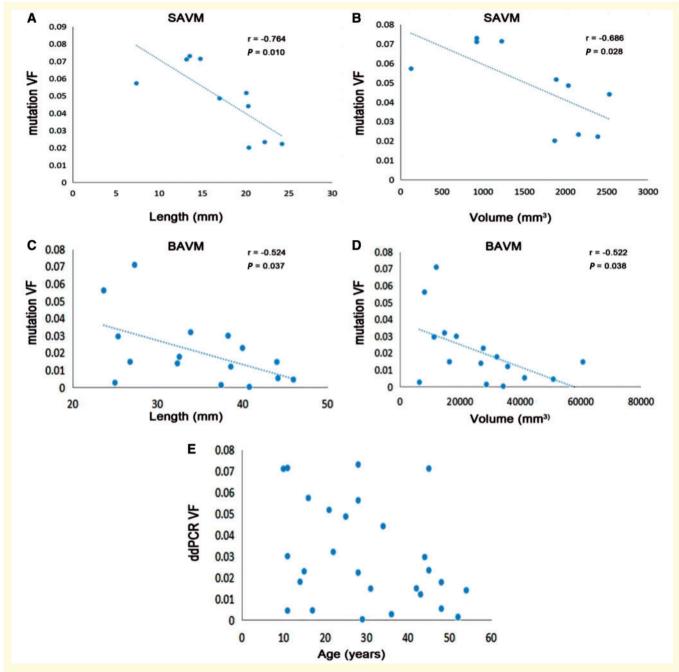


Figure 4 Mutation variant frequencies were negatively correlated with nidus volumes and largest diameters in both SAVMs and BAVMs, but not with patient age. (A) The mutation variant frequencies (VF) were negatively correlated with SAVM largest diameters, r = -0.764, P = 0.010. (B) The mutation variant frequencies were negatively correlated with SAVM nidus volumes, r = -0.686, P = 0.028. (C) The mutation variant frequencies were negatively correlated with BAVM largest diameters, r = -0.524, P = 0.037. (D) The mutation variant frequencies were negatively correlated with BAVM nidus volumes, r = -0.522, P = 0.038. (E) The mutation variant frequencies were not associated with patient ages, r = -0.338, P = 0.085.

Table 3 Significant difference on nidus length and volume between low and high variant frequency groups

	SAVM			BAVM			
	n	Length	Volume	n	Length	Volume	
Low VF ^a	5	20.8 ± 2.7	2196.5 ± 267.5	8	38.6 ± 7.0	35 684.4 ± 16 337.7	
High VF	5	$\textbf{13.8} \pm \textbf{4.5}$	1017.6 ± 634.2	8	$\textbf{31.0} \pm \textbf{6.1}$	17733.9 ± 8301.3	
Р		0.017	0.005		0.038	0.015	

^aPatients were divided into two groups with the same number of patients according to variant frequencies (VF).

monogenetic nature, most evident in our findings of *KRAS/BRAF* mutation in nearly 90% of BAVMs and SAVMs, renders inhibition of the RAS/RAF/MAPK/ERK with small molecule MEK inhibitors as an attractive option for future targeted therapies of BAVMs. BRAF and MEK inhibitors are already used in clinical practice for *BRAF* p.V600E mutated melanomas (Long *et al.*, 2014). Knowing that nearly all BAVMs and SAVMs have mutations in either *KRAS* or *BRAF*, permits the opportunity of initiating therapy in potential clinical trials without previous tissue sampling and genetic confirmation, which is not feasible in BAVMs or SAVMs outside of total resection.

Genetic homogeneity in SAVMs and BAVMs

BAVMs and SAVMs belong to CNS vascular malformations and may therefore share a similar pathogenesis, differing only by their different location along the neuraxis. Concomitant BAVM and SAVM patients have been reported in literature, which may be the evidence of the embryological homology (Hasegawa et al., 1999; Wang et al., 2009; Shallwani et al., 2012). It may occur at a different site of neuraxis between the fourth and eighth weeks of embryonic development, then disperse and form the nidus in a different part of the CNS. Both, in addition to sharing angioarchitectural features of high flow arteriovenous malformations, are characterized by aberrant angiogenesis and vascular remodelling (Aminoff and Logue, 1974; Kim and Spetzler, 2006; Kawamoto and Losordo, 2008; Rangel-Castilla et al., 2014). In our previous study, we demonstrated that both BAVMs and SAVMs share similar immunohistochemistry features (Gao et al., 2010, 2011). Besides, endothelial cells, as well as the endothelial progenitor cells, mediate pathological vascular remodelling and impact the clinical course of both BAVM and SAVM. However, the genetic basis of SAVMs remains unexplored. Here, we elucidate the genetic basis of a majority of SAVMs, albeit in a small cohort of 10 patients, and show that they harbour the same somatic mutations in BRAF and KRAS with comparable prevalences as BAVMs. Our findings, together with previous studies on brain and extracranial arteriovenous malformations (Couto et al., 2017; Al-Olabi et al., 2018; Nikolaev et al., 2018), may suggest a relative genetic homogeneity of all high flow arteriovenous malformations, within which mutations occur in different genes of the same signalling pathway.

KRAS/BRAF mutation variant frequency and arteriovenous malformation size

The finding of recurrent highly prevalent *KRAS/BRAF* mutations in both BAVMs and SAVMs, the pathogenic nature of those mutations, the absence of *KRAS/BRAF* mutations in brain vascular malformations other than BAVMs

(Nikolaev et al., 2018), and the direct induction of arteriovenous malformation-like lesions by a mutation in an animal model (Al-Olabi et al., 2018), convergently support that KRAS/BRAF mutations are causative and not bystander events due to endothelial proliferation, angiogenic signalling or vascular remodelling in arteriovenous malformations. Moreover, the absence of correlation of mutation variant frequencies with patient age and the negative correlation with arteriovenous malformation size in our study, is inconsistent with a passenger mutation hypothesis where KRAS/BRAF mutations would randomly accumulate with time and lesion growth. On the contrary, a negative correlation between variant frequencies and arteriovenous malformation size may support the view that arteriovenous malformations result from the clonal progeny of an endothelial precursor acquiring a somatic mutation and initiating the pathogenesis of the arteriovenous malformations. In this scenario, with tissue growth and endothelial turnover, wild-type endothelial cells would also be incorporated in the arteriovenous malformation, therefore diluting the mutant arteriovenous malformation cells. However, the high cell heterogeneity of arteriovenous malformation tissue may be an alternative explanation of our findings. For example, a potentially different cell ratio between endothelial and mural cells in small and large arteriovenous malformations may also result in a dilution of mutation variant frequencies in large lesions. Further analysis of endothelial cells isolated from BAVMs and SAVMs would resolve this question.

Recently, EPHB4 mutations were identified in vein of Galen aneurysmal malformation (Vivanti et al., 2018), and somatic inactivating RASA1 mutation was identified in capillary malformation lesion tissue in a patient with germline RASA1 mutation (Lapinski et al., 2018). Those genes involved in vascular malformation in previous studies could be potential somatic mutated genes in arteriovenous malformation tissues, such as RASA1, EPHB4, ENG, ACVRL1, GDF2, NF1 etc. (Matsubara et al., 2000; Eerola et al., 2003; Mahmoud et al., 2010; Chida et al., 2013; Tualchalot et al., 2014; Lapinski et al., 2018; Vivanti et al., 2018). Before targeted ultradeep 422-gene exome sequencing, whole exome sequencing was also performed in 12 of our cohort and no somatic mutations were detected within these genes. Despite that, we advocated the idea of profiling the genes whose hotspot mutations have been previously associated with vascular malformation when practicing clinical management of vascular malformation. A targeted exome NGS panel designated for arteriovenous malformations including both tumour-related somatic mutation genes and vascular malformation mutation genes should be developed in the future.

Another related unresolved question is whether *KRAS/BRAF* mutations are single and sufficient causative events in BAVMs and SAVMs or if another genetic event is required, either as a preceding germline or somatic mutation or an ulterior second hit. The injection of *BRAF*^{V600E} into single-cell zebrafish embryos to generate post-zygotic

expression, resulted in only 10–20% vascular malformation in a recent study (Al-Olabi *et al.*, 2018) and these authors speculated that the first hit is one germline mutation and/or other somatic mutation, and the second hit is *KRAS/BRAF* mutation, which eventually causes arteriovenous malformations. According to our results, we speculate that the *KRAS/BRAF* mutation is more likely the first hit. Future studies are needed to elucidate these mechanisms.

Conclusion

Our findings support a causative role of somatic activating mutations in *KRAS/BRAF* in the overwhelming majority of BAVMs and SAVMs. Practically and importantly, this pathway homogeneity in CNS arteriovenous malformations also supports the development of targeted therapies with RAS/RAF/MAPK pathway inhibitors without the necessity of tissue genetic diagnosis, a major obstacle if mutations were distinct pathways involved in arteriovenous malformations.

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Competing interests

X.M. and Y.W.S. are employees and/or shareholders of Geneseeq Technology Inc.

Supplementary material

Supplementary material is available at Brain online.

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