REVIEW

Understanding the pathogenesis of brain arteriovenous malformation: genetic variations, epigenetics, signaling pathways, and immune infammation

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Abstract

Brain arteriovenous malformation (BAVM) is a rare but serious cerebrovascular disease whose pathogenesis has not been fully elucidated. Studies have found that epigenetic regulation, genetic variation and their signaling pathways, immune infammation, may be the cause of BAVM the main reason. This review comprehensively analyzes the key pathways and infammatory factors related to BAVMs, and explores their interplay with epigenetic regulation and genetics. Studies have found that epigenetic regulation such as DNA methylation, non-coding RNAs and m6A RNA modifcation can regulate endothelial cell proliferation, apoptosis, migration and damage repair of vascular malformations through diferent target gene pathways. Gene defects such as *KRAS*, *ACVRL1* and *EPHB4* lead to a disordered vascular environment, which may promote abnormal proliferation of blood vessels through ERK, NOTCH, mTOR, Wnt and other pathways. *PDGF-B* and *PDGFR-β* were responsible for the recruitment of vascular adventitial cells and smooth muscle cells in the extracellular matrix environment of blood vessels, and played an important role in the pathological process of BAVM. Recent single-cell sequencing data revealed the diversity of various cell types within BAVM, as well as the heterogeneous expression of vascular-associated antigens, while neutrophils, macrophages and cytokines such as IL-6, IL-1, TNF- α , and IL-17A in BAVM tissue were signifcantly increased. Currently, there are no specifc drugs targeting BAVMs, and biomarkers for BAVM formation, bleeding, and recurrence are lacking clinically. Therefore, further studies on molecular biological mechanisms will help to gain insight into the pathogenesis of BAVM and develop potential therapeutic strategies.

Introduction

Brain arteriovenous malformation (BAVM) is a rare developmental abnormality of the brain vasculature, in which proliferative blood vessels connect the feeding

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arteries and draining veins without the presence of capillaries, causing high-flow, low-resistance arteriovenous shunting (Lawton et al. [2015\)](#page-13-0). The incidence of BAVM is 1.10–1.42 cases per 100,000 individuals, and it is most commonly diagnosed in adolescents and young adults aged 20–40. BAVM is typically characterized by intracranial hemorrhage and seizures but may also present as progressive neurological deficits, psychiatric disorders, dizziness, or migraines (Thomas et al. [2016](#page-15-0)). The rate of rupture and hemorrhage of BAVM is about 3% (Gross and Du [2013\)](#page-12-0), and the mortality rate of patients with hemorrhage exceeds 20% (Karlsson et al. [2020](#page-13-1)). Patients who survived often carry a variety of sequelae, which seriously affect the quality of family life (Karlsson et al. [2020](#page-13-1); Fukuda et al. [2017](#page-12-1)). The vast majority of BAVM are sporadic, and only 5% of patients are associated with genetic syndromes such as hereditary hemorrhagic telangiectasia (HHT) and capillary malformations-arteriovenous malformations (CM-AVM) (Pan et al. [2021](#page-14-0)). Traditionally, BAVM have been considered to be caused by congenital vascular anomalies. However, with the development of molecular biology and diagnostic imaging techniques, more and more research studies suggest that BAVMs may be dynamic diseases. Recent case reports have shown that patients with BAVM were de novo lesions many years later, and that BAVM lesions can grow and remodel rapidly even after surgical resection (Morales-Valero et al. [2014](#page-13-2); Walcott et al. [2018\)](#page-15-1). Moreover, some patients with a history of intracranial injury developed BAVMs, suggesting the possibility of an acquired form of the disease (Nagai et al. [2020](#page-14-1); Park et al. [2021a](#page-14-2)). For example, patients with BAVMs acquired after cerebral aneurysm occlusion, stereotactic radiosurgery radiation therapy, hemorrhagic and ischemic stroke, seizures, traumatic brain injury, brain tumors, or encephalitic demyelinating lesions are thought to have experienced a "second hit" after brain injury (Florian et al. [2021a](#page-12-2)). Furthermore, various factors that contribute to abnormal vascular development, including epigenetic changes, cytokines, vascular injury repair-related proteins, environmental factors, and tumor-related gene mutations, are associated with the occurrence of BAVM. For example, single nucleotide polymorphisms (SNP) are involved in BAVM inflammatory response or angiogenesis. Interleukin-6 (IL-6), hypoxia-inducible factor (HIF‐1), vascular endothelial growth factor (VEGF), nuclear factor kappa-light-chain of activated B (NFκB), interleukin-1β (IL-1β) and interleukin-8 (IL-8) affect angiogenesis by participating in endothelial cell proliferation (Chen et al. [2006](#page-12-3); Yao et al. [2007](#page-15-2)), migration, reducing apoptosis and increasing the expression of vascular cell adhesion molecule-1 (VCAM-1) and intercellular adhesion molecule-1 (ICAM-1) (Storer et al. [2008](#page-14-3); Ardelt et al. [2005;](#page-11-0) Li et al. [2003\)](#page-13-3), increase the risk of BAVM. In addition, the researchers also found that mutations in tumor-related genes such as *KRAS*, *BRAF* and the RAS-MAPK-ERK signaling pathway might also lead to endothelial cell dysfunction and play important roles in the formation of BAVM (Hong et al. [2019\)](#page-12-4). Therefore, it is necessary to summarize the molecular and cellular signaling mechanisms involved in BAVM.

Epigenetics is the regulation of diferent physiological processes in organisms by causing changes in gene expression levels without changing the DNA sequence, such as non-coding RNA, DNA methylation, and histone modifcation. Epigenetic modifcations may serve as a bridge between the external environment and the vascular microenvironment, and afect the occurrence, development and prognosis of BAVM by regulating related signaling pathways (Thomas et al. [2016\)](#page-15-0). Therefore, this review will combine genetic variation, epigenetics, immune infammation and related signaling pathways to elucidate their roles in the pathogenesis of BAVM.

Genetic variations

SNP refers to the variations in a single nucleotide in DNA that are typically present in non-coding segments (Florian et al. [2020](#page-12-5)). Multiple studies have revealed that SNPs present in sporadic BAVM are associated with susceptibility to BAVM and bleeding risk in BAVM and are involved in vascular formation, infammation, or coding genes, such as those for fbrillin, laminin, and integrin, which may have a vital role in BAVM pathophysiology (Sturiale et al. [2013](#page-14-4)). Recent research has revealed genetic mutations associated with BAVM. About 5% of patients with BAVM associated with genetic syndromes may be associated with germline gene mutations (such as *ENG*, *ACVRL1*, *SMAD4* in HHT, *RASA1* or *EPHB4* in CM-AVM), while in the remaining 95% of sporadic BAVM patients, it is more likely to be related to somatic mutations (Pan et al. [2021](#page-14-0)). Among these, *KRAS* gene has the highest mutation rate, which may be a direct genetic basis of BAVM. Studies have conducted genomic testing on surgical and blood samples and found 60% of the patients with BAVMs had somatic *KRAS* gene mutations. They also found that the upstream and downstream molecular signaling pathways were closely related to mitogen-activated protein kinase (MAPK)/extracellular signal-regulated kinase (ERK) MAPK/ERK pathway activation, causing endothelial dysfunction (Nikolaev et al. [2018\)](#page-14-5). Mutations in endoglin (*ENG*) and activin a receptor like typ*e 1* (*ACVRL1*) lead to hereditary hemorrhagic telangiectasia 1 (HHT1) and hereditary hemorrhagic telangiectasia (HHT2), respectively, whereas mutations in SMAD Family Member 4 (*SMAD4*) are linked with the combination of HHT and juvenile polyposis (Gallione et al. [2004\)](#page-12-6). The genes related to these three loci are the components of the transforming growth factor-β (TGFβ) signal path, suggesting that the TGF-β signaling may play a crucial role in BAVM development. Capillary malformation is related with mutations in RAS P21 Protein Activator 1 (*RASA1*) and EPH Receptor B4 (*EPHB4*), and the EPHB4-RAS-ERK pathway plays an indispensable role in this condition (Amyere et al. [2017\)](#page-11-1). Weinsheimer et al. conducted a large-scale multicenter whole-genome SNP detection and showed signifcant SNP diferences in receptor tyrosine kinase and matrix metalloproteinase-3 (*MMP-3*) using univariate analysis (Sturiale et al. [2013](#page-14-4)). The AG genotype of RS522616 in the *MMP-3* promoter region is related with a low risk of developing BAVM (Zhao et al. [2010](#page-15-3)). Previous studies have revealed that the *IL-6*-174G >C promoter polymorphism is linked with the symptoms of BAVM bleeding and that plasma IL-6 can be used as a predictive indicator for BAVM bleeding. In a mouse model, IL-6 induced the expression and activity of MMP-3 and MMP-9 in the brain, increased endothelial cell proliferation and migration, and promoted intracranial hemorrhage (Chen et al. [2006](#page-12-3)). Kim et al. found that IL*-1β* gene promoter polymorphism is related to the bleeding risk and disease susceptibility to BAVMs, suggesting that infammatory reactions and cytokines also have a signifcant function in BAVM pathogenesis (Kim et al. [2009](#page-13-4)). VEGFA is a well-recognized vascular-associated protein that plays an important role in the migration, proliferation and survival of endothelial cells, and can increase vascular permeability and induce vasodilation during vascular disease (Claesson-Welsh and Welsh [2013](#page-12-7)). *VEGFA* gene polymorphisms was shown to be associated with susceptibility and bleeding risk of BAVM (Chen et al. [2011](#page-12-8)). Notch receptor 4 (*NOTCH4*) (6p21.32) mutations may be associated with clinical manifestations (rupture and seizures) and susceptibility to BAVM (Florian et al. [2020;](#page-12-5) Sturiale et al. [2013](#page-14-4)). Bendjilali et al. also showed that *ACVRL1*, and angiopoietin like 4 (*ANGPTL4*) mutations were significantly associated with sporadic BAVM (Bendjilali et al. [2013](#page-11-2)). In addition, SNPs in transforming growth factor beta receptor 2 (*TGFR-β2*), interleukin 1 alpha (*IL-1α*), interleukin 1 receptor antagonist (*IL-1RN*), *MMP-3*, *MMP-9*, RB binding protein 8 (*RBBP8*), adhesion G protein-coupled receptor A2 (*GPR124*), SRY-Box transcription factor 17 (*SOX-17*), CDKN2B Antisense RNA 1 (*CDKN2BAS1*), and *VEGFA* were related with susceptibility to BAVM. SNPs in *IL-6*, *TNF-α*, *IL-1β*, interleukin 17A (*IL-17A*), *TGFR-β2*, apolipoprotein E(*APOE*), *EPHB4*, *MMP-9*, and *VEGFA* were related with bleeding risk in BAVM (Sturiale et al. [2013;](#page-14-4) Kremer et al. [2015](#page-13-5)). Polymorphisms in brain-derived neurotrophic factors (*BDNF*) are linked with poor surgical outcomes in patients with unruptured BAVM (Westbroek et al. [2012\)](#page-15-4). Through relative risk calculation, we found that *EPHB4* (rs314308 and rs314313), *IL-17A* (rs2275913), *MMP-3* (rs522616), *MMP-9* (rs9509), and *GPR124* (rs12676965, rs7823249 and rs7015566) are protective factors for BAVM, while other gene mutations such as *ACVRL1* (rs2071219), *ANGPTL4* (rs11672433), *APOE* (e-/e +), *CDKN2BAS1* (rs1333040), *EPHB4* (rs314346 and rs314353), *IL-1α* (rs1800587), *IL-1β* (rs16944 and rs1143627), *IL-1RN* (rs2234663), *IL-6* (rs1800795), *ITGB8* (rs10486391 and rs11982847), *NOTCH* (rs443198 and rs915895), *VEGFA* (rs1547651 and rs833069), *RBBP8* (rs11082043), *TGFR-β2* (rs3087465), *TNF-α* (rs361525), *BDNF* (rs6265), and *SOX-17* (rs9298506) are risk factors for BAVM (Fig. [1](#page-2-0)). The abundance of *KRAS/BRAF* mutations in BAVM tissue was inversely proportional to the size of the lesion, suggesting that *KRAS/BRAF* mutations in endothelial cells were the initiating factors for the occurrence of BAVM (Hong et al. [2019](#page-12-4)). Recent study had also demonstrated through animal models that over-activating *KRAS* mutations might promote the occurrence and development of BAVM through the MEK/ERK pathway, and treatment with trametinib cloud efectively inhibit the growth of BAVM (Park et al. [2021b](#page-14-6)). Therefore, research on genetic mutations and SNPs can assist in BAVM diagnosis and monitoring, and drugs can be developed to target these genetic mechanisms (Li et al. [2021\)](#page-13-6).

Copy number variation (CNV) and insertion/deletion (InDel) are another structural variation of genetic factors.

Fig. 1 Association of genetic variation with BAVM. **A** Genetic loci associated with BAVM; **B** Relative risk analysis of BAVM genetic loci (*SNP* single nucleotide polymorphism, *CNV* copy number variation, InDel refers to an insertion in a gene mutation or indeed.)

CNV refers to genomic structural variations > 1 kb in length, manifested as an increase or decrease in the copy number of large genomic segments compared with the reference genome (Conrad et al. [2010\)](#page-12-9). Similar to SNPs, CNVs afect the expression and variation of human genes and phenotypes. Current research has demonstrated a correlation between CNV and the occurrence of neurological and psychiatric disorders (Rees and Kirov [2021](#page-14-7)). Bendjilali et al. conducted a whole-genome CNV analysis of BAVM; however, owing to the limitations in the number of cases, common CNVs were not detected in patients with sporadic BAVM (Bendjilali et al. [2013\)](#page-11-2). InDel are defned as genomic differences due to deletions or insertions of $\lt 1$ kb of nucleotides, but there is no clear evidence of a link between InDel and BAVM. Further research is needed to investigate CNVs and InDel associated with BAVM.

Epigenetics

Epigenetics refers to mechanisms that alter gene expression without altering the DNA sequence. These alterations persist throughout development, can be passed on to future generations, and play a wide range of roles in various human diseases (Portela and Esteller [2010;](#page-14-8) Heard and Martienssen [2014\)](#page-12-10). Epigenetic modifcations can be divided into 3 major types: DNA methylation, non-coding RNA, and histone modifcations, which regulate pathological processes including cell proliferation, development, and diferentiation (Portela and Esteller [2010;](#page-14-8) Xia et al. [2021](#page-15-5)). Epigenetics responds to internal and external environmental stimuli under certain circumstances, leading to changes in disease susceptibility and progression. Previous studies have found that hemodynamics may be the most indispensable epigenetic factor in BAVM development (Fig. [2](#page-4-0)). Exposure of endothelial cells to hemodynamic factors, including blood pressure and shear stress, can induce chromatin modifcations that alter gene expression, leading to abnormal blood vessel formation and remodeling, resulting in BAVM development (Thomas et al. [2016](#page-15-0)).

DNA methylation

DNA methylation is a key epigenetic mechanism that primarily occurs in CpG dinucleotides in the gene promoter and is catalyzed by DNA methyltransferases with S-adenosyl-L-methionine as the methyl donor. It can prevent the interaction of transcription factors with specifc binding sites, thereby mediating gene silencing (Stanzione et al. [2020](#page-14-9); Jaenisch and Bird [2003\)](#page-13-7). DNA methylation patterns vary among tissues, have indispensable functions in regulating the normal development of organisms, and are involved in many central nervous system (CNS) diseases (Chen et al. [2022](#page-12-11); Deng et al. [2020;](#page-12-12) Dock et al. [2015](#page-12-13); Dinicola et al. [2017](#page-12-14); Rawlik et al. [2016;](#page-14-10) Wang et al. [2022](#page-15-6); Numata et al. [2014](#page-14-11)).

Abnormal hemodynamics at the junction of the supplying artery and draining vein may lead to epigenetic changes in endothelial cells, afecting the regulation of blood vessel development. Thomas et al. measured the DNA methylation levels of blood vessel developmentrelated genes in the lesion tissue of ten patients with BAVM and found high methylation levels in the promoters of Zinc Finger Protein 24 (*ZNF24*), fatty acid amide hydrolase (*FAAH*), angiogenic factor with G patch and FHA domains 1 (*AGGF1*), and ankyrin repeat domain 65 (*ANKRD65*). ZNF24 is a *VEGF* transcriptional repressor, and after being silenced by methylation, it activates *VEGF* transcription; FAAH can produce various vasoconstrictors, and its inactivation can inhibit vascular generation in vivo and in vitro; AGGF1 regulates various stages of vascular development, including endothelial cell migration, proliferation, and venous diferentiation, and high methylation inhibits its expression, leading to abnormal venous development (Thomas et al. [2022\)](#page-15-7). Chen et al. have confrmed that the methylation levels of the CPG1, CPG5, and CPG8 regions of the *CDKN2A* in the blood leukocytes of patients with BAVM were markedly higher than those in patients with intracranial aneurysms and healthy individuals, suggesting that *CDKN2A* is closely related with BAVM pathogenesis and has potential for use in early diagnosis (Chen et al. [2019\)](#page-12-15). CDKN2A is a tumor suppressor protein, and previous studies on intracranial aneurysms have indicated that CDKN2A may have a crucial function in adjusting endothelial cell proliferation and repair to prevent vascular damage (Bilguvar et al. [2008\)](#page-11-3). However, its role in venous development requires further study. Liu et al. found that CpG3 methylation of the phospholipase A2 group VIIG7 (*PLA2G7*) gene is related to the risk of BAVM, and that the average methylation level of the gene is related to the risk of BAVM in men and to *APOE* and apolipoprotein B (*APOB*) levels; however, the mechanism of action remains unclear (Liu et al. [2020](#page-13-8)). The methylation level of the platelet-derived growth factor-D (*PDGFD*) promoter is associated with the risk of BAVM (Zhou et al. [2017\)](#page-15-8). The methylation of the nitric oxide synthase 1 adaptor protein (*NOS1AP*) promoter is also related to the risk of BAVM, and sex and smoking may have a synergistic efect on the methylation mechanism, which requires further verifcation in a large sample (Portela and Esteller [2010](#page-14-8); Wang et al. [2016\)](#page-15-9).

Abnormal DNA methylation is linked with BAVM, and the use of DNMT-specifc inhibitors (DNMTIs) to reverse DNA methylation may help prevent BAVM recurrence. However, the downstream pathways remain unclear, and the role of methylation and related genes in blood vessel

Fig. 2 The possible relationship between epigenetic regulation and the occurrence of BAVM. DNA methylation of *ZNF24*, *FAAH*, *AGGF1*, *CDKN2A*, *ANKRD65*, *PLA2G7*, *PDGFD*, and *NOS1AP* is closely linked to BAVM occurrence. ZNF24 regulates the production of VEGF; FAAH regulates angiogenesis; AGGF1 regulates the proliferation, migration, and venous fate of endothelial cells; and

development requires further investigation. DNMTIs have been used in related diseases, such as malignant tumors; however, related drug research on BAVM is lacking.

Non‑coding RNA

Non-coding RNAs, such as short non-coding microRNAs (miRNAs) and long non-coding RNAs (lncRNAs), are transcribed from the genome and have indispensable function in adjusting gene expression and protein function (Portela and Esteller [2010;](#page-14-8) Heard and Martienssen [2014](#page-12-10); Winkle et al. [2021](#page-15-10)).

miRNAs, which are approximately 20–22 nucleotides long, control gene expression via binding to complementary sequences and inhibiting translation or promoting mRNA

CDKN2A may mediate the occurrence of BAVM by regulating the proliferation and repair of endothelial cells. MiR-18a can improve BAVM by inhibiting BMP4 and HIF-1 α production. WTAP may be involved in the pathogenesis of BAVM via angiogenesis regulation through the Wnt pathway

degradation (Florian et al. [2020\)](#page-12-5). miRNAs behave diferently and regulate vascular development diferently in various diseases and systems, which is infuenced by vascular formation pathways and hemodynamics. miRNAs in diferent cell types act on diferent target cells through various signaling pathways, leading to abnormal vessel formation and decreased endothelial cell migration, resulting in BAVM development (Florian et al. [2021b](#page-12-16)). miR-18a can improve BAVM by inhibiting bowel management program 4 (BMP4) and hypoxia-inducible factor 1 subunit alpha (HIF-1 α) and have important clinical value in preventing, reducing, and possibly reversing BAVM (Marín-Ramos et al. [2020\)](#page-13-9). miR-137 and miR-195 regulate downstream signaling proteins involved in vascular development, including phosphoinositide 3-kinase (PI3K), protein kinase B (AKT), NFκB,

MAPK, ERK, and VEGF, and their levels are signifcantly reduced in BAVM smooth muscle cells. Increasing the levels of these miRNAs can inhibit smooth muscle cell migration, vessel formation, and in vitro survival of BAVM. miR-137 and miR-195 act as angiogenesis inhibitors by altering the phenotype of smooth muscle cells in BAVM. The absence of miR-137 and miR-195 expression causes abnormal vascular formation (Huang et al. [2017](#page-13-10)).

N6-Methyladenosine (m6A) is one of the most abundant internal RNA modifcations in eukaryotic cells and is involved in the functional regulation of various biological processes. The enzymes participated in m6A modifcation primarily include methyltransferases (writers), demethylases (erasers), and methylation readers (readers). The m6A modifcation is primarily facilitated by m6A methyltransferase and eliminated by m6A demethylase, thereby playing a crucial role in this process. The modifed RNA undergoes specifc recognition and binding by m6A recognition proteins. This protein complex facilitates various RNA processes including splicing, maturation, nucleation, degradation, and translation. Furthermore, m6A modifcation modulates gene expression and controls vital cellular processes such as self-renewal, diferentiation, apoptosis, and invasion (Liu et al. [2023\)](#page-13-11). Recent evidence suggests that the brain has the highest abundance of m6A RNA methylation among all organs, indicating its regulatory role in CNS development and cerebrovascular remodeling (Fan et al. [2023](#page-12-17)). Notably, the catalyzed methyltransferase 3 (*METTL3*) and methyltransferase 14 (*METTL14*) subunits and the regulated Wilms tumor 1-associated protein (*WTAP*) and Vir Like M6A Methyltransferase Associated (*KIAA1429*) subunits form the core methyltransferase complex and catalyze the m6A modifcation of adenosine in RNA (Bokar et al. [1997,](#page-12-18) [1994](#page-11-4); Liu et al. [2014\)](#page-13-12).

Recent research has found that METTL3 content is downregulated in large BAVM teratomas, suggesting that METTL3 can be used as a biomarker for BAVM lesion size to predict treatment outcomes. Further experiments have revealed that the direct downstream targets of METTL3, deltex E3 ubiquitin ligase 3L(DTX3L), and deltex E3 ubiquitin ligase 1(DTX1) synergistically regulate the NOTCH pathway to control angiogenesis. Knocking out *METTL3* signifcantly afects tube formation and migration of endothelial cells, indicating that the characteristics of vascular endothelial cells can be regulated via m6A modifcation. Blocking the NOTCH pathway with DAPT restores the phenotype of *METTL3*-deficient endothelial cells (Wang et al. [2020a](#page-15-11)). NOTCH directly regulates the response of endothelial cells to BMP and the formation of new blood vessel branches by regulating SMAD family member 6 (*SMAD6*) expression in the TGF-β pathway (Wang et al. $2020a$). In this study, *SMAD6* activation was also observed, downregulating BMP responsiveness, which is consistent with previous studies (Wang et al. [2020a](#page-15-11)). Wilms' tumor 1-associating protein (WTAP) is the most important modifed subunit of m6A, and its absence may lead to various developmental disorders in embryos (Ping et al. [2014](#page-14-12)). WTAP is downregulated in BAVM lesions, and WTAP knockout signifcantly inhibits human endothelial cell tube formation. The absence of WTAP rapidly degrades the downstream bridging protein desmoplakin through m6A modifcation, enhances the activity of Wilms' tumor 1, and negatively regulates the Wnt pathway, thereby regulating blood vessel formation (Wang et al. [2020b\)](#page-15-12). These results provide important evidence for elucidating the pathogenesis of BAVM and identifying new potential targets for treatment.

lncRNA molecules are longer than 200 nucleotides and do not encode proteins. These RNA molecules regulate DNA, RNA, and proteins via base pairing or chemical interactions in their secondary structures. lncRNAs are involved in a lot of biological mechanisms; however, there is limited research on lncRNAs associated with BAVM (Winkle et al. [2021\)](#page-15-10). Li et al. used an Arraystar-lncRNA array to analyze lncRNA and mRNA expression in lesion tissues from four surgical patients. They found that NADPH-downregulated lncRNA (ENST00000423394) was associated with symptoms of epilepsy, and the downregulation of lncRNA (TCOS_00013855) related to the mitochondrial fusion protein OPA1 may decrease the stability of vascular smooth muscle cells (VSMCs) and surrounding cells in BAVM. Both LncRNAs were not related to BAVM hemorrhage; however, the sample size was small, and further research is needed (Li et al. [2018](#page-13-13)).

Histone modifcation and environmental factors

The N-termini of histone tails in eukaryotic organisms undergo many posttranslational modifcations. Lysine acetylation and methylation are the main modifcations that regulate chromatin structure and local gene activity. Changes in histone acetyltransferases and histone deacetyl transferases (HDACs) may be associated with BAVMs (Portela and Esteller [2010\)](#page-14-8). Previous researches have confrmed that HDAC1/2/3 could adjust endothelial cell proliferation and may be infuenced by hemodynamic forces, whereas HDAC7 plays a crucial role in the diferentiation and regeneration of vascular endothelial cells (Mottet et al. [2007](#page-13-14); Margariti et al. [2010](#page-13-15)). Alterations in HDACs can afect endothelial cell function and impair vascular formation. However, their specifc correlation with BAVMs remains unclear.

Lysine Demethylase 8 (JMJD5) is a pluripotent histone demethylase that regulates cancer cell proliferation, embryonic development, and embryonic stem cells. Sox2 regulates JMJD5 expression in endothelial cells and activates the expression of mesenchymal markers, which affects vascular development (Yao et al. [2019\)](#page-15-13). In addition, other RNA modifcations such as m5C, m7G, and ac4C, as well as histone modifcations, require further research on their association with the occurrence and development of BAVMs to improve our understanding of the disease (Portela and Esteller [2010](#page-14-8); Pandolfni et al. [2019;](#page-14-13) Shen et al. [2018;](#page-14-14) Arango et al. [2018](#page-11-5)).

Tumors, strokes, infammation, and seizures can also act as environmental factors mediating the development of acquired BAVMs. This phenomenon has been referred to as "secondary hits" in previous studies. Trauma is necessary for BAVM development in adult mice with *ACVRL1* deficient vasculature. Inflammatory reactions may contribute to BAVM development as a result of infammatory diseases, demyelination, and Bell's palsy, as evidenced by the detection of infammatory factors around BAVM lesions. Infammatory factors may lead to excessive expression of VEGF and cause vascular remodeling by inducing hemodynamic abnormalities. The efect of hypoxia on BAVMs may be related to HIF-1, and the development of BAVMs after aneurysm clipping surgery may be associated with partial ischemia following vessel occlusion (Nagai et al. [2020](#page-14-1); Wang et al. [2015](#page-15-14); Santos et al. [2018;](#page-14-15) Lee et al. [2022\)](#page-13-16).

Signaling pathways

Many genetic changes also afect angiogenesis and vascular development by regulating VEGFs and signaling pathways (Fig. [3](#page-6-0)). Abnormalities in angiogenesis and vascular development that led to structural and functional abnormalities in blood vessels are key factors in the development of BAVMs. Multiple signaling pathways regulate angiogenesis and vascular homeostasis. During development, the process of hemangioblast aggregation and diferentiation into primitive vascular plexuses is called HIF-1 vasculogenesis; however, the formation of new blood vessels through proliferation, diferentiation, and migration of endothelial cells from pre-existing blood vessel networks is called angiogenesis (Folkman [2007](#page-12-19); Jeltsch et al. [2013](#page-13-17); Patan [2000\)](#page-14-16). The expression of arterial, venous, and capillary markers determines the structure of blood vessels. BAVM lesions show abnormalities in blood vessel diferentiation, maturation, and capillary-specifc gene expression, and abnormal blood vessels do not undergo terminal diferentiation or complete maturation (Thomas et al.

Fig. 3 The possible relationship between gene mutations and BAVM. *KRAS* mutations may cause endothelial dysfunction by activating the downstream MAPK/ERK pathway or indirectly activating NOTCH signaling to regulate cell migration. METTL3 can reduce abnormal

angiogenesis by inhibiting the NOTCH signaling pathway and promoting the phosphorylation of SMAD1/5/9 and SMAD2/3. NOTCH, TGF-β, Wnt, and mTOR-FABP4 pathways and PDGF-B/PDGFR-β signaling are involved in the development of BAVM

[2018\)](#page-15-15). The control of angiogenesis and vascular homeostasis is jointly controlled via multiple complex signaling pathways including VEGF/vascular endothelial growth factor receptor (VEGFR), Ang-Tie2, NOTCH, and platelet-derived growth factor subunit B (PDGF-B), BMP-9/ ACVRL1/ENG, which interact to maintain a balance between promoting and inhibiting angiogenesis and play an indispensable role in the physiological and pathological processes (Patan [2000](#page-14-16); Jain [2003](#page-13-18); Goumans et al. [2009](#page-12-20); Niessen and Karsan [2008](#page-14-17); David et al. [2009](#page-12-21)). Epigenetics plays a crucial role in normal and pathological vascular development, and hemodynamics may be an important contributor (Matouk and Marsden [2008](#page-13-19)). Abnormal blood flow dynamics at the arteriovenous junction can change endothelial cell epigenetic factors, alter their control on vascular development, and lead to BAVM development (Thomas et al. [2016](#page-15-0)).

RAS‑MAPK‑ERK pathway

The BAVM phenotype is linked to the inhibition of TGF- β pathway and activation of the MAPK signaling pathway (Nikolaev et al. [2018\)](#page-14-5). The RAS pathway includes cascading signals that regulate key cellular functions including proliferation, growth, and senescence (Prado et al. [2019](#page-11-6)). Mutations in genes participated in the RAS/MAPK pathway include those in *KRAS*, *NRAS*, B-raf proto-oncogene (*BRAF*), and mitogen-activated protein kinase kinase 1 (*MAP2K1*). *KRAS* mutations have the highest reported mutation rate in BAVMs. Nikolaev et al. proposed that KRAS may induce the activation of the MAPK-ERK pathway in brain endothelial cells (BECs), leading to BAVM development. In vitro *KRAS* mutations induce a rise of ERK activity, causing a rise in the expression of genes associated with angiogenesis and NOTCH pathway, as well as enhancing migration. In addition, an increase in the level of phosphorylation of ERK1/2 is observed in cells expressing mutant KRAS. ERK5 regulates several pathways participated in angiogenesis and suppresses VEGF expression during hypoxic responses (Sohn et al. [2002](#page-14-18)). A signifcant increase in the phosphorylation level of ERK1/2 indicates the activation of the RAS/RAF/MAPK/ERK pathway and is a marker of BAVM development (Nikolaev et al. [2018](#page-14-5)).

KRAS is a downstream efector molecule of receptor tyrosine kinases that activates multiple cell-signaling networks including the KRAS-MAPK-ERK and KRAS-PI3K-AKT-mTOR pathways. The activation of MAPK-ERK pathway by KRASG12V causes the disruption of endothelial cell calcium-binding protein connections and inhibits the formation of adhesion connections. Inhibition of the MAPK-ERK pathway signal transduction with MEK inhibitors, which suppress ERK phosphorylation, can reverse the inhibition of adhesion connection formation, thereby enabling normal actin function and restoring normal vascular cell morphology (Nikolaev et al. [2018](#page-14-5)).

Animal experiments have confrmed the function of the MAPK/ERK pathway in *KRAS* mutations in BAVMs. Fish et al. and Jason et al. used adult mouse and zebrafsh models to verify that somatic *KRAS* (mainly G12D or G12V) gene mutations are sufficient to cause endothelial cell dysfunction in the absence of trauma, resulting in the changes in endothelial cell morphology, increased cell size, enlargement of the vascular lumen, and vascular ectopic budding, causing the direct connection of arteries and veins and the formation of BAVMs. They also demonstrated that gene mutations activate the MEK signaling pathway rather than the PI3K pathway (Fish et al. [2020](#page-12-22)). In zebrafsh models, *KRAS*-dependent BAVM formation is reversible (Nikolaev et al. [2018](#page-14-5); Fish et al. [2020](#page-12-22)). Currently, there are no pharmacological inhibitors that directly target KRAS. The mechanism underlying MEK inhibition provides a new direction for the prevention and treatment of BAVM.

VEGF/NOTCH pathway

Previous researchers have revealed that both the activation and inhibition of NOTCH can lead to BAVM development (Gale et al. [2004;](#page-12-23) Krebs et al. [2004;](#page-13-20) Murphy et al. [2012,](#page-14-19) [2009\)](#page-14-20). VEGF is an important regulatory factor in vascular development, and its activity is mediated by VEGF receptors (VEGF1 and VEGF2). Endothelial cell expression of VEGF, together with its co-receptor, neuropilin 1, promotes diferentiation toward arteries, while the ephrin and NOTCH pathways are crucial for maintaining arterial identity. Studies have revealed that the VEGF and NOTCH signaling pathways are associated with the development and maintenance of BAVMs. During angiogenesis, the NOTCH signaling pathway associated with the EFNB2/EphB4 phenotype determines the size of the blood vessels and the proportion of arterial and venous endothelial cells. Expression of the NOTCH family is a crucial marker of arteriovenous diferentiation, and VEGF plays an important role in early vascular development (Kim et al. [2008](#page-13-21)). Various factors such as hypoxic environments and hemodynamics at the arteriovenous junction cause a series of chromatin modifcations that lead to abnormal gene expression. Increased VEGF expression promotes the formation of disorganized abnormal blood vessels that are more prone to bleeding (Sohn et al. [2002](#page-14-18); Tu et al. [2014](#page-15-16); Illi et al. [2003\)](#page-13-22).

In endothelial cells and zebrafish embryo *METTL3* knockout models, the upregulation of the arterial marker HES related family BHLH transcription factor with YRPW motif 2 (HEY2) and activation of the NOTCH pathway are associated with the development of BAVM-like vessels and signifcantly reduce endothelial cell migration ability. Based on a zebrafsh model, METTL3 directly acts on the downstream targets DTX3L and DTX1, inducing an overexpression of BHLH transcription factors, such as HES1 and HEY1, which leads to the overexpression of the arterial endothelial cell phenotype HEY2 through ligand binding and protein hydrolysis. HEY proteins have also been shown to directly inhibit transcription factors (Briot and Iruela-Arispe [2015;](#page-12-24) Kopan and Ilagan [2009](#page-13-23)). The NOTCH pathway inhibitor DAPT can rescue vascular defects caused by *METTL3* knockdown and may be an important targeted drug for BAVM treatment. BMPs belong to the TGF-β superfamily of secreted growth factors and regulate vascular growth by inducing phosphorylation and nuclear translocation of SMAD transcription factors (SMAD1/5/9) through receptor binding (Mouillesseaux et al. [2016\)](#page-14-21). Cross-talk between NOTCH pathways and BMP pathways regulates endothelial cell behavior during blood vessel development (Wang et al. [2020a](#page-15-11); Luna-Zurita et al. [2010](#page-13-24)). BECs in BAVMs exhibit higher activity, proliferation, migration, and mobility than normal endothelial cells, which is related to the enhanced expression of the BMP and NOTCH signaling pathways and the regulation of VEGF expression levels (Nikolaev et al. [2018](#page-14-5); Al-Olabi et al. [2018\)](#page-11-7). Furthermore, the loss of NOTCH pathway in pericytes decreases PDGFR-B expressions and increases pericyte apoptosis, indicating that NOTCH plays a critical role in pericyte survival. Loss of vascular NOTCH signaling is manifested by a marked reduction in arterial pericytes and VSMCs, increased VSMCs in veins, and severe AVMs in retinal vessels in mice. Vascular malformations and pericyte loss have been confrmed in embryonic mouse forebrains lacking NOTCH signaling. This revealed a mechanism for AVM development and highlighted the important mediating role of NOTCH pathway in this process (Nadeem et al. [2020](#page-14-22)).

TGF‑β pathway

The TGF-β pathway has played a crucial role in BAVM (Choi et al. [2023](#page-12-25); Taniguchi et al. [2022;](#page-15-17) Scimone et al. [2020](#page-14-23); Wang et al. [2018](#page-15-18)). The protein expressions of TGFβ1 and SMAD3 were increased in BAVM tissue, while the protein contents of BMP-9, ACVRL1, SMAD1, SMAD6, and SMAD8 were markedly reduced in AVM (Wei et al. [2022\)](#page-15-19). The downregulation of SMAD6 and activation of TGF-β/BMP pathway in vascular endothelial cells have been linked with microhemorrhage in BAVMs. In vitro studies have revealed that the downregulation of SMAD6 in HUVECs promoted cell proliferation, migration, and invasion and increased the level of mesenchymal markers, and the endothelial-mesenchymal behavior was positively correlated with BAVM microhemorrhage (Fu et al. [2020\)](#page-12-26). Targeting the components of the aberrantly expressed TGF-β/BMP pathway in AVM is a viable approach for the development of novel molecular therapies (Wei et al. [2022](#page-15-19)).

Inhibition of TGF-β signaling markedly reduced the number of p-SMAD21-positive cells in the AVF wall and improved AVF patency. Endothelial cell-targeted TGF-β inhibition can be a translational strategy for improving AVF patency (Taniguchi et al. [2022](#page-15-17)). HHT, a genetic disorder caused by mutations in *ENG*, *ACVRL1*, or *SMAD4*, is strongly associated with TGF-β (Hwan Kim et al. [2020;](#page-13-25) Pardali and Dijke [2012](#page-14-24)). Germline mutations in several genes involved in TGF-β/BMP signaling are associated with sporadic genetic phenotypes (Scimone et al. [2020](#page-14-23)). Follow-up researches have revealed that BMP signaling attenuates the formation of cerebral AVMs in vertebrate models (Walcott [2014](#page-15-20)). In summary, TGF- β is expected to be a key target for overcoming BAVM.

Other pathways

The mTOR-FABP4 pathway is participated in endothelial cell proliferation, apoptosis, migration, and tube formation. Studies have revealed that mTOR-FABP4 signaling is activated in BAVMs. Rapamycin can inhibit the mTOR-FABP4 pathway, thereby inhibiting EC proliferation, apoptosis, migration, and angiogenesis (Yan et al. [2022\)](#page-15-21). Rapamycin treatment reduced the number of BAVM in an HHT mouse model (Ruiz et al. [2020](#page-14-25)). *RASA1* or *EPHB4* deficiency causes vascular malformations in zebrafsh models. Kawasaki et al. confrmed that in an *EPHB4*-deleted zebrafsh model, the mTOR pathway was strongly overactivated, and inhibition of the mTOR pathway could rescue vascular structure and function (Kawasaki et al. [2014\)](#page-13-26).

Pericyte loss leads to endothelial cell hyperplasia and endothelial luminal membrane over-folding. Significant reductions in smooth muscle cell number have been observed in mouse BAVM models (Walker et al. [2011](#page-15-22); Chen et al. [2013\)](#page-12-27). Imperfections and immaturity of the vessel wall structure are signifcantly associated with BAVM. Knockdown of *PDGF-B* and *PDGFR-β* in mice resulted in the loss of microvascular pericytes. *PDGF-B* and *PDGFR-β* play important roles in pericytes and VSMCs recruitment during angiogenesis (Winkler et al. [2018;](#page-15-23) Zhu et al. [2018](#page-16-0)). *PDGFR-β* expression is reduced in BAVM lesions in *ACVRL1*-deficient mice (Chen et al. [2013](#page-12-27)) and is related with reduced smooth muscle cell and pericyte coverage. Overexpression of *PDGF-B* in *ACVRL1*-deficient BAVMs increases BAVM pericyte coverage and reduces BAVM hemorrhage (Zhu et al. [2018\)](#page-16-0). These results suggest that PDGF-B and PDGFR-β pathway have crucial function in maintaining the vascular integrity in BAVMs. FZD10 and MYOC exhibited elevated expression levels in the vascular endothelial cells and smooth muscle cells of BAVMs. The activation of the canonical Wnt signaling pathway involving FZD10 and MYOC is crucial for the development of BAVMs, specifcally in the vascular endothelial and smooth muscle cells (Huo et al. [2019](#page-13-27)).

Infammation and BAVM

Previous studies have indicated a close association between infammation and BAVM (Fig. [4](#page-9-0)). Studies have found a signifcant increase in neutrophils and macrophages in BAVM tissues, whereas T- and B-lymphocytes have rarely been observed (Chen et al. [2008\)](#page-12-28). Similarly, monocytic and macrophagic infltration has been found around BAVM lesions (Singh et al. 2022). IL-6 and CD16+monocyte levels also increase after BAVM embolization (Hakki et al. [2022](#page-12-29)). Microglia, the primary resident immune cells of the nervous system, are the primary triggers of neuroinfammation. Microglia secrete large amounts of cytokines, chemokines, and reactive oxygen species. In a BAVM mouse model, the depletion of microglia inhibitor reduced the risk of abnormal blood vessels and bleeding (Krithika and Sumi [2021\)](#page-13-28). Low expression of integrin subunit beta 8(*ITGB8*) in perivascular astrocytes may regulate the interaction between astrocytes and glial cells and play a crucial role in the pathogenesis of BAVM (Su et al. 2010). IL-6, IL-1, TNF- α , and IL-17A play important roles in the occurrence and development of BAVMs (Kim et al. [2009](#page-13-4); Krithika and Sumi [2021;](#page-13-28) Pawlikowska et al. [2004](#page-14-27); Germans et al. [2022\)](#page-12-30). Polymorphisms of inflammation-related genes such as IL-6, IL-1 α , IL-1 β , and $TNF-\alpha$ can affect gene expression and increase disease susceptibility or aggravate disease progression and increase the risk of BAVM rupture. Another study demonstrated that plasma levels of IL-1β, IL-6, IL-17A, and TNF- α were signifcantly higher in the BAVM rupture group than in the nonrupture group, and IL-6 can be used as a reliable predictor of bleeding risk in patients with BAVM (Li et al. [2013](#page-13-29)). IL-6 induces the expression and activity of MMP-3 and MMP-9 in the mouse brain and can increase the proliferation and migration of BECs, which is consistent with the hypothesis that the induction of angiogenic activity by infammatory processes may lead to intracranial hemorrhage in BAVM

Fig. 4 Role of infammation in BAVM. A large number of microglia and neutrophils were enriched near BAVM. Microglia release cytokines and reactive oxygen species. IL-6 promotes the prolifera-

tion and migration of endothelial cells, and IL-1β, IL-6, IL-17A, and TNF- α are associated with the rupture and hemorrhage of BAVM

(Chen et al. [2006](#page-12-3)). When blood vessels are stimulated by pathological factors, endothelial cells (ECs) infammatory factors are up-regulated, cell adhesion molecules (CAM) are overexpressed, and leukocytes are recruited to diseased tissues (Jeong et al. [2021\)](#page-13-30). Leukocytes release a variety of inflammatory cytokines, including IL-6, TNF- α , IL-1 β , and MMPs (Al-Sadi et al. [2011](#page-11-8)). IL-6 is a pro-infammatory cytokine secreted by T cells, mononuclear phagocytes and ECs, which can activate the early infammatory responses by promoting the expressions of IL-1β, MMP-3, IL-8, MMP-9, TNF- α and MMP-12 (Tanaka et al. [2014\)](#page-15-25). TNF- α is a potent pro-infammatory cytokine involved in central nervous system homeostasis and disease states. TNF-α, which promotes infammation by activating MMP-9 and IL-6, and triggers proteolytic processes leading to vessel rupture, is strongly associated with BAVM rupture and bleeding risk (Mouchtouris et al. [2015](#page-13-31)). MMP-9 expression promotes vascular instability and ECM degradation, which leads to vascular rupture (Mouchtouris et al. [2015\)](#page-13-31). In addition, BAVM venous hypertension can cause high expression of HIF-1 and VEGF. Induction of VEGF by HIF‐1 causes EC proliferation, migration and overexpression of MMP‐9 (Krithika and Sumi [2021\)](#page-13-28). The infammatory response up-regulates the expression of VEGF, which in turn increases capillary permeability and up-regulates the expression of VCAM-1 and ICAM-1 on EC, thereby enhancing leukocyte recruitment, infammatory response and vascular wall degradation through the MMPs secreted by leukocytes, and promoting vascular generation, vascular remodeling, increased permeability, and further infammation of the BAVM wall, forming an infammatory cascade.

Single cells and BAVM

Single-cell sequencing has identifed the following major vascular cell types: endothelial cells (CLDN5), pericytes (KCNJ8), smooth muscle cells (MYH11), and vascular mural fbroblasts (DCN) (Winkler et al. [2022\)](#page-15-26). Studies have used multiplex spatial transcriptomics to resolve vascular cell diversity in the adult human cerebral cortex, and the spatial distribution of brain vascular cells revealed a decrease in the vascular cell density in the white matter region. Based on CLDN5 and PECAM1 expression, endothelial cells were classifed into six clusters corresponding to four arteriovenous segments: capillaries, arteries, venules, and veins. In addition, three clusters of endothelial cells were identifed within the arterial bands, including a cluster rich in TXNIP, a regulator of glucose metabolism, and oxidative stress. This study confrmed the expression of MFSD2A, VEGFC, and ACKR1 in arteries, capillaries, and veins (Winkler et al. [2022\)](#page-15-26). Notably, in human BAVMs, endothelial cells lose their normal banding, and a unique transcriptomic state of BAVM is observed, characterized by enhanced vascular generation potential and immune cell interference (Winkler et al. [2022](#page-15-26)). A heterogeneous spatial distribution of vascular-related antigens in BAVM lesions has been reported, with more IBA1+P2RY12- macrophages or IBA1+P2RY12+microglia in discontinuous regions (Winkler et al. [2022](#page-15-26)). A signifcant perivascular myeloid response was observed, with IBA1+P2RY12- macrophages found farther away from adjacent blood vessels, consistent with BAVM infltration (*P*<0.01) (Li et al. [2021;](#page-13-6) Winkler et al. [2022](#page-15-26)). This study found a clear population of mesenchymal cells in BAVMs co-expressing endothelial and mesenchymal cell markers, suggesting the presence of endothelial-mesenchymal transition (Li et al. [2021](#page-13-6)). The authors identifed 17 immune cell populations. Nine immune cell populations comprised myeloid cells, including vascular-related microglia, three perivascular macrophage (pvMf) subpopulations, conventional dendritic cells, and three monocyte subpopulations. Eight lymphocyte populations were identifed: $CD4+T$ cells, two $CD8+T$ cell subpopulations, regulatory T cells, NK cells, B cells, plasmacytoid dendritic cells, and a dividing lymphocyte population comprising Treg cells. Resident pvMfs were the most abundant immune cell population, accounting for 31.2% and 28.3% of the immune cells in the control and BAVM groups, respectively. More than 90% of the circulating immune cells (such as $CD8 + T$ cells) in BAVMs are confned to the resting brain vessels (Winkler et al. [2022](#page-15-26)).

Other similar cerebrovascular diseases

In the cerebrovascular system, some diseases share pathological features similar to BAVM, such as cavernous malformations (CCMs) and venous malformations (Venugopal and Sumi [2022\)](#page-15-27). BAVM is a vascular abnormality characterized by abnormal arteriovenous connections and the absence of normal capillary beds. CCM consists of multiple dilated blood vessel abnormalities. Venous malformations are vascular abnormalities characterized by abnormally dilated veins. All three disorders can cause severe nerve damage such as brain hemorrhages and seizures (Venugopal and Sumi [2022\)](#page-15-27). Venous malformations are an acquired disease. BAVM and CCM are sporadic and hereditary, and familial CCM is often associated with mutations in the CCM1 (KRIT1), CCM2, and CCM3 genes (Spiegler et al. [2018](#page-14-28)). Previous studies reported that mutations at multiple sites were associated with higher risk factors for BAVM and CCM. BAVM-related genes such as IL-6, VEGFA, and ENG may also afect the pathophysiological mechanism of CCM through infammatory response, angiogenesis, etc. (Kar et al. [2018](#page-13-32)). The animal models constructed by the two through gene knockout can also be mutually pathologically verifed

(Sati et al. [2021](#page-14-29)). Recently, it has been reported that there are somatic mutations in genes such as *PIK3CA* and *MAP3K3* in CCM tissues (Hong et al. [2021](#page-12-31)). These genes are key genes in the PI3K, mTOR and ERK pathways, which can alter the activity of endothelial cells and lead to abnormal arteriovenous angiogenesis (Huo et al. [2023](#page-13-33); Weng et al. [2021](#page-15-28); Ren et al. [2023\)](#page-14-30). Interestingly, *KRAS* and *BRAF* mutations in BAVM tissues have also been reported to be involved in vascular pathology through PI3K, mTOR and ERK pathways (Nikolaev et al. [2018;](#page-14-5) Fish et al. [2020](#page-12-22)). At the same time, somatic mutations in genes such as *KRAS/BRAF*, *PIK3CA*, and *MAP3K3* have also been widely reported to be present in the pathogenesis of various tumors (Nakayama et al. [2017](#page-14-31); Yu et al. [2020\)](#page-15-29). This may be because the pathogenesis of some tumors has some common factors with the pathology of cerebrovascular system disorders (Dardiotis et al. [2019](#page-12-32)). Therefore, starting from the common factors of these basic biological mechanisms, developing clinical treatment strategies may have better value for the molecular mechanism research and clinical drug development of BAVM.

Conclusions

Most BAVMs are currently treated with surgical intervention or observation, and recurrence is possible after surgery. Currently, there are no specifc drugs for BAVMs, and clinical biomarkers for their formation, hemorrhage, and recurrence are lacking. Investigating the genetic and epigenetic mechanisms underlying BAVMs can provide novel directions for preventing the development of BAVMs, hemorrhage, and postoperative recurrence. Although some possible biomarkers of elevated biological or epigenetic markers in the clinical tissues and blood samples of patients with BAVMs have been identified, our understanding of how they affect BAVMs remains limited. Importantly, these markers provide a direction for future research. Several studies and reviews on the impact of miRNAs in non-coding RNA on BAVMs have been conducted; however, limited research is available on m6A methylation, lncRNA, ceRNA, and other factors, warranting further exploration.

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Declarations

Conflict of interest The authors have not disclosed any competing interests.

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