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Determining clinical disease progression in symptomatic patients with CADASIL

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Group Authorship: No. There is no study group involved in our research **Group Name:**

Contributions:

Sofia Kaisaridi: Drafting/revision of the manuscript for content, including medical writing for content; Study concept or design; Analysis or interpretation of data; Dominique Herve: Major role in the acquisition of data; Study concept or design; Aude Jabouley: Major role in the acquisition of data; Analysis or interpretation of data; Sonia Reyes: Major role in the acquisition of data; Analysis or interpretation of data; Carla Machado: Major role in the acquisition of data; Analysis or interpretation of data; Stéphanie Guey: Major role in the acquisition of data; Analysis or interpretation of data; Abbas Taleb: Major role in the acquisition of data; Analysis or interpretation of data; Fanny Fernandes: Major role in the acquisition of data; Analysis or interpretation of data; Hugues Chabriat: Drafting/revision of the manuscript for content, including medical writing for content; Major role in the acquisition of data; Study concept or design; Analysis or interpretation of data; Sophie Tezenas Du Montcel: Drafting/revision of the manuscript for content, including medical writing for content; Study concept or design; Analysis or interpretation of data; Study concept or data; Abstract: Background and Objectives: Cerebral Autosomal Dominant Arteriopathy with Subcortical Infarcts and Leukoencephalopathy (CADASIL) is the most frequent small artery brain disease caused by pathogenic variants of the NOTCH3 gene. During the disease, we still do not know how the various deficits progress and develop with each other at different stages of the disease. We aim to model disease progression, identify possible progressive subgroups and the effects of different covariates on clinical worsening. Methods: Data were from patients followed in the French CADASIL referral center, who were aged 25-80 years and had completed at least two visits and one of 14 clinical scores. Progression and variability were assessed using a Disease course model (Leaspy). A Gaussian mixture model was used to identify different progression subgroups. Logistic regressions were used to compare the characteristics between groups. Results: In 395 patients along 2007 visits, the follow-up ranged from 6 months to 19 years, with a mean of 7.5 years. They were 45% men with a mean age of 52.2 years. The evolution curves of the different scores showed that clinical manifestations develop heterogeneously and can vary considerably depending on the disease stage. We identified an early-onset, rapidly progressing subgroup of patients with earlier motor symptoms and focal neurological deficits, (median time-shift: 59 (Q1-Q3: 48.9-66.3), median acceleration rate: 0.84 (0.07-1.31), and a late-onset slowly progressing group, with earlier cognitive symptoms, (median time-shift: 69.2 (63.4-75.1), median acceleration rate: -0.18 (-0.48-0.14). Male gender, a lower education level, hypertension, and the NOTCH3 pathogenic variant location within EGFr 1-6 were found associated with this group difference. Discussion: Our results suggest a gradual and heterogeneous decline in different clinical and cognitive performances over the lifetime of CADASIL patients. Two progression profiles, one rapid and early and the other, more delayed and slower, are possible after the onset of symptoms. Although a major limitation of our study is that the clusters were assessed post-hoc which may induce some bias. Overall, male gender, a low level of education, the pathogenic variant location in EGFr 1 to 6 domains, smoking and/or arterial hypertension may affect the clinical progression of the disease.

- 1 Abstract
- 2
- 3 <u>Background and Objectives</u>: Cerebral Autosomal Dominant Arteriopathy with Subcortical
- 4 Infarcts and Leukoencephalopathy (CADASIL) is the most frequent small artery brain disease
- 5 caused by pathogenic variants of the NOTCH3 gene. During the disease, we still do not know
- 6 how the various deficits progress and develop with each other at different stages of the
- 7 disease. We aim to model disease progression, identify possible progressive subgroups and
- 8 the effects of different covariates on clinical worsening.
- 9 <u>Methods</u>: Data were from patients followed in the French CADASIL referral center, who were
- 10 aged 25-80 years and had completed at least two visits and one of 14 clinical scores.
- 11 Progression and variability were assessed using a Disease course model (Leaspy). A Gaussian
- 12 mixture model was used to identify different progression subgroups. Logistic regressions
- 13 were used to compare the characteristics between groups.
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- 23 EGFr 1-6 were found associated with this group difference.
- 24 <u>Discussion</u>: Our results suggest a gradual and heterogeneous decline in different clinical and
- 25 cognitive performances over the lifetime of CADASIL patients. Two progression profiles, one
- 26 rapid and early and the other, more delayed and slower, are possible after the onset of
- symptoms. Although a major limitation of our study is that the clusters were assessed post-
- hoc which may induce some bias. Overall, male gender, a low level of education, the pathogenic variant location in EGFr 1 to 6 domains, smoking and/or arterial hypertension
- 30 may affect the clinical progression of the disease.
- 31

32 Introduction

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34 Cerebral Autosomal Dominant Arteriopathy with Subcortical Infarcts and 35 Leukoencephalopathy (CADASIL) is the most frequently inherited cerebral small vessel 36 disease (cSVD). It is caused by cysteine missense pathogenic variants in one of the 34 37 epidermal growth-factor-like repeat (EGFr) domains of the NOTCH3 protein, a receptor located at the surface of smooth muscle cells in the wall of arterioles or at the surface of 38 pericytes in capillaries.¹ Such pathogenic variants presumably lead to aggregation of both the 39 mutant and wild forms of NOTCH3-ECD² with other components of the matrisome within the 40 41 vascular wall³. The clinical spectrum of CADASIL is wide and includes attacks of migraine 42 with aura, stroke, mood disturbances and diverse neuropsychiatric symptoms, cognitive impairment ranging from executive dysfunction up to severe dementia⁴ and motor disability. 43 All these clinical manifestations have already been reported with varying frequency, in many 44 45 other cSVDs. Thus, CADASIL is now considered a unique model for better understanding the 46 natural history and its underlying mechanisms in such conditions, that may span over 47 multiple decades.

48 Accumulating data from cross-sectional or rare and short-term longitudinal studies 49 allows to better delineate how the main manifestations of the disease develop over time. A 50 reduction of processing speed is likely the earliest manifestation of cognitive decline during 51 the disease course. Altered performances in executive functions such as attention, 52 concentration or short-term and working memory may develop just after, also at an early stage. Later, modifications in all cognitive domains presumably increase gradually up to 53 diffuse cognitive impairment with dementia at the latest stage.^{5,6,7} Often, motor 54 disturbances, with gait and balance problems develop slowly at first, then more obviously, in 55 56 parallel with cognitive decline. These manifestations are often complicated by mood 57 disturbances or neuropsychiatric symptoms, or by behavioral difficulties such as apathy. Previous studies have shown that these manifestations vary in intensity over time and in 58 different groups of patients.^{8,9} Over the last few years, we have also learned that at the same 59 60 age, clinical severity can vary widely between individuals, depending particularly on certain 61 vascular risk factors and the location of NOTCH3 pathogenic variants within the EGF domains. 62 However, although our global vision of the disease has become more apparent, the exact 63 natural history of the disease remains nonetheless imprecise. Thus, we don't know exactly 64 how each clinical deficit develops in relation to the others, how they worsen over time, or 65 how they combine during the different disease stages. This information is crucial, to 66 determine the disease course variations from patient to patient and to ultimately enrich the information that will ease considerably therapeutic development by selecting the right 67 68 patients, at the right time, using the appropriate assessment tools. In the present study, we 69 aimed to determine how the different clinical manifestations of CADASIL are appearing and 70 progressing over time and to what extent the disease course could differ between 71 individuals. We hypothesized that an innovative analytical approach applied to a large cohort 72 of patients could help answer these questions.

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74 <u>Methods</u>

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76 Population selection

78 Data were obtained from patients recruited at the French National Referral Centre 79 CERVCO. In this study, all patients were included after confirmation of CADASIL diagnosis by a genetic test showing a cysteine pathogenic variant in the EGFR domains of the NOTCH3 gene. 80 Participation in the cohort was systematically offered to all individuals who, at the request of 81 82 their general practitioner or neurologist, were referred to the national CERVCO center in 83 Paris for their management and follow-up. After obtaining their written consent, all patients 84 were evaluated regularly by the same experts of the disease (DH, SG, NA and HC) and 85 experienced neuropsychologists (AJ, SR, CM) using a unique case report form. They were 86 consecutively enrolled with a follow-up systematically proposed to each participant 87 approximately every two years, including a complete clinical evaluation, cognitive tests and 88 MRI examination. The corresponding data were recorded using a secure web application to a 89 common database (REDCAP). We selected patients from the whole cohort based on the 90 following criteria: 1) age at inclusion between 25 and 80 years, 2) completion of at least two 91 visits, 3) follow-up data including at least one clinical score among the 14 scores recorded 92 during each visit. We included all patients who met these three criteria. The clinical 93 information was collected by expert neurologists (NA, DH, SG and H.C and cognitive scores measured by experienced neuropsychologists (AJ, SR, CM) 10,11 . 94

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96 <u>Clinical outcomes</u>

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98 The clinical scores assess global cognitive efficiency, executive functions and memory 99 performances, motor disability, focal neurological deficits, daily activities as well as the life 100 quality. More specifically, cognitive efficiency was assessed using the Mattis Dementia Rating Scale (MDRS)¹² and the Vascular Dementia Assessment Scale cognitive scale (VADAS-Cog)^{13,14}. 101 The MDRS consists of 5 subscales related to attention, initiation/preservation, construction, 102 103 conceptualization, and memory. Here only the initiation/perseveration subscore was considered for analysis. The VADAS-Cog is an extended version of the Alzheimer's Disease 104 105 Assessment Scale-Cognitive subtest (ADAS-Cog) and includes additional subtests covering 106 attention, working memory, executive function, and verbal fluency. Three of the VADAS-Cog 107 components were included: the Digit Cancellation Test, the Symbol Digit Test, and the Backward Digit Span. We also obtained 3 scores from the Trail Making Test (TMT)¹⁵ 108 109 evaluating cognitive speed and mental flexibility, the TMT A time, TMT B time, and TMT B errors. Memory performance was assessed using 3 scores from the Free and Cued Selective 110 Reminding Test adapted from the Grober and Buschke (GB) procedure:¹⁶ the Total Free 111 Recall, Index of Sensitivity to Cueing and Delayed Total Recall. The severity of disability was 112 113 assessed using the modified Rankin scale and included the value of 6 (death) when the time 114 at death was detailed. Focal neurological deficits were summarized using the NIH Stroke Score (NIHSS)¹⁷ and limitations in daily activities by the Barthel index¹⁸. Finally, the quality of 115 116 life was assessed using the Visual Analog Scale of the 3-level EuroQol (EQ VAS)¹⁹. In the present study scores were transformed and normalized in order to always increase from 0 to 117 118 1 using their theoretical limits given in Table 2.

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- 120 <u>Baseline covariates</u>

Based on a previous study⁹, various baseline parameters were considered as potential 122 123 risk factors for more aggressive disease progression. They included: 1) gender (male or 124 female), 2) education level classified as high (more than 13 years of education) or low 125 otherwise, 3) alcohol consumption according to 3 categories: never, <2 glasses of wine per 126 day for men (<1 glass or equivalent for women), and above these thresholds, 4) presence or 127 absence of each of the following cardiovascular risk factors, hypercholesterolemia, diabetes, hypertension and smoking (yes for active /no for past or never), 5) presence of at least one 128 129 cardiovascular risk factor (0 or \geq 1), 6) number of cardiovascular risk factors (0, 1, 2, or >2), 6) 130 the pathogenic variant's position located within EGF domains 1-6 of the NOTCH3 protein or 131 within domains 7-34.²⁰

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133 Mixed effects statistical model (Leaspy)

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We used the Disease Course Mapping model²¹, a mixed-effects model implemented in an open-source Python library (Leaspy *standing for LEArning Spatiotemporal Patterns in Python*) which has been already tested for delineating multidimensional aspects of disease progression, in neurodegenerative diseases ^{22,23,24}. This innovative approach allows monitoring how the different clinical scores progress over time and in comparison to each other. It can also describe the disease trajectory at group and individual levels. Repeated clinical scores obtained longitudinally were considered for analysis.

142 The average disease progression was constructed as a mixed logistic curve model 143 based on all score values normalized from 0 (best value) to 1 with subject level variability 144 considered as the random effect. The average curve for each outcome was described by the 145 parameters p₀, v₀ and t₀, where p₀ and v₀ are the position and velocity (derivative of the curve) at time t₀, the midpoint of the logistic. For multivariate analysis outcomes were 146 147 modeled as a 14-point vector with age as the only regressor. Thus, from the mean trajectory, 148 we could derive the individual trajectories based on 3 subject-specific parameters: 1) the 149 time-shift τ (tau) corresponding to the estimated time lag compared to the average 150 progression (in years), indicating an earlier ($\tau < \tau$ mean) or later disease onset ($\tau > \tau$ mean), 2) the progression rate ξ (xi) indicating acceleration ($\xi > 0$) or deceleration ($\xi < 0$) compared to 151 152 the average progression, 3) the spatial profile was defined by the inter-marker spacing 153 parameters ω (omega) accounting for the variable ordering within the sample. For each 154 patient, one ω value was related to each clinical score and indicated that a given score has 155 begun to deteriorate before ($\omega < 0$) of after ($\omega > 0$) the average variation estimated in the 156 whole population.

Finally, since there could be common patterns within a population, we used another parameter called "sources" for considering the degrees of freedom related to the sequence of events. As the number of sources was smaller than the number of omegas, this additional parameter simplified the estimation process. To interpret the results, the omegas were retrieved by an independent component analysis.

162 To evaluate the goodness-of-fit of the model to the actual data, we compared the 163 estimated value of each visit with its observed value to compute the R².

- 164
- 165 Definitions of subgroups of patients
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167 To investigate which risk factors might influence the severity of the disease, we 168 performed Mann-Whitney U tests on the individual parameters describing the patients' 169 spatiotemporal profiles (τ , ξ , and ω) according to baseline covariates. Thereafter, we applied a Gaussian Mixture Model²⁵ to identify subgroups of patients having similar trajectories. For 170 this purpose, we considered the individual parameters (τ , ξ , and the sources to keep the 171 172 number of variables to a minimum) and defined the number of clusters according to the 173 Akaike and the Bayesian Information Criteria. We repeated the algorithm 1000 times to 174 stabilize the results. After the clustering process, to better describe the profile of patients 175 belonging to different subgroups, we used Mann-Whitney U tests to compare the 176 parameters τ , ξ and ω between the subgroups. We also compared the RMSE (Root Mean 177 Square Error) between the two subgroups as an additional performance metric of our 178 disease course mapping model.

Finally, the effects of previous statistically significant baseline covariates were also assessed a posteriori, using a univariate logistic regression, followed by backward elimination in a multivariable model to best describe the different subgroups using as a dependent variable the subgroup label (early vs late). Independence between covariates was tested using χ^2 tests and interactions were added in the univariate models in case of association. Statistical tests were performed at the conventional two-tailed type I error of 0.05 using Python version 3.12.2.

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- 37 <u>Standard Protocol Approvals, Registrations, and Patient Consents</u>
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 189 Informed consent was obtained from each subject or from a close relative if
 190 necessary. The study was approved by an independent ethics committee (CEEI-IRB-17/388).
 191
- 192 Data Availability
- 193
- 194 Raw data may be shared (anonymized) at the request of any qualified investigator.
- 195 The script used for data analysis is available on github:
- 196 https://github.com/KaisaridiSofia/CADASIL.git
- 197

- 198 <u>Results</u>
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200 Population Description

Clinical data were collected from 395 patients during 2007 visits, with a median of 4 visits per patient (IQR: 3-7, Range: 2-14), with 66% having their NOTCH3 pathogenic variant located in EGFr high domains from 1 to 6 (Table 1).

The follow-up duration varied from 6 months to 19 years with a mean of 7.5 years (IQR: 3.5-11.1). The mean age of patients at inclusion was 52.2 years (IQR: 44.5-61). They were 45% male, 72% had a low educational background, 18% were current smokers, 21% hypertensive and 22.3% had no cardiovascular risk factor, while 23.7% had more than two (Supplementary Figure 1).

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211 CADASIL course mapping

212 In the present study, we used 14 clinical scores collected longitudinally with 3 to 43% 213 214 of missing data depending on the outcome (Supplementary Table 1). The best performing 215 Disease Course model (Supplementary Figure 2) for delineating CADASIL progression showed 216 that there were three groups of scores deteriorating at different stages of the disease. These 217 groups were decided by a visual inspection over the population curves (Figure 1A) and were 218 then confirmed using the normalized score value at the average inflection point of disease 219 progression (Table 2). The first group of scores had normalized scores over 0.56, the second 220 between 0.38 and 0.35 and the third group below 0.18. Cognitive scores were the first to deteriorate as different VADAS-Cog subscores largely exceeded 0.5 at the reference inflection 221 222 point like the Symbol Digit Test, Backward Digit Span or Digit Cancellation Task (between 223 0.76 and 0.87), while the TMT B Time and GB Total Free Recall were at 0.59 and 0.56 224 respectively. The Backward Digit Span was however much higher than zero at the very start 225 because only 5% of patients presented with the lowest corresponding score at time of 226 inclusion. Conversely, the EQ-VAS quality of life (EQVAS), modified Rankin scale (mRS) and 227 TMT A time (TMTA T) ranged from 0.35 to 0.38 at the reference inflection time, indicating 228 that these clinical parameters were changing mainly after the intermediate stage of the 229 disease. Finally, only later, the Mattis DRS Initiation scores, GB Index of Sensitivity to Cueing 230 (GB Cueing), TMT B errors (TMTBE), GB Delayed Total Recall (GB Delayed), Barthel index 231 (Barthel) and NIHSS index (NIHSS) changed most. Their scores were below 0.2 at the 232 inflection time, indicating that, they had not yet changed significantly.

The time shift, as reflected by τ values, was found significantly smaller (earlier onset)
 in patients with male gender, low education level, smoking, hypertension and who had a
 NOTCH3 pathogenic variant located in EGFR domains 1-6 (Figure 2, Supplementary Table 2).

The progression rate, as reflected by ξ values, was also found significantly higher (faster rate) in men compared to women (Figure 2, Supplementary Table 2).

Finally, regarding the symptoms' order, as reflected by ω values (Figure 3, Supplementary Table 2), the education level was found to influence significantly all clinical measures, except the patient's life quality. While the Barthel, NIHSS, and Rankin scores were found to change slightly earlier, all the cognitive scores varied later in poorly educated patients. Gender was also found to influence the disease progression; memory performances (as assessed by different GB sub-scores) were found to modify earlier in women, whereas the quality of life or the NIHSS scores was changing earlier in men. Hypertension was also
associated with earlier changes in the Rankin and NIHSS scores, but with later modifications
of the GB Total Free Recall and VADAS-Cog Digit Cancellation Task.

247 Concerning the R² (Supplementary Figure 7) we observe values ranging from 0.68 to 248 0.95 for almost all the scores except TMTB errors (0.40), Quality of life (0.26) and VADAS-Cog 249 Backward Digit Span (0.47).

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251 Subgroups of patients with similar trajectories

252 The Gaussian Mixture Model based on τ , ξ , and ω values, identified 2 subgroups of patients (Supplementary Figure 3) with different clinical trajectories of CADASIL 253 corresponding to early or late disease progressors. The first subgroup, labeled "early", 254 255 included 37% of the patients with a median tau value of 59 (Q1-Q3: 48.9-66.3, Range: 29.5-256 91.7) and a median ξ value of 0.84 (Q1-Q3: 0.07-1.31, Range: -1.65-3.12) (Supplementary 257 Figure 4, Supplementary Table 3) i.e. with an early and fast disease progression. The 258 remaining 63% of the patients belonged to the second subgroup, labeled "late", with a 259 median tau value of 69.2 (Q1-Q3: 63.4-75.1, Range: 45.4-89.9) and a median ξ value of -0.18 260 (Q1-Q3: -0.48-0.14, Range: -1.85-0.97) (Supplementary Figure 4, Supplementary Table 3), 261 indicating a later and slower disease progression. In comparison to the average progression 262 observed in the whole population, the corresponding curves (Figure 1B) showed that scores 263 changes occurred earlier (dotted line shifted to the left) and progressed more rapidly (slopes of the curves are steeper) in the "early" subgroup of patients. On the other hand, in the late 264 265 subgroup, the score changes occurred later (dotted line slightly shifted to the right) and 266 more slowly (the slopes are smoother) (Figure 1C). The early subgroup had also smaller ω 267 values for the Rankin Index (-0.06 vs 0.04, p-value<0.001) and the Barthel Index (medians -268 0.03 vs 0.02, p-value<0.001) suggesting earlier disability and dependency. We also observed 269 earlier focal deficits (possibly related to stroke events) in this subgroup as reflected by the 270 distribution of ω values for the NIHSS (-0.01 vs 0.01, p-value<0.001) (Figure 4A, 271 Supplementary Table 3). Conversely, an earlier onset of cognitive score changes as shown by 272 differences of ω values for VADAS cognitive subscores was detected in the "late" subgroup 273 (Supplementary Table 3). In contrast, the distributions of ω values for the EQVAS index, GB 274 Delayed Total Recall and Index of Sensitivity to Cueing did not differ between these subgroups (Figure 4C, Supplementary Table 3). All ω distributions are detailed in the 275 276 Supplementary Figure 5. The sensitivity for the model is 81%, specificity 40%, PPV 69%, NPV 277 57%, LR+ 1.35, and LR- 0.475 (Supplementary Figure 6) . The RMSE is similarly distributed 278 between the two groups (Supplementary Figure 8), with a slightly higher tendency for the 279 early subgroup. Overall, the mean values stay below 0.2 for all the scores.

280 Finally, we tested the effects of these five covariates on early subgroup membership. 281 In a univariate analysis, we found that patients who were male (OR: 2.86, 95% CI: [1.87-282 4.39]), less educated (OR: 2.44 [1.48-4.02]), with hypertension (OR: 1.73 [1.06-2.83]), hypercholesterolemia (OR: 1.63 [1.07-2.48]), or diabetes (OR: 2.77 1.05-7.32]) and with a 283 284 NOTCH3 pathogenic variant located in EGFr domains 1-6 (OR: 1.60 [1.03-2.51]) were more 285 likely to belong to the "early" group (Table 3). Although there were some significant associations between these variables (Supplementary Table 4) the addition of an interaction 286 287 term in the univariate model was never significant. Following a backward elimination, our 288 multivariable logistic model showed that men (OR: 2.86 [1.84-4.44]), with lower education 289 (OR: 2.66 [1.58-4.53]), hypertension (OR: 1.82 [1.07-3.10]) and NOTCH3 pathogenic variant 290 located in EGFr domains 1-6 of the pathogenic variant (OR: 1.84 [1.14-3.00]) were at 291 increased risk to have an "early" disease progression (Table 3).

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293 Discussion

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The results of this study provide the first fine chronological mapping of the most characteristic clinical manifestations during CADASIL. This mapping was based on thousands of visits obtained using the same assessment tools. The results confirm that the permanent manifestations observed in symptomatic patients develop in a heterogeneous way and vary considerably depending on the disease stage.

300 The reduction of cognitive performances observed with the VADAS-Cog subscores, 301 TMT B time and Total Free Recall assessed during the Grober and Buschke procedure, 302 confirms that modifications of executive functions are the earliest detectable manifestations. These findings agree with the reduction of cognitive speed and flexibility reported in young 303 CADASIL adults, long before the occurrence of strokes.²⁶ The early reduction of total free 304 recall suggest that memory performances could be affected early although memory is usually 305 considered long preserved during the course of cSVDs.^{27,28} These results are consistent with 306 recent studies demonstrating that while long term memory recall is damaged at late stage, 307 308 other aspects of memory performances, particularly related to attention or working memory could be early affected during the course of CADASIL.^{29,30,31} At the intermediate stage of the 309 disease, disability is developing, parallel to significant cognitive slowing leading to prolonged 310 311 TMT-A time with changes in life quality. Later, when motor disability is installed, cognitive 312 decline deepens and alterations in cognitive initiation, perseverations, and memory deficit 313 without improvement by cueing develop as reflected by changes in the MDRS initiation and 314 various subscores of the Grober and Buschke procedure. Finally, the Barthel and NIHSS 315 scores show obvious alterations only in patients at the most advanced disease stage, and 316 associated with developing of difficulties in daily activities. We evaluated the CADASIL course map by calculating the R², where we obtained satisfying results for all but three scores : 317 TMTB errors, Quality of life and VADAS-Cog Backward Digit Span. Nevertheless, as our goal 318 319 here is to better describe the course of the disease rather than improve the accuracy of our prediction, we kept these scores because they provide important information for the 320 321 evolution of the disease.

322 A key finding of our study is also that in a large population of symptomatic CADASIL 323 patients followed over decades, two different profiles of clinical progression are detected. In 324 one subgroup, individuals present an early onset and a rapid clinical deterioration, they also 325 develop rapidly focal deficits, motor disability and dependency. In another subgroup of 326 patients, the clinical progression appears late and slow, and cognitive symptoms are 327 occurring earlier. These findings suggest that the phenotypic variability of CADASIL might be 328 more complex than expected and does not only rely on the time of onset and rate of 329 progression, but also on the order of the different clinical manifestations during the disease 330 course. This complexity is further illustrated by the results of the different memory 331 performance tests which are differently affected according to the disease stage. While a 332 decrease of Total Free Recall is detected earlier in patients with a late clinical progression, 333 both the Delayed Total Recall and Index of Sensitivity to Cueing follow a similar decline in 334 patients with early or late clinical worsening. Comparing the RMSE between the subgroups 335 we see similarly satisfying low means and the slightly higher values for the early subgroup, 336 can be explained by the unbalanced proportions (37% vs 63%).

Our results also showed that the disease manifests differently in patients who are male, less educated, hypertensive or smokers or who have a pathogenic variant located in the EGFr domains 1-6 of the Notch3 receptor. Male gender has already been shown to be

associated with more severe clinical manifestations in CADASIL.³² The pathogenic variant 340 location was also previously found to be a strong predictor of disease severity³³ although it 341 could not explain alone the different clinical profiles³⁴ even combined with gender.³⁵ 342 Cardiovascular risk factors have been also suggested to modulate the disease severity,³⁶ 343 particularly hypertension.²⁹ The diagnosis of CADASIL is based on the discovery of the 344 pathogenic variant. The presence of vascular risk factors in no way can exclude this 345 pathogenicity. There is increasing evidence that vascular risk factors could modulate the 346 347 phenotype of the disease, for example by accelerating its course. This is partly what we observe and confirm in the results of this study. Interestingly, this study also reveals that 348 349 education level might interfere with the type of disease progression. The exact reasons for 350 this remain unclear. We cannot rule out however that this is not partly related to the large 351 influence of education on cognitive performances, particularly on those related to executive functions.³⁷ Indeed, the education level could have magnified the reduction of performances 352 in some tests and revealed a higher sensitivity in particularly well-educated individuals. This 353 354 might explain some of our results showing earlier cognitive changes in association with late 355 disease progression in highly educated individuals. These results also support that early 356 cognitive changes does not mean necessarily, rapid clinical worsening with severe disability 357 and dependency. Interestingly, our results also enabled us to estimate the time shift in 358 relation to these covariates. The effects of gender, education level and smoking might 359 correspond to a difference of 5 or 6 years. The effects of arterial hypertension or the location 360 of the pathogenic variant would be responsible for a delay from 2 to 3 years. However, these 361 results should be cautiously interpreted, given the likely bias in our cohort recruitment 362 consulting a referral center with expert neurologists.

363 This study has multiple strengths. First, the amount of data, particularly the number 364 of participants and measurements, but also the follow-up duration, were considerable, for 365 such a rare disease. This was crucial to model the average population trajectory of cognitive and motor decline precisely. Second, our model has already been shown to be robust in the 366 presence of missing data³⁸ which allowed us to consider all visits even when not all tests 367 were available. Third, this model allowed us to examine how the scores were progressing 368 369 with each other, which is rarely analyzed at a longitudinal level. Although the diversity of 370 ages, onset times, and progression rates could make it difficult to develop a reliable model, 371 our age reparameterization allowed us to map a population trajectory consistent with the 372 disease course and to compare individuals who were at the same stage rather than at the 373 same "biological" age. Fourth, a particularly strong asset was that we managed to study the 374 disease progression at an individual level in addition to the population level. Fifth, the non-375 supervised approach revealed two groups of CADASIL patients having different trajectories 376 not only in terms of temporal evolution but also in terms of the events sequence. The 377 longitudinal profiling, which considered all clinical aspects of individual evolution, allowed us 378 to detect patients who develop motor disability and dependency symptoms early, and 379 patients developing cognitive symptoms first. Sixth, our results provide insight into how 380 different covariates, known to influence the disease at baseline, could interfere with the 381 disease progression.

There are also several limitations in this study. To integrate all the clinical information in the course of the disease we used scores that are coarse and have variable sensitivity. This heterogeneity might affect the accuracy of the model. Also, regarding the baseline 385 characteristics tested, unfortunately the database did not include enough information to be 386 able to consider them longitudinally. Certainly, an external validation of the practical use of 387 the clustering would add immense value to our results. For that a prospective validation 388 study is needed and we hope that it can be carried out in the future. The individual clusters 389 were obtained post-hoc using the individual parameters as estimated by our model. A 390 clustering procedure integrated since the first estimation steps of the model and considering 391 the scores changes at each stage might have provided a more insightful classification. At the 392 population level, the present study focused on the point at which clinical scores began to 393 change, whereas we could also have examined the different rates of change on the variation 394 curves of the clinical features throughout the trajectory of the disease. Moreover, the lack of 395 external validation and the potential bias in the cohort recruitment pose additional 396 challenges. Incorporating new observations, more importantly additional visits for some 397 patients would help improve the model's performance. Furthermore, because all the 398 available data was used in the training of the model, these represent best-case scenario 399 estimates, the performance on new patients will likely be lower. A study aiming at prediction, 400 using a richer dataset, split into training and test set could also result to more insightful 401 conclusions. Finally, in this study, only deficits that persisted and worsened over time were 402 assessed. The occurrence of stroke and its influence on clinical and cognitive worsening was 403 not specifically studied and would require further evaluation. Future research with the 404 potential use of imaging data could also help to improve detailed chronological mapping of 405 disease progression.

In conclusion, using a disease progression model and a large amount of longitudinal data, we collected reliable and key clinical information concerning the course of CADASIL. Our results support that there are two groups of patients, slow and fast progressors, and that different factors could explain this discrepancy. They also help delineate both the dynamics and order of multiple clinical score changes during the disease progression which is crucial for preparing future clinical trials.

412

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534		

535 <u>Tables</u>

536

537 **<u>Table 1:</u>** Baseline characteristics

Baseline characteristic	
Age	52.9 (44.5-610) [24.6-79.4]
Gender: male	178 (45%)
Education: <13 years	284 (72%)
Alcohol consumption	
never	119 (37%)
<2 glasses of wine for a man	166 (51%)
>2 glasses of wine for a man	38 (12%)
Smoking	71 (18%)
Hypertension	84 (21%)
Hypercholesteremia	150 (40%)
Diabetes	17 (4%)
Presence of at least one cardiovascular risk factor	307 (78%)
Number of cardiovascular risk factors	
0	88 (24%)
1	164 (44%)
2	93 (25%)
>2	27 (7%)
Pathogenic variants position : within EGF domains 1-6	259 (66%)
VADAS – Cog Symbol Digit Test	4 (1-8) [1-10]
VADAS – Cog Backward Digit Span	4 (2-5) [1-5]
VADAS – Cog Digit Cancellation Task	5 (2-8) [1-10]
TMT B Time	85 (60-137) [27-300]
GB Total Free Recall	29 (23-34.50) [0-47]
Modified Rankin Scale	1 (0-2) [0-5]
TMT A Time	37 (27-53.50) [13-180]
EQVAS Quality of life	75 (60-90) [0-100]
MDRS initiation	37 (32-37) [6-37]
GB Index of Sensitivity to Cueing	94.44 (84.21-100) [16.67-100]
GB Delayed Total Recall	16 (15-16) [1-16]
TMT B Errors	0 (0-1) [0-8]
NIHSS Index	0 (0-1) [0-25]
Barthel Index	100 (100-100) [0-100]

538 Legend: Median, interquartile range (in brackets) and ranges (in closed brackets) are

539 provided for quantitative variables. Frequencies and percentages (in brackets) are given for

540 qualitative variables.

541

542

- 543 **Table 2:** Normalized score values obtained for each test at the average mid-time (tau mean)
- 544 of disease progression

Score (label) [evolution (best to worst)]	Normalized value at the average
	mid-time of disease progression
	(tau mean)
VADAS-Cog Symbol Digit Test (Symbol-Digit) [1-10]	0.87
VADAS-Cog Backward Digit Span (Backward-Digit) [1-5]	0.82
VADAS-Cog Digit Cancellation Task (Digit-Cancel) [1-10]	0.76
Trail Making Test B Time (TMT-B T) [0-300]	0.59
GB Total Free Recall (GB-free) [48-0]	0.56
EQ VAS Quality of life (EQVAS) [100-0]	0.38
Modified Rankin Scale (Rankin) [0-6]	0.37
Trail Making Test A time (TMT-A T) [0-180]	0.35
MDRS Initiation (MDRS-initiation) [37-0]	0.18
GB Index of Sensitivity to Cueing (GB-cueing) [100 – 1]	0.12
Trail Making Test B errors (TMT-B E) [0-24]	0.05
GB Delayed Total Recall (GB-delayed) [16-0]	0.04
Barthel Index (Barthel) [100-0]	0.03
NIHSS index (NIHSS) [0-42]	0.03

545 **Legend:** The different tests employed in the study are detailed with their labels in brackets

546 (subsequently used in Figure 1) and their limit values after their normalization. The second

547 column indicates the normalized values of each score at the average time of inflection of

548 disease progression obtained using the whole population (Figure 1A).

549 **Table 3: Risk factors of belonging to the earlier subgroup of disease progression**

550

	<u>Univariate ma</u>	odels_	Multivariable model		
Baseline covariate	Odds ratio (95%	p-value	Odds ratio (95%	р-	
	CI)		CI)	value	
Male gender	2.86 (1.87-4.39)	<0.001	2.86 (1.84-4.44)	<0.001	
Education level	2.44 (1.48-4.02)	<0.001	2.66 (1.58-4.53)	<0.001	
Smoking	1.21 (0.71-2.03)	0.485			
Hypertension	1.73 (1.06-2.83)	0.027	1.82 (1.07-3.10)	0.026	
Hypercholesterolemia	1.63 (1.07-2.48)	0.021			
Diabetes	2.77 (1.05-7.32)	0.039			
Pathogenic variant location (EGFR 1-6)	1.60 (1.03-2.51)	0.036	1.84 (1.14-3.00)	0.013	
Low education level *Hypercholesterolemia	0.91 (0.31-2.61)	0.86			
Low education level *Pathogenic variant	1.11 (0.33-3.63)	0.87			
location (EGFR 1-6)					
Hypertension*Hypercholesterolemia	0.84 (0.31-2.27)	0.74			
Hypertension*Diabetes	0.82 (0.11-6.05)	0.84			
Hypertension*Pathogenic variant location	1.11 (0.40-1.13)	0.85			
(EGFR 1-6)					
Hypercholesterolemia*Diabetes	0.18 (0.02-2.12)	0.17			

551 **Legend**: The results of univariate logistic regression are shown with parameters selected 552 from baseline covariates by Mann-Whitney U tests showing a significant difference in 553 individual \bigcirc or ξ values or a significant interaction by chi-2 tests (selection with p < 0.05, left). 554 The results of the final multivariable model obtained using backward removal on p-values 555 and the lowest AIC are also presented (right). The odds ratio with the corresponding 95% 556 confidence interval and p-value are given for each variable. The significant results are in bold. 557

- 558 Figures
- 559

561

560 Figure 1

562 <u>Title:</u> CADASIL course map as delineated by the average longitudinal progression of 14 563 clinical scores – 1A: Average disease progression in the whole population – 1B: Average 564 disease progression in patients with early score changes – 1C: Average disease progression 565 in patients with late score changes.

566

567 Legend: Each colored curve represents the average progression of a specific clinical score 568 (detailed on the right side) which was transformed and normalized for obtaining the same 569 scale of progression from the best (0) to worst (1) score values. The effect of the time-shift 570 and acceleration is to slide the points representing the patients' measurements along the 571 curve so that the actual age of the subject at each visit moves to the corresponding disease 572 age, represented in the x-axis. The vertical dotted lines (τ mean) indicate the age at midpoint 573 inflection of the average trajectory of patients score values. After obtaining the results of clustering analysis, the average progression was plotted for patients belonging to the group 574 575 with an early clinical progression (1-B) and for those belonging to the group with the late 576 onset respectively (1C).

577 578

Figure 2

579

580Title: Significant differences identified for temporal individual parameters τ and ξ values581according to baseline cohort parameters using Mann-Whitney tests

582

583 **Legend:** Boxplots showing the distributions of individual time shift (τ) and progression rate 584 (ξ) of the disease in reference to the average disease progression curve according to the 585 gender, education level, smoking, hypertension, and the pathogenic variant location in EGFR 586 domains 1-6 versus 7-34. A greater τ value in one group indicates a significant time shift in 587 the disease progression i-e a later change of clinical scores in comparison to the other group. 588 A greater ξ value or progression rate in one group indicates a faster disease progression 589 compared to that observed in the other group. Significant results obtained with the Mann-590 Whitney U tests are indicated with a *.

591 502

592 <u>Figure 3</u> 593

594 <u>Title:</u> Significant differences observed in ω values (order of clinical score changes) 595 according to baseline cohort parameters using Mann-Whitney tests

596

597 **Legend:** Boxplots showing the distributions of individual values of the inter-score spacing ω 598 according to the education level, gender and prior history of hypertension. The x-axis 599 corresponds to ω values, and the 14 clinical scores are presented in the y axis. A smaller ω 600 value for a given score in one group indicates that this score deteriorates earlier than for the 601 other group and vice-versa. Only distributions with a significant group difference are shown 602 (Mann-Whitney U tests), they were observed according to education level, gender and 603 hypertension. No significant difference was detected in relation to smoking or to the NOTCH3 604 Significant results obtained with the Mann-Whitney U tests are indicated with a *.

605 Figure 4

606

<u>Title:</u> Distribution of individual ω values for different clinical scores in the group with early and in the group with late disease progression

609

610 Legend: Each point corresponds to one patient. The x, y, and z axis correspond to the 611 variation of ω values for different clinical scores. A smaller ω value detected in one group 612 suggests that the corresponding clinical score deteriorates earlier than the other scores in 613 comparison to what is observed in the other group and vice-versa. Figure A shows that 614 scores related to motor disability, focal deficits and dependency (Rankin, NIH scores, Barthel 615 index) deteriorate earlier than the other clinical changes in patients with early progression 616 (red) compared to patients with late progression (green). Conversely, Figure B shows that the 617 VADAS cognitive sub-scores modifications occur earlier than the other clinical changes in 618 patients with late disease progression (green) compared to patients with early disease 619 progression (red). In Figure C, both two memory scores derived from the Grober and Buske 620 procedure (Index of Sensitivity to Cueing and Delayed Total Recall) as well as the quality of 621 life index seem to develop at the same time then the other clinical manifestations in the two

622 groups of early or late disease progression.





NIHSS Index





0.2

0.0









Intermarker spacing parameters - ω values

SUPPLEMENTARY MATERIAL

Supplementary Table 1: Percentages of visits with missing scores along a total of 2007 visits.

Score	Percentage of missing visits
Modified Rankin Scale	3%
Barthel Index	9%
NIHSS Index	10%
MDRS initiation	28%
EQVAS Quality of life	29%
TMT A Time	30%
GB Index of Sensitivity to Cueing	31%
GB Total Free Recall	31%
TMT B Time	35%
TMT B Errors	35%
VADAS – Cog Symbol Digit Test	42%
VADAS – Cog Backward Digit Span	42%
VADAS – Cog Digit Cancellation Task	42%
GB Delayed Total Recall	43%

Supplementary Table 2: Median (Q1, Q3) values of the different time shift (τ), progression rate (ξ) and ordering of clinical score changes (ω) according to various baseline covariates (p values obtained with Mann Whitney U Tests)

Parameter	Gender		Education level		Smoking		Hypertension		Mutation location	
	male	female	low	high	yes	no	yes	No	EGFR 1-6	EGFR 7-34
τ (time shift)	62.71 (54.56, 69.98)	68.43 (62.22, 74.64)	64.88 (57.45, 71.01)	69.97 (62.99, 74.09)	61.71 (52.07, 69.06)	67.23 (59.97, 73.40)	64.80 (59.96, 69.82)	66.45 (59.59, 73.42)	65.07 (57.70, 72.22)	68.38 (61.69, 73.90)
p-value	<0.	.001	<0.001		<0.001		0.045		0.015	
ξ (progression rate)	0.10 (-0.33, 0.91)	-0.07 (-0.40, 0.37)	0.02 (-0.35, 0.74)	0.03 (-0.39, 0.40)	-0.14 (-0.49, 0.42)	0.05 (-0.35, 0.61)	0.15 (-0.32, 0.84)	-0.02 (-0.39, 0.50)	0.05 (-0.36, 0.73)	0.00 (-0.36, 0.43)
p-value	0.	013	0.4	401	0.118		0.107		0.429	
ω Barthel	0.001 (- 0.03, 0.03)	0.009 (- 0.02, 0.03)	-0.001 (-0.03, 0.02)	0.022 (0, 0.05)	0.015 (-0.02, 0.03	0.006 (-0.03, 0.03)	-0.001 (-0.03, 0.02)	0.009 (-0.02, 0.03)	0.007 (-0.02, 0.03	0.006 (-0.02, 0.03)
p-value	0.107		<0.001		0.308		0.053		0.798	
ω Rankin	0.004 (- 0.06, 0.06)	0.019 (- 0.03, 0.06)	0.003 (- 0.06, 0.05)	0.042 (- 0.01, 0.08)	0.024 (-0.04, 0.07)	0.009 (-0.04, 0.06)	-0.003 (-0.06, 0.04)	0.020 (-0.04, 0.06)	0.016 (-0.04, 0.06)	0.007 (-0.04, 0.05)
p-value	0.166		<0.001		0.329		0.026		0.564	
ωNIHSS	-0.002 (- 0.02, 0.01)	0.003 (- 0.01, 0.01)	-0.002 (-0.01, 0.01)	0.010 (0, 0.02)	0.001 (-0.01, 0.02	0.001 (-0.01, 0.01)	-0.004 (-0.01, 0.01)	0.003 (-0.01, 0.02)	0.002 (-0.01, 0.01)	0 (-0.01, 0.01)
p-value	0.015		<0.001		0.961		0.021		0.610	
$\boldsymbol{\omega}$ MDRS initiation	-0.004 (- 0.08, 0.06	-0.013 (- 0.07, 0.05)	0.001 (- 0.06, 0.06)	-0.031 (-0.11, 0.04)	-0.029 (-0.08, 0.05)	-0.004 (-0.07, 0.06)	-0.006 (-0.07, 0.05)	0.010 (-0.07, 0.06)	0 (-0.07, 0.06)	-0.014 (-0.07, 0.05)
	0.4	488	<0.001		0.290		0.927		0.549	
ωιμι-Αι	-0.007 (-0.09, 0.09)	-0.036 (-0.10, 0.06)	-0.003 (-0.08, 0.09)	-0.06 (- 0.12, 0.02)	-0.054 (-0.11, 0.07)	-0.015 (-0.09, 0.08)	0.006 (-0.08, 0.10)	-0.029 (-0.10, 0.07)	-0.023 (-0.09, 0.08)	-0.012 (-0.09, 0.08)
	0	282	<0.	001	0.29)1	0.059		0.6	659

p-value										
ω TMT-B T	-0.002 (-	-0.044 (-	-0.002	-0.103	-0.073	-0.021	0.011	-0.040	-0.027	-0.030
	0.16,	0.15,	(-0.14,	(-0.21,	(-0.18,	(-0.15,	(-0.14,	(-0.16,	(-0.15,	(-0.16,
p-value	0.16)	0.10)	0.16)	0.04)	0.10)	0.13)	0.15)	0.12)	0.13)	0.13)
,	0	260	<0.001		0.231		0.113		0.935	
ω TMT-B Errors	-0.001 (-	-0.005 (-	0.002 (-	-0.016	-0.009	-0.002	0.002	0.004	-0.003	-0.005
	0.03,	0.03,	0.02,	(-0.04,	(-0.03,	(-0.03,	(-0.03,	(-0.03,	(-0.03,	(-0.03,
p-value	0.03)	0.02)	0.03)	0.01	0.02)	0.02)	0.02)	0.02)	0.02)	0.02)
F0\40	0.001 /	327	<0.	001	0.18		0.498		0.715	
$\boldsymbol{\omega}$ EQVAS	-0.001 (-	0.004 (-	0.001	0.004		0.002	0.001	0.002	0.002	0.002
	0.02,	0.01,	(-0.02,	(-0.01,	(-0.02,	0.02,	(-0.02,	(-0.02,	(-0.02,	(-0.02,
p-value	0.02)	0.02)	0.02))70	0.02		0.02) 0.02)		0.02) 0.02)	
() CDfroo	0.015 (-	-0.016 (-	0.011 /-	_0 050	_0.10	-0.006	0.07	, _0.01/	_0.010	0.004
w Gbliee	0.013 (-	-0.010 (- 0.09	0.011 (-	-0.033 (_0.12	-0.012	-0.000	(-0.06	(_0 10	(_0.09	(_0 10
	0.00,	0.00,	0.07,	0.03)	0.08)	0.08)	0.08)	0.07)	0.07)	0.08)
p-value	0.016		< 0.001		0.922		0.034		0.666	
ω GBcueina	0.017 (-	-0.023 (-	-0.004	-0.029	0.015	-0.016	0	-0.016	-0.007	-0.020
	0.07,	0.09, `	(-0.07,	(-0.09,	(-0.07,	(-0.08,	(-0.06,	(-0.08,	(-0.08,	(-0.07,
n valuo	0.10)	0.05)	0.08)	0.05)	0.09)	0.07)	0.10)	0.06)	0.07)	0.07)
p-value	0.003		0.041		0.315		0.113		0.9	989
ω GBdelayed	0.011 (-	-0.015 (-	0.001	-0.020	0.005	-0.008	0.001	-0.009	-0.003	-0.011
	0.04,	0.05,	(-0.04,	(-0.05,	(-0.04,	(-0.05,	(-0.04,	(-0.05,	(-0.05,	(-0.04,
p-value	0.06)	0.03)	0.05)	0.03)	0.05)	0.04)	0.06)	0.03)	0.04)	0.04)
	0.0	004	0.0	119	0.385		0.090		0.949	
$\boldsymbol{\omega}$ Backward-Digit	-0.002 (-	-0.021	0.001 (-	-0.050	-0.026	-0.006	0.008	-0.017	-0.015	-0.013
	0.11,	(-0.11, 0.07)	0.09,	(-0.17,	(-0.12, 0.07)	(-0.11,	(-0.10,	(-0.11,	(-0.11,	(-0.12,
p-value	0.12)	334	0.12) 0.02)		0.07) 0.10)		0.10)	1	0.10) 0.10)	
w Digit-Cancel	-0.017 (-	-0.061.(-	-0.008	-0.112	-0.072	-0.038	0.015	-0.064	-0.053	-0.013
W Digit-Calicei	0.21.	0.22.	(-0.18.	(-0.27.	(-0.26.	(-0.21.	(-0.15.	(-0.23.	(-0.22.	(-0.21.
	0.16)	0.13)	0.17)	0.07)	0.16)	0.14)	0.21)	0.13)	0.13)	0.17)
p-value	0.1	283	0.0	001	0.431		0.029		0.442	
ω Symbol-Digit	-0.009 (-	-0.059 (-	-0.006	-0.101	-0.088	-0.027	0.011	-0.053	-0.042	-0.032
, <u>,</u>	0.16,	0.16,	(-0.13,	(-0.21,	(-0.16,	(-0.16,	(-0.13,	(-0.16,	(-0.16,	(-0.15,
n-value	0.15)	0.10)	0.16)	0.04)	0.10)	0.13)	0.19)	0.11)	0.13)	0.13)
p-value	0.284		<0.001		0.272		0.057		0.692	

Legend: The median values are presented with the first and third quartiles in brackets for each individual parameter according to the different baseline covariates. The p-values of Mann-Whitney U tests performed for each combination are given in italics. The distributions with a statistical difference are highlighted, and their median values are in bold.

Parameter	Mediar	p-value	
	early	late	
Time shift (τ)	59.02 (48.89 , 66.32)	69.24 (63.36 , 75.11)	4.91e-20
Progression rate (ξ)	0.84 (0.07 , 1.31)	-0.18 (-0.48 , 0.14)	6.50e-24
ω Barthel	-0.03 (-0.06 , 0.01)	0.02 (0 , 0.04)	3.15e-32
ω Rankin	-0.06 (-0.12 , -0.01)	0.04 (0 , 0.07)	1.26e-33
ωNIHSS	-0.01 (-0.02 , 0)	0.01 (0 , 0.02)	1.36e-13
ω MDRS-initiation	0.05 (-0.01 , 0.12)	-0.04 (-0.09 , 0.03)	6.13e-17
ω TMT-A T	0.1 (0.02 , 0.18)	-0.07 (-0.12 , -0.01)	3.26e-36
ω TMT-B T	0.18 (0.05 , 0.29)	-0.12 (-0.2 , -0.01)	2.62e-37
ω TMT-B E	0.03 (0 , 0.05)	-0.02 (-0.04 , 0)	3.50e-29
ωEQVAS	0 (-0.02 , 0.03)	0 (-0.01 , 0.02)	0.78
ω GB-free	0.06 (-0.03 , 0.14)	-0.04 (-0.11 , 0.03)	2.65e-13
ω GB-cueing	0 (-0.08 , 0.09)	-0.02 (-0.07 , 0.06)	0.31
ω GB-delayed	0 (-0.04 , 0.05)	-0.01 (-0.04 , 0.03)	0.07
ω Backward-Digit	0.12 (0.02 , 0.20)	-0.07 (-0.15 , 0)	8.56e-36
ω Digit-Cancel	0.18 (0.01 , 0.45)	-0.14 (-0.29, 0)	1.20e-29
ω Symbol-Digit	0.17 (0.03 , 0.31)	-0.12 (-0.20 , -0.01)	2.13e-36

Supplementary Table 3: Distribution of time shift (τ), progression rate (ξ) and ordering of clinical score changes (ω) values in patients with early or late disease progression.

Legend: Median and the first and third quartile values of the different progression parameters are presented in the table. The p-values of the Mann-Whitney U test are given in the last column. The subgroup with late progression also presented with a slower progression rate. In this group, the Barthel, Rankin and NIHSS indices had a greater ω values than in the early progression group indicating that motor disability, focal deficits and dependency develop later in these patients. In contrast, most ω values for cognitive scores were smaller for the late subgroup indicating that the respective cognitive scores decreased earlier in this group of patients. The distribution of ω values of the EQVAS score, and GB index of Sensitivity to Cueing and Delayed Total Recall did not differ between the groups with early or late disease progression.

Covariate value (%)	Low education	Smoking	Hypertensi on	Hyperchole sterolemia	Diabetes	Mutation location EGFR 1-6
Men (45%)	45%	52%	49%	49%	55%	49%
p-value	1.00	0.24	0.51	0.26	0.50	0.06
Low education (72%)		73%	79%	80%	83%	68%
p-value		0.90	0.09	0.006	0.40	0.04
Smoking (18%)			12%	21%	11%	22%
p-value			0.14	0.37	0.64	0.003
Hypertension (21%)				30%	61%	16%
p-value				0.002	<0.0001	0.0004
Cholesterol (38%)					72%	37%
p-value					0.005	0.58
Diabetes (5%)						4%
p-value						0.88

Supplementary Table 4: Associations between the different baseline covariates

Legend: The associations between the baseline covariates are assessed with chi-2 tests. The observed relative frequencies of each covariate are given for the whole population in the first column and then for each combination of covariates in the following columns. The p-values are given for each pair of covariates in italics. The statistically significant associations are in bold. A low education level is defined by less than 13 years of education.



Supplementary Figure 1: Frequency of cardiovascular risk factors in the CADASIL population

Legend: The relative frequency of each cardiovascular risk factor and of their combinations in the study sample are presented on this figure. The y axis corresponds to the cardiovascular risk factors and the x axis to the number of factors coexisting in the same patient. There were 5.6% missing data (HT = Hypertension)



Supplementary Figure 2: Convergence of the population parameters

Legend: Convergence of the population parameters over 2500 iterations of the algorithm. Two Leaspy models were tested using three (first line) and 4 sources (second line). The mean of the time shift (tau) and the standard deviation of the acceleration rate (xi) are presented in the left and right column respectively.

Supplementary Figure 3: Optimization criteria for the GMM clustering algorithm



Legend: AIC and BIC values obtained by the GMM clustering algorithm according to the possible number of subgroups. A smaller value for these criteria indicates a better performing model.

Supplementary Figure 4: Distribution of time shift (τ values) and progression rate (ξ values) at individual level revealing two groups of patients with distinct clinical progression types



Legend: Each point corresponds to one patient. The y-axis corresponds to the time-shift τ in years. The group with small τ values corresponds to patients with an earlier clinical progression (and presumably with an earlier age of onset) compared to patients with high τ values. The x-axis represents the progression rate (ξ values). ξ values > 0 indicate a faster disease progression than the average observed in the whole sample. The green points correspond to patients with a relatively late and slow clinical progression. The red points correspond to patients with a relatively early and fast clinical progression. On the upper and the right axis, the distributions of τ and ξ values also shown.

Supplementary Figure 5: Subgroup-specific distributions of the intermarker spacing parameters (ω)



Legend: The distribution for the intermarker spacing parameters (omegas) are shown for each subgroup. A greater intermarker spacing for one subgroup suggests that the respective score starts its deterioration later than for the other subgroup. The green lines correspond to the subgroup that shows a late age of onset, slow progression rate and shows earlier symptoms of cognitive decline. The red lines correspond to the subgroup that shows an early age of onset or a fast rate of progression and shows earlier symptoms of motor disability and neurological deficits. **Supplementary Figure 6 :** Confusion matrix for the logistic regression predicting the subgroup label.



Confusion Matrix for the Multivariable Logistic Regression Model

Legend: Confusion matrix showing the amount of correct predictions the logistic regression is able to produce, using as a dependent variable the subgroup label, and as independent variables the gender, the education level, the hypertension and the location of the pathogenic variant.





Legend: Scatter plots comparing the estimated vs the real values for each score. The dotted lines correspond to the regression lines. The R² coefficients are stated in the bottom right corner of each plot.

Supplementary Figure 8 : Root Mean Square Error par group.



Legend: Boxplots comparing the distributions of Root Mean Square Error values for the 14 scores between the two groups.