RAPOSO Nicolas (Orcid ID: 0000-0002-9152-4445) Seiffge David J (Orcid ID: 0000-0003-3890-3849)

Li Qi (Orcid ID: 0000-0002-9144-148X)

Shoamanesh Ashkan (Orcid ID: 0000-0002-2802-1626) Klijn C.J.M. JM (Orcid ID: 0000-0002-8495-4578)

CLAS-ICH / Page |

A Causal Classification System for Intracerebral Hemorrhage subtypes (CLAS-ICH)

Nicolas Raposo, MD, PhD^{1,2}, Maria Clara Zanon Zotin, MD^{3,4}, David J. Seiffge, MD⁵, Qi Li, MD, PhD⁶, Martina B. Goeldlin, MD^{5,7}, Andreas Charidimou, MD, PhD³, Ashkan Shoamanesh, MD⁸, Hans Rolf Jäger, MD, FRCP⁹, Charlotte Cordonnier, MD, PhD¹⁰, Catharina JM Klijn, MD, PhD¹¹, Eric E. Smith, MD, MPH¹², Steven M. Greenberg, MD, PhD³, David J. Werring, MD, PhD⁹, Anand Viswanathan, MD, PhD³

Corresponding Author: Nicolas Raposo, MD, PhD

Service de Neurologie, Hôpital Pierre-Paul Riquet, Centre Hospitalier Universitaire de Toulouse, Place Baylac, 31059 Toulouse Cedex 9, France

Phone: +33 (0)5 61 77 76 40 E-mail: raposo.n@chu-toulouse.fr

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¹ Department of neurology, Centre Hospitalier Universitaire de Toulouse, Toulouse, France

²Toulouse NeuroImaging Center, Université de Toulouse, Inserm, UPS, France

³ Stroke Research Center, Massachusetts General Hospital, Harvard Medical School, Boston, MA, USA

⁴ Center for Imaging Sciences and Medical Physics, Department of Medical Imaging, Hematology and Clinical Oncology, Ribeirão Preto Medical School, University of São Paulo, Ribeirão Preto, SP, Brazil.

⁵ Department of Neurology, Inselspital, Bern University Hospital, University of Bern, Bern, Switzerland

⁶ Department of Neurology, The First Affiliated Hospital of Chongqing Medical University, Chongqing 400016, China.

⁷ Graduate School for Health Sciences, University of Bern, Bern, Switzerland

⁸ Division of Neurology, Population Health Research Institute, McMaster University, Hamilton, ON, Canada

⁹ Stroke Research Centre, Department of Brain Repair and Rehabilitation, UCL Queen Square Institute of Neurology, London, UK.

¹⁰ Univ. Lille, Inserm, CHU Lille, U1172 - LilNCog - Lille Neuroscience & Cognition, F-59000 Lille, France

¹¹ Department of Neurology, Donders Institute for Brain, Cognition and Behaviour, Radboud University Medical Centre, Nijmegen, The Netherlands.

¹² Department of Clinical Neurosciences, Hotchkiss Brain Institute, University of Calgary, Alberta, Canada

Figures: 2

Tables: 6

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2. What is the current knowledge on the topic? (one to two sentences)

Determining the underlying causes of intracerebral hemorrhage (ICH) is of major importance because risk factors, prognosis and management differ by ICH subtype. To date, there is no consensus on the optimal causal classification system for ICH subtypes although a few algorithms for classifying ICH causes have been previously proposed.

3. What question did this study address? (one to two sentences)

We developed a new causal classification system for ICH Subtypes – termed CLAS-ICH – based on recent advances in neuroimaging, defining 5 ICH subgroups: (A) Arteriolosclerosis, (C) Cerebral Amyloid Angiopathy (CAA), (M) Mixed cerebral small vessel disease (SVD; potential arteriolosclerosis/CAA combination), (O) Other rare forms of SVD (genetic SVD and others), (S) Secondary Causes (macrovascular causes, brain tumour and other defined rare causes). Every patient is scored in each category according to the level of diagnostic evidence: (1) well-defined ICH subtype; (2) possible underlying disease; (0) no evidence of the disease.

4. What does this study add to our knowledge? (one to two sentences)

CLAS-ICH is a novel causal classification for ICH subtype, which is simple to apply and based on validated neuroimaging markers. In this study, ICH phenotyping using CLAS-ICH offers several advantages including high inter-observer agreement, detection of a well-defined cause in 65% of patients, and the ability to capture the overlap between ICH causes, as well as the level of diagnostic evidence.

5. How might this potentially impact on the practice of neurology? (one to two sentences)

ICH is a heterogeneous disease with various causes that can coexist in a given patient. CLAS-ICH may guide clinicians to identify causes of ICH, and improve ICH classification in multicenter studies.

ABSTRACT:

Objective: Determining the underlying causes of intracerebral hemorrhage (ICH) is of major importance because risk factors, prognosis and management differ by ICH subtype. We developed a new causal classification system for ICH Subtypes – termed CLAS-ICH – based on recent advances in neuroimaging.

Methods: CLAS-ICH defines 5 ICH subtypes: Arteriolosclerosis, Cerebral Amyloid Angiopathy (CAA), Mixed small vessel disease (SVD), Other rare forms of SVD (genetic SVD and others), Secondary Causes (macrovascular causes, tumour and other rare causes). Every patient is scored in each category according to the level of diagnostic evidence: (1) well-defined ICH subtype; (2) possible underlying disease; (0) no evidence of the disease. We evaluated CLAS-ICH in a derivation cohort of 113 patients with ICH from Massachusetts General Hospital, Boston (USA) and in a derivation cohort of 203 patients from Inselspital, Bern (Switzerland).

Results: In the derivation cohort, a well-defined ICH subtype could be identified in 74 (65.5%) patients, including 24 (21.2%) with Arteriolosclerosis, 23 (20.4%) with CAA, 18 (15.9%) with mixed SVD, and 9 (8.0%) with a secondary cause. One or more possible causes were identified in 42 (37.2%) patients. Inter-observer agreement was excellent for each category (kappa value ranging from 0.86 to 1.00). Despite substantial differences in imaging modalities, we obtained similar results in the validation cohort.

Interpretation: CLAS-ICH is a simple and reliable classification system for ICH subtyping, that captures overlap between causes and the level of diagnostic evidence. CLAS-ICH may guide clinicians to identify ICH causes, and improve ICH classification in multicenter studies.

INTRODUCTION

Spontaneous (i.e. non-traumatic) intracerebral hemorrhage (ICH), affecting more than 3 million people worldwide each year, ¹ is the most severe stroke subtype with high risk of death, ² dependence³ and dementia. ^{4, 5} ICH is a heterogeneous cerebrovascular disease with diverse range of conditions and more than 30 known potential causes. ^{6, 7} Determining underlying causes of ICH is of major importance because risk factors, mechanisms, prognosis and management differ by ICH subtype.

Etiological classification systems have been shown to be useful in patients with ischemic stroke in clinical routine practice (enabling individualized stroke risk estimation and targeted treatment regimens based on the stroke subtype) as well as in clinical research (well-phenotyped cohorts for epidemiological studies and clinical trials). 8-10 Subtyping ICH must face many challenges including lack of standardized etiological workup, variable levels of diagnostic certainty and possible co-occurrence of multiple causes. To date, there is no consensus on the optimal causal classification system for ICH subtypes although a few algorithms for classifying ICH causes have been previously proposed. 11, 12 In the current study, we aimed to develop a causal CLASsification system for ICH Subtypes (CLAS-ICH), based on the most recent advances in neuroimaging, ICH epidemiology and cerebral small vessel disease (SVD) phenotyping, defining ICH subgroups with presumed similar pathogenesis and prognosis, with potential clinical relevance for specific acute and preventive management strategies. We sought to design a classification system that may guide clinicians in determining the underlying cause of ICH and in providing urgent specific cares. At the same time, the classification tool can be useful for researchers in defining well-phenotyped ICH subtypes for epidemiological and clinical studies.

METHODS

In 2019, we drafted a proposal which aimed to develop a novel causal classification system for ICH subtypes. We invited experts from various countries in Europe, America and Asia to participate in an international collaborative effort. Our core group included experts in neurology, stroke, neuroimaging, neuroepidemiology, cerebral SVD and ICH. We critically reviewed pre-existing causal ICH classification systems in the context of the most recent advances in ICH epidemiology and neuroimaging. We searched PubMed without language restriction for publications regarding causal ICH classification systems published from inception up to June 10, 2019. We used the search terms "intracerebral hemorrhage" or "intracranial hemorrhage" AND "cause" or "etiology" AND "classification" or "system" or "classification system". Based on the strengths and weakness of previous systems, we identified key principles and developed a new classification system for ICH subtypes, through call meetings. We provided clinical and imaging clues to guide etiologic investigations. We tested the inter-observer reliability of the classification system in a single center cohort of consecutive patients with acute spontaneous ICH.

Rationale for a new ICH subtype classification system

Spontaneous ICH have numerous potential causes, most often cerebral small vessel disease (SVD) and macrovascular structural lesions.^{6,7} Since there is no consensus on an etiologic classification system, ¹³ prevalence of each ICH cause remains uncertain. Spontaneous ICH are usually categorized as (1) primary ICH when ICH is caused by the rupture of small brain vessels damaged by different forms of SVD, or (2) secondary ICH when the bleeding is caused by structural brain vascular malformation, brain tumor, inherent coagulopathy, or other rare diseases.¹⁴ It is widely accepted that SVD are the main causes, accounting for around 80 % of spontaneous ICH.^{6,7} This large ICH subgroup includes mainly two sporadic age-related SVDs: arteriolosclerosis - also called hypertensive angiopathy or deep perforator arteriopathy - and sporadic cerebral amyloid angiopathy (CAA).^{15, 16} Other rare forms comprise inherited (such as familial CAA, CADASIL or COL4A1 mutations) and

infrequent sporadic SVD (post-radiation angiopathy).¹⁷ Secondary causes account for around 20% of spontaneous ICH, even if this proportion may vary according to the study population. A macrovascular structural lesion, such as arteriovenous malformation, dural arteriovenous fistula or cerebral cavernous malformation has been reported in 15-23% of adults with ICH¹⁸⁻²⁰ and brain tumors in less than 5%.²¹ Other various ICH causes (cerebral venous thrombosis, reversible cerebral vasoconstriction syndrome, posterior reversible encephalopathy syndrome [PRES], moya-moya, etc.) occur more rarely.

To date, a few anatomical ICH classification systems have been proposed²² and only two causal ICH classification systems have been previously published. The SMASH-U classification system was proposed in 2012 to provide a simple and practical clinical classification for the etiology of ICH.¹¹ The authors used a retrospective registry of consecutive patients (n=1013) with ICH from the Helsinki University Central Hospital to apply the etiologic classification system. An elimination strategy algorithm was used to assign one exclusive ICH cause among the following 6 categories: structural lesion (S), medication (M), amyloid angiopathy (A), systemic/other disease (S), hypertension (H), undetermined (U).

A second classification system, named H-ATOMIC, has been more recently developed and applied in a prospective multicenter cohort study in Spain (n=439).¹² H-ATOMIC includes 7 ICH categories: arterial hypertension (H), cerebral amyloid angiopathy (A), tumor (T), oral anticoagulants (O), arteriovenous malformations and cavernoma (M), infrequent causes (I), and cryptogenic (C). The rater scores each category according to the degree of diagnostic certainty: (1) Definite; (2) Probable; (3) Possible. Strengths and weakness of each classification system are summarized in Table 1.

A novel Causal Classification System for ICH subtypes: CLAS-ICH

Key principles for the classification system

- (1) The new classification system is an imaging-based classification for ICH etiology (or etiologies) using validated neuroimaging biomarkers of small vessel and macrovascular pathologies rather than risk factors. Oral anticoagulants (OAC) are considered as an important risk factor for ICH but not as a direct cause.^{23, 24}
- (2) The new classification is a comprehensive classification system that applies to all subtypes of spontaneous (i.e. non-traumatic) ICH, that must be distinguished from ischemic stroke (brain imaging) and traumatic ICH (major head trauma <24 hours of symptom onset causing loss of consciousness and thought to be sufficient to have caused the intracerebral bleeding).
- (3) ICH subgroups of the classification system include the main known causes of ICH and recognize that SVD and structural macrovascular lesions are predominant causes.
- (4) ICH subgroups of the classification system are based on the premise that pathogenesis, prognosis, or both, differ by ICH subtypes, and might thus affect the management strategies.
- (5) The classification system recognizes that patients can have multiple potential causes of ICH, particularly presumed "mixed" small vessel disease (i.e. potential arteriolosclerosis/CAA combination). Instead of selecting only the single most likely cause of ICH (which may be subject to interpretation), the classification system should also allow overlap between ICH subtypes.
- (6) When identifying ICH subtype, the level of diagnostic certainty might be affected by different factors including etiologic workup completeness, imaging parameters and image quality.

 Neuroimaging investigation modalities (e.g. CT vs. MRI) for evaluating ICH may also vary across centers and countries. The classification system should capture the level of diagnostic evidence and the work-up quality.

ICH subtypes of CLAS-ICH

The new classification system – termed *CLAS-ICH (Causal CLASsification system for ICH Subtypes)* – defines 5 ICH subtypes, representative of the main causes of spontaneous ICH (Fig 1 & Table 2).

These 5 ICH categories include: (A) Arteriolosclerosis, (C) Cerebral Amyloid Angiopathy, (M) Mixed Cerebral Small Vessel Diseases, (O) Other rare forms of Cerebral Small Vessel Disease, (S) Secondary Causes (Table 3).

Level of diagnostic evidence and evaluation of workup quality

Every patient is scored in each of the main ICH categories according to the level of diagnostic evidence: (1) well-defined ICH subtype; (2) possible underlying disease; (0) absence of evidence of the disease that may have caused ICH. Clinical and imaging criteria to define well-defined ICH subtype are pre-specified. When available, we used validated diagnostic criteria, such as the modified Boston criteria for CAA.²⁵ The level of diagnostic evidence is considered as "possible" in patients who have imaging markers or clues suggesting the presence of an underlying disease without enough criteria for "well-defined" ICH subtype. When a patient cannot be scored in an ICH category because etiological investigations are insufficient, a score (9) for insufficient workup is given.

Inter-observer reliability

We determined the inter-observer reliability of the classification system. Two stroke neurologists (DJS and NR) independently performed subtype classification using CLAS-ICH in a derivation cohort and an external validation cohort. Our derivation cohort included 113 consecutive patients admitted at Massachusetts General Hospital (MGH), Boston (USA) for spontaneous ICH between May, 2017 and August, 2019. In the validation cohort, we enrolled 203 consecutive patients with acute ICH admitted at the Inselspital, Bern (Switzerland) between July, 2018 and December, 2019. The study was performed with approval of the appropriate local review boards. Informed consent was not required due to the retrospective observational design of the study.

Each observer reviewed extracted data from medical records. Data extraction was performed by two investigators (MCZ in the derivation cohort; MBG in the validation cohort) who did not participate in case assessments. Extracted data included age, sex, medical history and medication, brain imaging modalities (non-contrast CT [NCCT]; Magnetic Resonance Imaging [MRI]) and results (acute ICH location categorized as lobar [affecting the cortex or subcortical white matter], deep [affecting the thalamus, basal ganglia or brainstem] or cerebellar²⁶; presence and location of chronic ICH or cerebral microbleeds [CMBs]; presence of cortical superficial siderosis [cSS]; presence of severe [Fazekas 3] white matter hyperintensities [WMH], presence of lacunes; neuroimaging markers of SVD were assessed according to the STandards for Reporting Vascular changes on nEuroimaging [STRIVE]²⁷), vascular brain imaging modalities (CT angiography [CTA]; MR angiography [MRA]; intraarterial digital subtraction angiography [DSA]) and results, blood tests, and other specific investigations. Each observer was provided with a copy of the classification system and was asked to strictly apply related rules (Table 2 and 3). We also evaluated the inter-observer agreement of other pre-existing classification systems (SMASH-U and H-ATOMIC) in the derivation cohort. The interobserver reliability was evaluated using the κ statistic. A κ of 1 indicates perfect agreement, whereas zero shows only chance agreement; in general, excellent agreement refers to values greater than 0.80, whereas 0.61 to 0.80 indicates substantial agreement, and 0.41 to 0.60 indicates moderate agreement.

RESULTS

The demographics and baseline characteristics of patients in the derivation cohort (n=113) and in the validation cohort (n=203) are shown in Table 4. The mean (SD) age of included patients was 74.7 (11.5) years in the derivation cohort, and 73.3 (12.2) years in the validation cohort. Vascular risk factors and anticoagulant use were more common in the derivation cohort. The distribution of ICH locations was comparable across the study cohorts. Brain imaging was performed in all patients using brain NCCT for 80.7% (n=255) and/or brain MRI for 56.3% (n=178) of the cohorts. Angiography was obtained to evaluate underlying vascular causes using CTA (n=188, 59.5%), MRA (n=59, 18.7%), and/or DSA (n=18, 5.7%) based on clinical judgment. There were substantial differences in imaging modalities between the two cohorts. A total of 79 (69.9%) patients from the derivation cohort were evaluated with brain MRI compared to 99 (48.8%) in the validation cohort. CTA and MRA were also more frequently obtained in the derivation cohort than in the validation cohort.

ICH subtypes

Using CLAS-ICH system, a well-defined ICH subtype was identified in 74 of 113 (65.5%) patients in the derivation cohort, and 130 of 203 (64.0%) patients in the validation cohort (p = 0.797). In the derivation cohort, arteriolosclerosis (n=24; 21.2%), CAA (n=23; 20.4%), and mixed SVD (n=18; 15.9%) were the most common well-defined ICH subtypes, followed by secondary causes (n=9; 8.0%). Structural macrovascular lesions (n=3) and cerebral venous thrombosis (n=3) were the most frequent well-defined secondary causes. The distribution of well-defined ICH subtypes was comparable in the validation cohort. In the derivation cohort, one or more possible underlying disease(s) were identified in 42 (37.2%) patients, and 36 (31.9%) had multiple possible causes. These proportions were similar in the validation cohort. Within the whole population (derivation and validation cohorts), none of the patients presented with a non-traumatic ICH without any well-defined (level 1) or possible (level 2) underlying disease.

Overlap between ICH subtypes

In the derivation cohort, 36 (31.9%) patients had multiple possible causes (level 2) of ICH (Fig 2). The most frequent overlapping was observed in patients with possible secondary cause who had a possible other cause including possible arteriolosclerosis (n=16), possible CAA (n=15) or possible mixed SVD (n=1). Overlapping was also observed in 4 patients with possible CAA and possible mixed SVD.

Interobserver reliability

There was excellent agreement for ICH phenotyping using CLAS-ICH. The κ value (95% confidence interval) for each category ranged from 0.86 (0.78-0.95) to 1.00 (1.00-1.00) in the derivation cohort, and from 0.91 (0.86-0.96) to 1.00 (1.00-1.00) in the validation cohort (Table 5). In the derivation cohort, ICH subtyping using other classification systems showed higher variability in the inter-observer agreement. The κ value (95% confidence interval) for each category ranged from 0.71 (0.41-1.00) to 1.00 (1.00-1.00) when using SMASH-U, and from 0.39 (-0.15-0.93) to 1.00 (1.00-1.00) when using H-ATOMIC (Table 6).

DISCUSSION

We developed a novel causal classification system for ICH subtyping – termed CLAS-ICH –which is simple to apply and based on validated neuroimaging markers. In addition to its excellent interobserver reliability, ICH phenotyping using CLAS-ICH in unselected hospital-based cohorts revealed several advantages. This classification system could determine a well-defined ICH subtype in more than 65% of all ICH cases. When a well-defined ICH subtype was not identified, all other patients had one or more possible cause(s), which may guide clinicians for further investigations. Face validity for CLAS-ICH is provided by the finding that SVD (including arteriolosclerosis, CAA, but also mixed SVD) are the most frequent causes of non-traumatic ICH in the cohort used to test the system. Finally, CLAS-ICH offers the possibility to capture potential overlap between ICH causes, as well as the level of diagnostic evidence.

CLAS-ICH is an imaging-based classification system for ICH. Compared to other ICH classification systems that categorize ICH subgroups based on risk factors such as hypertension or oral anticoagulant use, ^{11, 12} CLAS-ICH considers that a pathological process directly or indirectly affecting the cerebral vasculature (i.e. cerebral small vessel disease, vascular malformation, brain tumour, cerebral venous thrombosis) is necessary to cause a brain hemorrhage. CLAS-ICH includes evidence derived from comprehensive imaging of the brain parenchyma and intracranial vessels. Assignment to each ICH subgroup relies on the evidence of presumed or validated neuroimaging markers that characterize this subgroup. This may explain substantial differences in ICH subtyping using CLAS-ICH compared to other systems. In our cohort, based on SMASH-U and H-ATOMIC system, anticoagulants were considered as the cause of ICH in one third of patients, whereas CLAS-ICH considers anticoagulant as a risk factor and not as a cause. Moreover, 15% of our cohort classified as mixed hemorrhage using CLAS-ICH are not considered in other classification systems.

CLAS-ICH defines 5 ICH subgroups that are representative of the most frequent causes of spontaneous ICH. Cerebral SVD subgroups are the most common categories in this causal classification system (4 of 5 categories) because they are the main causes of ICH. In our study, SVD – including arteriolosclerosis, CAA and mixed SVD - accounted for more than 85% of all well-defined ICH subtypes. Arteriolosclerosis and CAA are two key ICH subtypes of CLAS-ICH, characterized by different underlying pathological lesions, risk factors, and outcome. CLAS-ICH also consider two additional important ICH subgroups (i.e. "mixed" and "other" forms of SVD) that were not considered in pre-existing ICH classifications, although these groups remain likely to be associated with SVD. Recent advances in pathology and neuroimaging suggest that CAA and arteriolosclerosis often cooccur in aging populations. ^{28, 29} The resulting imaging feature of these patients combining imaging markers of CAA (lobar ICH / CMBs) and arteriolosclerosis (deep ICH / CMBs), often termed "mixed hemorrhages" is commonly encountered in patients with ICH.³⁰⁻³² These cases, which do not fulfill the criteria for "pure" arteriolosclerosis or "pure" CAA are likely to relate to a combination of these two diseases and are categorized in CLAS-ICH as mixed SVD. Other rare forms of SVD, including genetic SVD (e.g. COL4A1, CADASIL) are also considered in CLAS-ICH. The last category of CLAS-ICH secondary causes - accounting for 12% of well-defined ICH subtypes in our cohort, comprises structural macrovascular lesions and other rare causes of ICH. Although it might seem quite heterogeneous, this latest ICH subgroup includes ICH cases requiring specific etiological workup and treatment, compared to SVD-related ICH.

The philosophy of CLAS-ICH is analogous to the ASCOD classification for ischemic stroke subtyping.

Instead of selecting one single ICH cause which is thought to be more likely linked to ICH (elimination strategy applied in SMASH-U classification), CLAS-ICH evaluates all potential underlying causes in a given patient and captures the overlap between ICH subgroups. Our findings demonstrated that overlaps between ICH subtypes primarily concern "possible" secondary causes with "possible" DPA or CAA. This has important clinical relevance suggesting that in the absence of other marker of SVD, a

secondary cause should be sought in patients with a single lobar or single deep ICH despite normal first-line investigations.

Another important difference between CLAS-ICH and previous ICH classification systems is the absence of "cryptogenic" or "undetermined" ICH subgroups. These are default categories, which are difficult to define. The concept of "cryptogenic" ICH may lead clinicians to consider that some ICH can occur without any underlying vascular disease. Using CLAS-ICH, such hemorrhages are classified as one (or multiple) "possible underlying cause(s)" based on patient's age, ICH location and other imaging findings. This information is useful for clinicians and can guide further etiological investigations and/or repeated neuroimaging to determine a definite cause, instead of accepting a final diagnosis of "cryptogenic ICH".

Another strength of CLAS-ICH is that this classification system is quite simple and fast to apply, based on imaging markers that are routinely collected in daily practice. Each ICH case is graded in all potential ICH subtypes instead of selecting the most likely cause (that may be interpretative and source of inter-observer variability). Accordingly, CLAS-ICH has shown to classify ICH subtypes accurately with high inter-observer reliability, and less variability in inter-observer agreement than other systems. Defining ICH subgroups can have different purposes such as patient's selection for clinical trial, providing well-phenotyped ICH cohorts for epidemiological studies, patients prognostication, and identifying ICH subgroups requiring specific therapies in routine clinical practice. Similarly to causative classification systems developed for subtyping ischemic stroke, we believe CLAS-ICH will help harmonize decision on ICH causes among physicians and to improve comparability among studies.

Our study has limitations. Brain imaging modalities may vary across centers, and MRI is sometimes contraindicated or not tolerated in patients with severe ICH. As this novel classification system was designed to be widely applicable to most patients with non-traumatic ICH, CLAS-ICH can be used in patients evaluated either with MRI or CT. We acknowledge that the ability of CLAS-ICH to determine

underlying cause of ICH might be affected by imaging modalities. However, despite substantial differences in imaging evaluation in our derivation and validation cohorts (70% vs 49% with available MRI), CLAS-ICH could determine a well-defined ICH subtype in 65% of cases in the derivation cohort, but also in the validation cohort. In the current version of CLAS-ICH, diagnosis of CAA was based on the modified Boston criteria (version 1.5) instead of the recently published Boston criteria V2.0,33 which were not available when we designed the structure of CLAS-ICH. Although Boston criteria V2.0 include additional MRI markers (such as centrum semi ovale enlarged perivascular spaces, or multispot WMH) compared to Boston criteria V1.5, these two versions have many similarities, and diagnosis of CAA in CLAS-ICH may also be made according to the Boston criteria V2.0. Nonetheless, CLAS-ICH should be updated and validated in the future to fit with the Boston criteria V2.0. We also might have considered the Edinburgh CT and genetic diagnostic criteria for CAA, which have shown high diagnostic accuracy in patients with large fatal lobar ICH. 34 Nonetheless, we did not include these CT-based criteria in the novel classification system because those require Apolipoprotein E (ApoE) genotyping (which is not performed in routine clinical practice in many centers), and the Edinburgh criteria have not been yet validated in ICH survivors. However, we may update CLAS-ICH and include the simplified Edinburgh criteria, 35 which have shown high diagnostic performance in patients with large ICH.

CONCLUSION

Advances in neuroimaging enable accurate ICH phenotyping but standardized etiological workup and validated causal classification system are needed. ICH is a heterogeneous disease with various causes that can coexist in a given patient. We believe that the novel CLAS-ICH system might be useful to fill this clinical and research need to guide clinicians in determining underlying cause(s) of ICH and provide appropriate treatment. As CLAS-ICH offers high inter-observer reliability in ICH subtyping,

this new classification system would also be widely used by researchers enabling the features of wellphenotyped ICH cohorts to be compare across study centers.

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Author Contributions

N.R. and A.V. contributed to study concept and design.

N.R., M.C.Z., D.J.S., Q.L., M.B.G., A.C., A.S., H.R.J., C.C., C.J.M.K., E.E.S., S.M.G., D.J.W., A.V. contributed to acquisition and analysis of data.

N.R. and A.V. contributed to drafting the manuscript and the figures.

Potential Conflicts of Interest

C.C. received research grants from the French ministry of health (PHRC) for the A3ICH and TICH3-Fr trials, and honoraria for lectures from Bristol Myers Squibb. Other co-authors have nothing to report.

Data Availability

The data of this study are available upon reasonable request

REFERENCES

- 1. Collaborators GBDS. Global, regional, and national burden of stroke and its risk factors, 1990-2019: a systematic analysis for the Global Burden of Disease Study 2019. Lancet Neurol. 2021 Oct;20(10):795-820.
- 2. van Asch CJ, Luitse MJ, Rinkel GJ, van der Tweel I, Algra A, Klijn CJ. Incidence, case fatality, and functional outcome of intracerebral haemorrhage over time, according to age, sex, and ethnic origin: a systematic review and meta-analysis. Lancet Neurol. 2010 Feb;9(2):167-76.
- 3. Roquer J, Rodriguez-Campello A, Jimenez-Conde J, et al. Sex-related differences in primary intracerebral hemorrhage. Neurology. 2016 Jul 19;87(3):257-62.
- 4. Moulin S, Labreuche J, Bombois S, et al. Dementia risk after spontaneous intracerebral haemorrhage: a prospective cohort study. Lancet Neurol. 2016 Jul;15(8):820-9.
- 5. Planton M, Saint-Aubert L, Raposo N, et al. High prevalence of cognitive impairment after intracerebral hemorrhage. PLoS One. 2017;12(6):e0178886.
- 6. Cordonnier C, Demchuk A, Ziai W, Anderson CS. Intracerebral haemorrhage: current approaches to acute management. Lancet. 2018 Oct 6;392(10154):1257-68.
- 7. Gross BA, Jankowitz BT, Friedlander RM. Cerebral Intraparenchymal Hemorrhage: A Review. JAMA. 2019 Apr 2;321(13):1295-303.
- 8. Adams HP, Jr., Bendixen BH, Kappelle LJ, et al. Classification of subtype of acute ischemic stroke. Definitions for use in a multicenter clinical trial. TOAST. Trial of Org 10172 in Acute Stroke Treatment. Stroke. 1993 Jan;24(1):35-41.
- 9. Amarenco P, Bogousslavsky J, Caplan LR, Donnan GA, Wolf ME, Hennerici MG. The ASCOD phenotyping of ischemic stroke (Updated ASCO Phenotyping). Cerebrovasc Dis. 2013;36(1):1-5.
- 10. Ay H, Furie KL, Singhal A, Smith WS, Sorensen AG, Koroshetz WJ. An evidence-based causative classification system for acute ischemic stroke. Ann Neurol. 2005 Nov;58(5):688-97.
- 11. Meretoja A, Strbian D, Putaala J, et al. SMASH-U: a proposal for etiologic classification of intracerebral hemorrhage. Stroke. 2012 Oct;43(10):2592-7.
- 12. Marti-Fabregas J, Prats-Sanchez L, Martinez-Domeno A, et al. The H-ATOMIC Criteria for the Etiologic Classification of Patients with Intracerebral Hemorrhage. PLoS One. 2016;11(6):e0156992.
- 13. Cordonnier C, Klijn CJ, van Beijnum J, Al-Shahi Salman R. Radiological investigation of spontaneous intracerebral hemorrhage: systematic review and trinational survey. Stroke. 2010 Apr;41(4):685-90.
- 14. Qureshi Al, Tuhrim S, Broderick JP, Batjer HH, Hondo H, Hanley DF. Spontaneous intracerebral hemorrhage. N Engl J Med. 2001 May 10;344(19):1450-60.
- 15. Charidimou A, Gang Q, Werring DJ. Sporadic cerebral amyloid angiopathy revisited: recent insights into pathophysiology and clinical spectrum. J Neurol Neurosurg Psychiatry. 2012 Feb;83(2):124-37.
- 16. Charidimou A, Boulouis G, Pasi M, et al. MRI-visible perivascular spaces in cerebral amyloid angiopathy and hypertensive arteriopathy. Neurology. 2017 Mar 21;88(12):1157-64.
- 17. Pantoni L. Cerebral small vessel disease: from pathogenesis and clinical characteristics to therapeutic challenges. Lancet Neurol. 2010 Jul;9(7):689-701.
- 18. Delgado Almandoz JE, Schaefer PW, Forero NP, Falla JR, Gonzalez RG, Romero JM. Diagnostic accuracy and yield of multidetector CT angiography in the evaluation of spontaneous intraparenchymal cerebral hemorrhage. AJNR Am J Neuroradiol. 2009 Jun;30(6):1213-21.
- 19. van Asch CJ, Velthuis BK, Rinkel GJ, et al. Diagnostic yield and accuracy of CT angiography, MR angiography, and digital subtraction angiography for detection of macrovascular causes of intracerebral haemorrhage: prospective, multicentre cohort study. BMJ. 2015 Nov 9;351:h5762.
- 20. Hilkens NA, van Asch CJJ, Werring DJ, et al. Predicting the presence of macrovascular causes in non-traumatic intracerebral haemorrhage: the DIAGRAM prediction score. J Neurol Neurosurg Psychiatry. 2018 Jul;89(7):674-9.

- 21. Licata B, Turazzi S. Bleeding cerebral neoplasms with symptomatic hematoma. J Neurosurg Sci. 2003 Dec;47(4):201-10; discussion 10.
- 22. Rannikmae K, Woodfield R, Anderson CS, et al. Reliability of intracerebral hemorrhage classification systems: A systematic review. Int J Stroke. 2016 Aug;11(6):626-36.
- 23. Dequatre-Ponchelle N, Henon H, Pasquini M, et al. Vitamin K antagonists-associated cerebral hemorrhages: what are their characteristics? Stroke. 2013 Feb;44(2):350-5.
- 24. Seiffge DJ, Wilson D, Ambler G, et al. Small vessel disease burden and intracerebral haemorrhage in patients taking oral anticoagulants. J Neurol Neurosurg Psychiatry. 2021 Mar 19.
- 25. Linn J, Halpin A, Demaerel P, et al. Prevalence of superficial siderosis in patients with cerebral amyloid angiopathy. Neurology. 2010 Apr 27;74(17):1346-50.
- 26. Charidimou A, Schmitt A, Wilson D, et al. The Cerebral Haemorrhage Anatomical RaTing inStrument (CHARTS): Development and assessment of reliability. J Neurol Sci. 2017 Jan 15;372:178-83.
- 27. Wardlaw JM, Smith EE, Biessels GJ, et al. Neuroimaging standards for research into small vessel disease and its contribution to ageing and neurodegeneration. Lancet Neurol. 2013 Aug;12(8):822-38.
- 28. Ritter MA, Droste DW, Hegedus K, et al. Role of cerebral amyloid angiopathy in intracerebral hemorrhage in hypertensive patients. Neurology. 2005 Apr 12;64(7):1233-7.
- 29. Schreiber S, Wilisch-Neumann A, Schreiber F, et al. Invited Review: The spectrum of agerelated small vessel diseases: potential overlap and interactions of amyloid and nonamyloid vasculopathies. Neuropathol Appl Neurobiol. 2020 Apr;46(3):219-39.
- 30. Pasi M, Charidimou A, Boulouis G, et al. Mixed-location cerebral hemorrhage/microbleeds: Underlying microangiopathy and recurrence risk. Neurology. 2018 Jan 9;90(2):e119-e26.
- 31. Blanc C, Viguier A, Calviere L, et al. Underlying Small Vessel Disease Associated With Mixed Cerebral Microbleeds. Front Neurol. 2019;10:1126.
- 32. Tsai HH, Pasi M, Tsai LK, et al. Microangiopathy underlying mixed-location intracerebral hemorrhages/microbleeds: A PiB-PET study. Neurology. 2019 Feb 19;92(8):e774-e81.
- 33. Charidimou A, Boulouis G, Frosch MP, et al. The Boston criteria version 2.0 for cerebral amyloid angiopathy: a multicentre, retrospective, MRI-neuropathology diagnostic accuracy study. Lancet Neurol. 2022 Aug;21(8):714-25.
- 34. Rodrigues MA, Samarasekera N, Lerpiniere C, et al. The Edinburgh CT and genetic diagnostic criteria for lobar intracerebral haemorrhage associated with cerebral amyloid angiopathy: model development and diagnostic test accuracy study. Lancet Neurol. 2018 Mar;17(3):232-40.
- 35. Schwarz G, Banerjee G, Hostettler IC, et al. MRI and CT imaging biomarkers of cerebral amyloid angiopathy in lobar intracerebral hemorrhage. Int J Stroke. 2022 Jan 7:17474930211062478.
- 36. Delgado Almandoz JE, Schaefer PW, Goldstein JN, et al. Practical scoring system for the identification of patients with intracerebral hemorrhage at highest risk of harboring an underlying vascular etiology: the Secondary Intracerebral Hemorrhage Score. AJNR Am J Neuroradiol. 2010 Oct;31(9):1653-60.

FIGURE LEGENDS

Figure 1. Examples of ICH subtyping using the CLAS-ICH system

Axial T2*-weighted gradient recalled echo (A, B, C) and fluid-attenuated inversion recovery (D) MRI sequences; Axial non-contrast CT (E, F). Every patient is scored in each ICH subgroup (Arteriosclerosis [A], Cerebral Amyloid Angiopathy [C], Mixed SVD [M], Other form of SVD [O], Secondary cause [S]) according to the level of diagnostic evidence: (1) well-defined ICH subtype; (2) possible underlying disease; (0) absence of evidence of the disease that may have caused ICH. (A) Deep left thalamic ICH with multiple strictly deep microbleeds (A1 C0 M0 O0 S0); (B) Left lobar ICH with multiple strictly lobar microbleeds and disseminated cortical superficial siderosis (A0 C1 M0 O0 S0); (C) Left lobar ICH with multiple hemorrhages (microbleeds and ICH) located both in lobar and deep regions of the brain (A0 C0 M1 O0 S0); (D) Single (i.e. without other hemorrhage) left lobar ICH with confluent WMH in a 68 years-old man, and normal MRA (A0 C2 M2 O0 S0); (E) Right lobar ICH with underlying arteriovenous malformation (A0 C0 M0 O0 S1); (F) Right lobar ICH without evidence of small vessel disease on CT and normal CTA in a 72 years-old woman (A0 C2 M0 O0 S2).

Figure 2. Overlap between ICH subtypes

Venn diagram showing overlap between ICH subtypes (level 1 or 2) included in CLAS-ICH

TABLE LEGENDS

Table 1. Characteristics of previous ICH classification systems

* SICH score = Secondary Intracerebral Hemorrhage score (ranging from 0 to 6).36

Table 2. CLAS-ICH classification system

* diagnosis of CAA is based on the modified Boston criteria (version 1.5).²⁵ Well-defined CAA (C1) would also include patients meeting criteria for probable CAA according to Boston criteria 2.0³³ or the simplified Edinburgh criteria for high probability of CAA.³⁵ Possible underlying CAA (C2) would also include patients meeting criteria for possible CAA according to Boston criteria 2.0³³ or medium probability of CAA according to the simplified Edinburgh criteria.³⁵

Abbreviations: CAA = cerebral amyloid angiopathy; CMB = cerebral microbleed; CSF = cerebrospinal fluid; cSS = cortical superficial siderosis; ICH = intracerebral hemorrhage; PET = positron emission tomography; SVD = small vessel disease; WMH = white matter hyperintensities

Table 3. Secondary causes of Intracerebral Hemorrhage

Table 4. Patient characteristics and distribution of ICH subtypes in the derivation and validation cohorts.

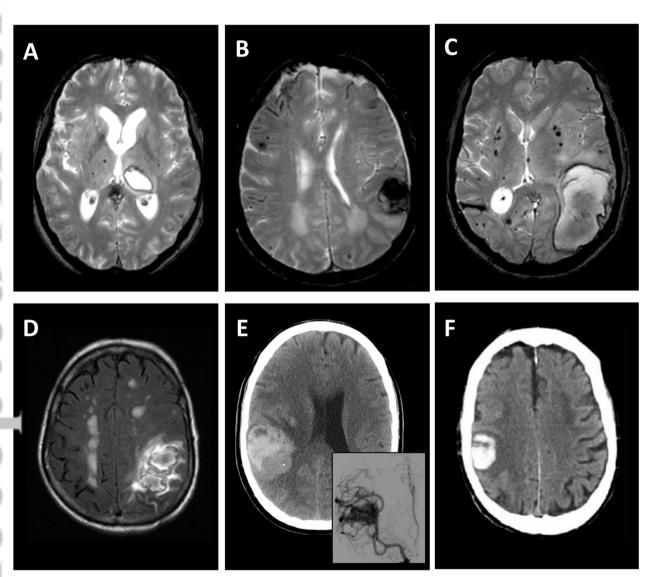
Abbreviations: CAA = cerebral amyloid angiopathy; CTA = Computed tomography angiography; DSA = digital subtraction angiography; ICH = intracerebral hemorrhage; MRA = Magnetic resonance angiography; MRI = Magnetic Resonance Imaging; NCCT = non-contrast Computed tomography; SVD = small vessel disease.

Table 5. Interobserver agreement for ICH phenotyping using CLAS-ICH in the derivation and validation cohorts.

Table 6. Distribution of ICH subtypes by classification system and interobserver agreement

Distribution of ICH subtypes within the derivation cohort (n=113) according to CLAS-ICH, H-ATOMIC and SMASH-U classification systems. * CLAS-ICH grade 1 is defined as a well-defined ICH subtype; † H-ATOMIC grade 1 is defined as a definite cause, and grade 2 as a probable cause.

Abbreviations: AVM = Arteriovenous malformation; CAA = cerebral amyloid angiopathy; SVD = small vessel disease.



ANA_26519_Figure 1.tif



ANA_26519_Figure 2.tif

Table 1. Characteristics of previous ICH classification systems

	SMASH-U	H-ATOMIC
	O-HCAIVIC	n-ATOWIC
Minimum etiologic workup	Not described	non-contrast head CT (MRI is an acceptable alternative) Blood tests Electrocardiogram and chest radiography CT-angio or other angiographic modalities (when SICH score* >2)
Decision algorithm to assign ICH cause(s)	Elimination strategy. Only 1 cause is allowed. In case of multiple cause, the rater should select the most likely cause.	More flexible strategy grading each ICH category. Allowing (theoretically) multiple causes. But an alternative cause is excluded in most definite causes
Criteria for each ICH category	Some ICH subgroups are based on validated imaging markers Others are based on risk factors which are not true causes (hypertension, anticoagulant use)	Some ICH subgroups are based on validated imaging markers Others are based on risk factors which are not true causes (hypertension, anticoagulant use)
Level of diagnostic evidence	Not captured	Diagnostic certainty is graded as: (1) definite (2) probable (3) possible
Inter- observer reliability	Very good (κ=0.89)	Good (κ=0.76)
Easy and fast to apply	+++	-

^{*} SICH score = Secondary Intracerebral Hemorrhage score (ranging from 0 to 6).³⁶

Table 2. CLAS-ICH classification system

A1- Well-defined	is (a) Pathologically-proven arteriolosclerosis on brain biopsy or autopsy or		
	(a) Pathologically-proven arterioloscierosis on brain blopsy or autopsy or (b) Multiple hemorrhages (including ICH and CMB) confined to the deep (basal ganglia, thalamu		
ICH subtype			
	brainstem) regions of the brain (cerebellar hemorrhages [ICH or CMB] allowed) or		
	(c) Single (without other ICH/CMB) deep ICH		
	- and evidence of severe (confluent) WMH and/or lacunes in the deep regions of the brain		
A2- Possible	Single (without other ICH/CMB) deep ICH		
underlying disease - and no evidence of severe (confluent) WMH and/or lacunes			
	- <i>and</i> absence of other well-defined cause of ICH		
A0- Absence of	MRI (or CT) does not show strictly deep hemorrhage(s) (ICH/CMB).		
evidence of the	Cases where there is both deep and lobar hemorrhages are classified as "Mixed SVD" (defined		
disease	below).		
A9- Insufficient	MRI (or CT) not available. MRI can detect CMB (unlike CT) and is preferable to evaluate imaging		
workup	markers suggesting the presence of arterioloclerosis. Non-contrast CT is an alternative imaging		
	when MRI is contraindicated, not tolerated or not available.		
(C) Cerebral Amyloi			
C1- Well-defined	(a) Pathologically-proven CAA on brain biopsy or autopsy or		
ICH subtype	(b) Multiple strictly lobar (cortical or corticosubcortical) hemorrhages, including ICH, CMB or cSS		
ісп зивтуре			
	(cerebellar hemorrhages [ICH or CMB] allowed)		
	- and age ≥ 55 years		
	- and absence of other well-defined cause of ICH		
C2- Possible	(a) Single strictly lobar (cortical or corticosubcortical) hemorrhages on MRI (or CT), including ICH,		
underlying disease	CMB or cSS		
	- <i>and</i> age ≥ 55 years,		
	- <i>and</i> absence of other well-defined cause of ICH		
C0- Absence of	Absence of pathological evidence of CAA.		
evidence of the	Neuroimaging does not show strictly lobar ICH/CMB nor cSS.		
disease	Cases where there is both deep and lobar hemorrhages are classified as "Mixed SVD" (defined		
	below).		
C9- Insufficient	MRI (or CT) not available. In the absence of pathological examination, MRI can detect CMB and cS		
workup	(unlike CT) and is preferable to rule out CAA. Non-contrast CT is an alternative imaging when MRI		
•			
-	contraindicated, not tolerated or not available.		
(M) Mixed Cerebral	contraindicated, not tolerated or not available. Small Vessel Diseases		
(M) Mixed Cerebral M1- Well-defined	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or		
(M) Mixed Cerebral	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in		
(M) Mixed Cerebral M1- Well-defined ICH subtype	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in lobar and deep regions (cerebellar hemorrhages [ICH or CMB] allowed)		
(M) Mixed Cerebral M1- Well-defined ICH subtype M2- Possible	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in lobar and deep regions (cerebellar hemorrhages [ICH or CMB] allowed) (a) Single (without other ICH/CMB/cSS) lobar ICH		
(M) Mixed Cerebral M1- Well-defined ICH subtype	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in lobar and deep regions (cerebellar hemorrhages [ICH or CMB] allowed) (a) Single (without other ICH/CMB/cSS) lobar ICH - and evidence of severe (confluent) WMH and lacunes		
(M) Mixed Cerebral M1- Well-defined ICH subtype M2- Possible	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in lobar and deep regions (cerebellar hemorrhages [ICH or CMB] allowed) (a) Single (without other ICH/CMB/cSS) lobar ICH - and evidence of severe (confluent) WMH and lacunes (b) Single (without other ICH/CMB/cSS) cerebellar ICH		
(M) Mixed Cerebral M1- Well-defined ICH subtype M2- Possible underlying disease	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in lobar and deep regions (cerebellar hemorrhages [ICH or CMB] allowed) (a) Single (without other ICH/CMB/cSS) lobar ICH - and evidence of severe (confluent) WMH and lacunes (b) Single (without other ICH/CMB/cSS) cerebellar ICH - and evidence of severe (confluent) WMH and lacunes		
(M) Mixed Cerebral M1- Well-defined ICH subtype M2- Possible	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in lobar and deep regions (cerebellar hemorrhages [ICH or CMB] allowed) (a) Single (without other ICH/CMB/cSS) lobar ICH - and evidence of severe (confluent) WMH and lacunes (b) Single (without other ICH/CMB/cSS) cerebellar ICH		
(M) Mixed Cerebral M1- Well-defined ICH subtype M2- Possible underlying disease	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in lobar and deep regions (cerebellar hemorrhages [ICH or CMB] allowed) (a) Single (without other ICH/CMB/cSS) lobar ICH - and evidence of severe (confluent) WMH and lacunes (b) Single (without other ICH/CMB/cSS) cerebellar ICH - and evidence of severe (confluent) WMH and lacunes		
(M) Mixed Cerebral M1- Well-defined ICH subtype M2- Possible underlying disease M0- Absence of	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in lobar and deep regions (cerebellar hemorrhages [ICH or CMB] allowed) (a) Single (without other ICH/CMB/cSS) lobar ICH - and evidence of severe (confluent) WMH and lacunes (b) Single (without other ICH/CMB/cSS) cerebellar ICH - and evidence of severe (confluent) WMH and lacunes MRI (or CT) does not show evidence of multiple ICH/CMB or other imaging markers of SVD		
(M) Mixed Cerebral M1- Well-defined ICH subtype M2- Possible underlying disease M0- Absence of evidence of the	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in lobar and deep regions (cerebellar hemorrhages [ICH or CMB] allowed) (a) Single (without other ICH/CMB/cSS) lobar ICH - and evidence of severe (confluent) WMH and lacunes (b) Single (without other ICH/CMB/cSS) cerebellar ICH - and evidence of severe (confluent) WMH and lacunes MRI (or CT) does not show evidence of multiple ICH/CMB or other imaging markers of SVD		
(M) Mixed Cerebral M1- Well-defined ICH subtype M2- Possible underlying disease M0- Absence of evidence of the disease	contraindicated, not tolerated or not available. Small Vessel Diseases (a) Pathologically-proven coexistence of arterioloclerosis and CAA on brain biopsy or autopsy or (b) Mixed hemorrhages: multiple brain hemorrhages (including ICH, CMB and cSS) located both in lobar and deep regions (cerebellar hemorrhages [ICH or CMB] allowed) (a) Single (without other ICH/CMB/cSS) lobar ICH - and evidence of severe (confluent) WMH and lacunes (b) Single (without other ICH/CMB/cSS) cerebellar ICH - and evidence of severe (confluent) WMH and lacunes MRI (or CT) does not show evidence of multiple ICH/CMB or other imaging markers of SVD including severe (confluent) WMH and lacunes		

^{*} diagnosis of CAA is based on the modified Boston criteria (version 1.5).²⁵ Well-defined CAA (C1) would also include patients meeting criteria for probable CAA according to Boston criteria 2.0³³ or the simplified Edinburgh criteria for high probability of CAA.³⁵ Possible underlying CAA (C2) would also include patients meeting criteria for possible CAA according to Boston criteria 2.0³³ or medium probability of CAA according to the simplified Edinburgh criteria.³⁵

(O) Other form of Co	erebral small vessel disease		
O1- Well-defined	(a) Inherited SVD (for example: familial forms of CAA, CADASIL, CARASIL, COL4A1 mutations)		
ICH subtype	confirmed with genetic testing		
icii subtype	(b) Well-demonstrated SVD that does not fulfill all criteria for other SVD subtypes. Example could		
	include patient with multiple strictly lobar hemorrhage (ICH/CMB/cSS) but age < 55 years		
	(c) other rare well-defined causes of SVD (for example post-radiation Angiopathy)		
O2- Possible	(a) Suspected inherited SVD not confirmed with genetic testing based on:		
underlying disease	- evidence of imaging markers of SVD including CMB, cSS, severe (confluent) WMH and/or		
	lacunes		
	- documented familial history of ICH		
O0- Absence of	MRI (or CT) does not show evidence imaging markers of SVD including CMB, cSS, severe		
evidence of the	(confluent) WMH and lacunes		
disease	Absence of evidence of genetic SVD		
	Absence of familial history of ICH		
O9- Insufficient	MRI (or CT) not available. MRI can detect CMB (unlike CT) and is preferable to rule out cerebral		
workup	small vessel disease. Non-contrast CT is an alternative imaging when MRI is contraindicated, not		
	tolerated or not available.		
(S) Secondary cause	s of ICH		
S1- Well-defined	Etiologic investigations have clearly demonstrated the presence of a secondary cause of ICH as		
ICH subtype	listed in Table 3.		
S2- Possible	Despite a complete workup, a definite secondary cause of ICH has not been demonstrated but		
underlying disease	remain highly suspected based on:		
	- the presence of imaging clues for a secondary cause (early draining vein,		
	disproportionate perihematomal edema)		
	- and/or age < 55 years		
	- and/or absence of imaging markers of SVD		
S0- Absence of	Negative investigations for a secondary cause. When suspected, ruling out a secondary cause may		
evidence of the	require: brain MRI, CT/MR angiography, intra-arterial digital subtraction angiography, venography,		
disease	body CT/PET, brain or extracerebral biopsy, blood tests, CSF tests		
S9- Insufficient	Unable to reasonably rule out a secondary cause based on the best available etiologic		
workup	investigations whereas it is suspected based on the clinical context or imaging findings (see Table 3)		

Abbreviations: CAA = cerebral amyloid angiopathy; CMB = cerebral microbleed; CSF = cerebrospinal fluid; cSS = cortical superficial siderosis; ICH = intracerebral hemorrhage; PET = positron emission tomography; SVD = small vessel disease; WMH = white matter hyperintensities

Table 3. Secondary causes of Intracerebral Hemorrhage

Category	Examples	Clinical and imaging clues
Macrovascular	- Brain arteriovenous malformation	- ICH lobar location, absence of SVD.
causes	(AVM)	- Extension to subarachnoid and subdural
	- Intracranial aneurysm	spaces, flow voids and calcifications along
	- Dural arteriovenous fistula	the hematoma (AVM).
	- Cavernous malformation (CM)	- Subarachnoid hemorrhage in the basal
		cisterns (intracranial aneurysm)
		- Subarachnoid or subdural extension
		and/or abnormal dilated cortical vessels (dural fistula)
		- Small, well-demarcated ICH with
		homogenous density on CT (often with
		heterogeneous intensity on MRI) and no
		extension to other brain compartments
		(CM). CM can occur anywhere in the
		brain, but should be particularly
		considered in ICH with the above
		characteristics isolated to the medulla or
		midbrain.
Brain tumour	- Primary tumour	- Clinical context (fatigue, unexplained
	- Metastasis	weight loss, anorexia, known solid
		cancer)
		- Pre-existing headache and other
		neurological symptoms
		- Disproportionate perihematomal edema
		- Active or history of malignancy that is
		reported to metastasize to the brain.
Hemostatic and	- Severe thrombocytopenia	- Abnormal platelet count or coagulation
hematologic	- Severe clotting factor deficiency such	tests
disorders	as hemophilia	
	- Afibrinogenemia	
	- Other	
Cerebral venous	- CVT from local cause (head trauma,	- Clinical context (pregnancy or
thrombosis	head and CNS infections, tumour)	puerperium, known prothrombotic
(CVT)	- CVT from systemic cause (pregnancy	disease, oral contraceptive use, fever,
	and puerperium, cancer,	etc.)
	prothrombotic disorder, etc.)	- Pre-existing headache- ICH location close to venous sinuses
		- Disproportionate perihematomal
		edema
Hemorrhagic	- Spontaneous hemorrhagic infaction	- Presence of acute moderate / large
infarction	- Hemorrhagic infarction occurring in	territorial infarcts adjacent to ICH or in
	patients receiving anticoagulant or	other arterial territories
	thrombolytic therapy	
Vasculitis and	- Primary Angiitis of the CNS	- Clinical context (valvular cardiopathy,
related	- Systemic vasculitis	fever, known systemic disease,
vasculopathies	- moyamoya	vasoactive medication or drug)

	- Reversible Cerebral Vasoconstriction	- Pre-exiting headache
	Syndrome	- Co-existence of acute ischemic lesions
	- Posterior reversible encephalopathy	- Cerebral microbleeds, mycotic
	syndrome	aneurysm (infective endocarditis)
	- Infective endocarditis, infections of	
	CNS	
	- Other vasculopathies	
Toxic	- Cocaine	- Clinical context
	- Other sympathomimetic drugs	- Laboratory tests
Rare entities	- Dissection of intracracranial arteries	- Clinical context (carotid endarterectomy
	- Hyperperfusion syndrome	or angioplasty, endovascular treatment)
	- Other	

Table 4. Patients characteristics and distribution of ICH subtypes in the derivation and validation cohorts.

	Derivation cohort (n=113)	Validation cohort (n=203)	p-value
Demographics and clinical data			
Age, mean (SD)	74.7 (11.5)	73.3 (12.2)	0.324
Female, n (%)	47 (41.6)	110 (54.2)	0.032
Hypertension, n (%)	100 (88.5)	154 (75.9)	0.007
Diabetes, n (%)	39 (34.5)	36 (17.7)	0.001
Anticoagulant use, n (%)	42 (37.2)	48 (23.6)	0.011
Imaging			
Location of index ICH			0.840
Lobar, n (%)	53 (46.9)	101 (49.8)	
Deep, n (%)	50 (44.2)	87 (42.9)	
Cerebellum, n (%)	10 (8.8)	15 (7.4)	
Brain NCCT performed, n (%)	113 (100)	142 (70.0)	<0.001
CTA performed, n (%)	95 (84.1)	93 (45.8)	<0.001
Brain MRI performed, n (%)	79 (69.9)	99 (48.8)	<0.001
MRA performed, n (%)	34 (30.1)	25 (12.3)	<0.001
DSA performed, n (%)	4 (3.5)	14 (6.9)	0.230
CLAS-ICH subtypes			
Well-defined cause (grade 1)	74 (65.5)	130 (64.0)	0.797
Arteriosclerosis (grade 1)	24 (21.2)	38 (18.7)	0.589
CAA (grade 1)	23 (20.4)	40 (19.7)	0.890
Mixed SVD (grade 1)	18 (15.9)	32 (15.8)	0.969
Other form of SVD (grade 1)	0 (0)	0 (0)	_
Secondary cause (grade 1)	9 (8.0)	20 (9.9)	0.577
Possible cause (grade 2)	42 (37.2)	73 (36.0)	0.831
Multiple causes (≥2 grades 1 or 2)	36 (31.9)	63 (31.0)	0.880
Absence of identified cause (grade 0 or 9)	0 (0)	0 (0)	_

Abbreviations: CAA = cerebral amyloid angiopathy; CTA = Computed tomography angiography; DSA = digital subtraction angiography; ICH = intracerebral hemorrhage; MRA = Magnetic resonance angiography; MRI = Magnetic Resonance Imaging; NCCT = non-contrast Computed tomography; SVD = small vessel disease.

Table 5. Interobserver agreement for ICH phenotyping using CLAS-ICH in the derivation and validation cohorts.

	Interobserver Agreement	
ICH subtypes	к value	95% Confidence Interval
Derivation cohort (n=113)		
Arteriosclerosis (A)	0.86	0.78-0.95
Cerebral Amyloid Angiopathy (C)	1.00	1.00-1.00
Mixed Cerebral Small Vessel Diseases (M)	0.93	0.85-1.00
Other form of Cerebral small vessel disease (O)	1.00	1.00-1.00
Secondary causes of ICH (S)	0.91	0.83-0.98
Validation cohort (n=203)		
Arteriosclerosis (A)	0.94	0.89-0.99
Cerebral Amyloid Angiopathy (C)	0.91	0.86-0.96
Mixed Cerebral Small Vessel Diseases (M)	0.87	0.80-0.94
Other form of Cerebral small vessel disease (O)	1.00	1.00-1.00
Secondary causes of ICH (S)	0.94	0.89-0.99

Table 6. Distribution of ICH subtypes by classification system and interobserver agreement

	n (%)	Interobserver agreement, к value (95% CI)
CLAS-ICH		
Arterioclerosis (grade 1*)	24 (21.2)	0.86 (0.78-0.95)
CAA (grade 1)	23 (20.4)	1.00 (1.00-1.00)
Mixed SVD (grade 1)	18 (15.9)	0.93 (0.85-1.00)
Other form of SVD (grade 1)	0 (0)	1.00 (1.00-1.00)
Secondary cause (grade 1)	9 (8.0)	0.91 (0.83-0.98)
Absence of identified cause (grade 0 or 9)	0 (0)	1.00 (1.00-1.00)
H-ATOMIC		
Hypertension (grade 1 or 2†)	29 (25.7)	0.90 (0.84-0.97)
CAA (grade 1 or 2)	20 (17.7)	0.97 (0.83-0.98)
Tumour (grade 1 or 2)	2 (1.8)	1.00 (1.00-1.00)
Oral anticoagulant (grade 1 or 2)	42 (37.2)	0.93 (0.85-1.00)
AVM / Cavernoma (grade 1 or 2)	2 (1.8)	1.00 (1.00-1.00)
Infrequent cause (grade 1 or 2)	4 (3.5)	0.74 (0.53-0.95)
Cryptogenic	4 (3.5)	0.39 (-0.15-0.93)
SMASH-U		
Structural vascular lesion	6 (5.3)	1.00 (1.00-1.00)
Medication	38 (33.6)	1.00 (1.00-1.00)
CAA	30 (26.5)	0.89 (0.79-0.98)
Systemic disease	1 (0.9)	1.00 (1.00-1.00)
Hypertension	31 (27.4)	0.96 (0.89-1.00)
Undetermined	4 (3.5)	0.71 (0.41-1.00)

Distribution of ICH subtypes within the derivation cohort (n=113) according to CLAS-ICH, H-ATOMIC and SMASH-U classification systems. * CLAS-ICH grade 1 is defined as a well-defined ICH subtype; † H-ATOMIC grade 1 is defined as a definite cause, and grade 2 as a probable cause.

Abbreviations: AVM = Arteriovenous malformation; CAA = cerebral amyloid angiopathy; SVD = small vessel disease.