Continuous Electroencephalography Predicts Delayed Cerebral Ischemia after Subarachnoid Hemorrhage: A Prospective Study of Diagnostic Accuracy

Eric S. Rosenthal, MD,1,2 Siddharth Biswal, MS,1,2 Sahar F. Zafar, MD,1,2 Kathryn L. O’Connor, BA,1 Sophia Bechek, BS,1 Apeksha V. Shenoy, MSE,1 Emily J. Boyle, BS,1,2 Mouhsin M. Shafi, MD, PhD,3 Emily J. Gilmore, MD,4 Brandon P. Foreman, MD,5 Nicolas Gaspard, PhD,6,7 Thabele M. Leslie-Mazwi, MD,1 Jonathan Rosand, MD,1 Daniel B. Hoch, MD,2 Cenk Ayata, MD,8 Sydney S. Cash, MD,2 Andrew J. Cole, MD,9 and M. Brandon Westover, MD, PhD2

Objective: Delayed cerebral ischemia (DCI) is a common, disabling complication of subarachnoid hemorrhage (SAH). Preventing DCI is a key focus of neurocritical care, but interventions carry risk and cannot be applied indiscriminately. Although retrospective studies have identified continuous electroencephalographic (cEEG) measures associated with DCI, no study has characterized the accuracy of cEEG with sufficient rigor to justify using it to triage patients to interventions or clinical trials. We therefore prospectively assessed the accuracy of cEEG for predicting DCI, following the Standards for Reporting Diagnostic Accuracy Studies.

Methods: We prospectively performed cEEG in nontraumatic, high-grade SAH patients at a single institution. The index test consisted of clinical neurophysiologists prospectively reporting prespecified EEG alarms: (1) decreasing relative alpha variability, (2) decreasing alpha-delta ratio, (3) worsening focal slowing, or (4) late appearing epileptiform abnormalities. The diagnostic reference standard was DCI determined by blinded, adjudicated review. Primary outcome measures were sensitivity and specificity of cEEG for subsequent DCI, determined by multistate survival analysis, adjusted for baseline risk.

Results: One hundred three of 227 consecutive patients were eligible and underwent cEEG monitoring (7.7-day mean duration). EEG alarms occurred in 96.2% of patients with and 19.6% without subsequent DCI (1.9-day median latency, interquartile range = 0.9–4.1). Among alarm subtypes, late onset epileptiform abnormalities had the highest predictive value. Prespecified EEG findings predicted DCI among patients with low (91% sensitivity, 83% specificity) and high (95% sensitivity, 77% specificity) baseline risk.

Interpretation: cEEG accurately predicts DCI following SAH and may help target therapies to patients at highest risk of secondary brain injury.

ANN NEUROL 2018;83:958–969

View this article online at wileyonlinelibrary.com. DOI: 10.1002/ana.25232

Received Feb 13, 2017, and in revised form Apr 8, 2018. Accepted for publication Apr 9, 2018.

Address correspondence to Dr Rosenthal, Division of Neurocritical Care and Emergency Neurology, Division of Clinical Neurophysiology, Massachusetts General Hospital, 55 Fruit St, Boston, MA 02114; E-mail: erosenthal@mgh.harvard.edu and Dr Westover, Neurology Department, Division of Clinical Neurophysiology, Massachusetts General Hospital, 55 Fruit St, Boston, MA 02114; E-mail: mwestover@mgh.harvard.edu

From the 1Division of Neurocritical Care and Emergency Neurology, Massachusetts General Hospital, Boston, MA; 2Epilepsy Service and Division of Clinical Neurophysiology, Massachusetts General Hospital, Boston, MA; 3Department of Neurology, Beth Israel Deaconess Medical Center, Boston, MA; 4Division of Neurocritical Care and Emergency Neurology, Yale–New Haven Hospital, New Haven, CT; 5Department of Neurology and Rehabilitation Medicine, University of Cincinnati, Cincinnati, OH; 6Department of Neurology, Comprehensive Epilepsy Center, Free University of Brussels, Erasmus Hospital, Brussels, Belgium; 7Department of Neurology and Comprehensive Epilepsy Center, Yale University, New Haven, CT; 8Division of Vascular Neurology, Massachusetts General Hospital, Boston, MA; and 9Department of Neurosurgery, Massachusetts General Hospital, Boston, MA

Additional supporting information may be found online in the Supporting Information section at the end of the article.
Aneurysmal subarachnoid hemorrhage (SAH) impacts 600,000 patients worldwide annually, conferring 40% mortality.\(^1\) Delayed cerebral ischemia (DCI), a common, disabling complication, usually occurs 4 to 14 days after onset. Despite tripling the odds of a poor 1-year outcome,\(^2\) DCI often goes unrecognized, limiting opportunities for intervention. Accurately identifying impending DCI would help target therapies to patients most likely to benefit. However, conventional monitoring methods are intermittent, only modestly accurate,\(^3\) and commonly examine only large vessel vasospasm, one of many mechanisms upstream of DCI.\(^4\)

Electroencephalography (EEG) provides a continuous measure of cerebral function with robust, predictable responses to ischemia.\(^5\)–\(^10\) Several small studies have proposed criteria for predicting DCI based on changes in continuous EEG (cEEG) spectral features,\(^7\)\(^,\)\(^9\) including decreasing alpha-to-delta power ratio (ADR)\(^6\)\(^,\)\(^7\)\(^,\)\(^9\) or relative alpha power variability (RAV).\(^6\)\(^,\)\(^8\) Other findings associated with cerebral ischemia include epileptiform discharges, rhythmic and periodic ictal–interictal continuum patterns,\(^11\)\(^–\)\(^14\) and isolated alpha suppression.\(^5\) Intracranial electrocorticography suggests that cortical spreading depolarizations may be a phenomenon underlying cEEG changes and DCI itself.\(^15\)

No study to date has assessed the diagnostic accuracy of cEEG for DCI following the Standards for Reporting of Diagnostic Accuracy Studies (STARD).\(^16\) Prior studies employed retrospective, unblinded analysis of cEEG and clinical data, and small cohorts.\(^6\)\(^–\)\(^10\) cEEG analysis in these studies was performed offline, outside of real-time clinical practice, and employed variable DCI definitions.\(^17\) Therefore, the generalizability of previously proposed cEEG criteria for predicting DCI remains uncertain.

We prospectively assessed the sensitivity and specificity of cEEG performed as part of routine medical care for predicting DCI, following STARD criteria. We applied a consensus definition\(^17\) of the primary outcome, DCI, using a blinded, adjudicated process, and prespecified which cEEG findings constitute an alarm for impending DCI. To ensure generalizability, we recruited a large number of consecutively monitored patients.

### Patients and Methods

#### Study Design

In this prospective study, we assessed the diagnostic accuracy of cEEG performed according to an institutional clinical care guideline\(^18\) for consecutive patients with SAH within a single neurosciences intensive care unit (ICU) over 2.5 years. The clinical guideline recommends that cEEG begin within 48 hours of admission and continue for 10 days, among high

---

**FIGURE 1: Flow diagram of study (Standards for Reporting of Diagnostic Accuracy Studies diagram).** After the index test results, results are sorted based on the reference standard (consensus criteria for the blinded determination of delayed cerebral ischemia [DCI]). For the 124 excluded patients, we list only the primary reason for exclusion in the order of exclusion. cEEG = continuous EEG monitoring; EEG electroencephalography; F = Fisher group; HH = Hunt and Hess grade.

clinical or radiologic grade patients (Hunt and Hess [HH] grade 4–5 or modified Fisher scale\(^19\) [mFS] grade 3–4). This institutional guideline recommends prophylactic antiseizure medication until ruptured aneurysms are secured.

Inclusion criteria were age \(\geq\) 18 years; nontraumatic etiology; \(\geq\) 72 hours; and, in cases determined to have DCI, \(\geq\) 24 hours of DCI. We excluded patients initially presenting with status epilepticus. Procedures conformed to the STARD criteria (Fig 1 and Supplementary Table S1).

A prespecified multistep process was conducted to determine DCI events, including blinded medical record review and adjudication undertaken as part of a prospective quality improvement initiative, as described below. Data archiving and analysis were conducted under an institutional review board–approved protocol.

#### Index Test

cEEG was recorded using the International 10-20 system of scalp electrodes (Ives Electrodes, Newburyport, MA). Clinical neurophysiologists reported cEEG findings prospectively in real time, reviewing raw cEEG data (Natus, Pleasanton, CA) and displays of quantitative trends (Persyst, Scottsdale, AZ) using clinical EEG review software; data were reviewed by both clinical fellows and staff neurophysiologists, according to routine clinical practice. All clinical neurophysiologists received special
instruction in interpreting ICU EEG recordings and quantitative EEG trends (described below) used in monitoring SAH patients. Clinical neurophysiologists routinely assessed for medication-induced effects on the cEEG (eg, anesthetic doses), communicating by telephone and face to face about EEG findings.

Neurophysiologists issued twice-daily reports, prospectively documenting the following cEEG findings, prespecified as electrophysiologic indicators of possible ischemia:

1. focal slowing or dropout of fast activity;
2. decreasing RAV;
3. decreasing ADR;
4. epileptiform abnormalities (EAs), including sporadic epileptiform discharges, lateralized rhythmic delta activity (LRDA), lateralized periodic discharges (LPD), or generalized periodic discharges (GPD).

Visual review and reporting of these findings for a single 8- to 12-hour reporting epoch typically takes our staff 20 to 30 minutes.

Details regarding the review process and alarm criteria have been previously described by Muniz et al. An EEG "alarm" was defined as description in the published clinical EEG report of clear and persistent worsening or new emergence over the majority of a single 8- to 12-hour epoch as defined for any of the following 4 EEG features, compared with the previous 8- to 12-hour epoch, independent of baseline asymmetries (eg, breach rhythms) or pathological features already present. If >1 alarm occurred, only the first was analyzed. Specific criteria for each feature are as follows.

1. Focal Slowing or Dropout of Fast Activity. These focal features on raw EEG were prespecified as increased power in the delta (<4Hz) or theta (4–7Hz) ranges relative to the corresponding contralateral region. An alarm criterion of a "clear and persistent worsening or new emergence" was defined as a qualitative change in the background from the preceding epoch, explicitly described in the official clinical neurophysiology report, persisting the majority of an epoch.

2. Decreasing RAV. Decreasing RAV was prespecified as a visually apparent decline in the RAV grade over a single 8- to 12-hour epoch. RAV grades were reported for each 8- to 12-hour EEG epoch based on the predominant amount of RAV histogram variability best describing the epoch (4, excellent; 3, good; 2, fair; 1, poor), as adapted from Vespa et al. RAV was displayed with a histogram: bars were given by relative alpha power (8–12Hz power divided by 1–20Hz power) computed every 30 seconds. Spectral power was calculated as the squared magnitude of the EEG signal Fourier transform. RAV was displayed for 6 regions (F3–C3, F4–C4, C3–T3, C4–T4, P3–O1, P4–O2). For decreasing RAV, the alarm criterion of a "clear and persistent worsening or new emergence" was defined as worsening by ≥1 grade versus the preceding 8- to 12-hour epoch (eg, from 3 [good] to 2 [fair]).

3. Decreasing ADR. Decreasing ADR was prespecified as a visually apparent decrement in the ADR trend. ADR was calculated using a moving average (2-minute window) of the ratio of 8 to 13Hz power (different from the 8–12Hz used for RAV calculations) divided by 1 to 4Hz band power. Power was calculated by the squared magnitude of the EEG signal Fourier transform. Separate ADR trends were computed for each hemisphere and displayed as overlapping lines of different colors to facilitate assessment of hemispheric asymmetry. For decreasing ADR, the alarm criterion of a "clear and persistent worsening or new emergence" was defined to be a visually apparent decrease over one or both hemispheres of (1) approximately 10% below baseline persisting for at least 6 consecutive hours or (2) at least 50% below baseline for 1 or more hours, compared to the most recent epoch, as adapted from the retrospectively derived cutoffs of Claassen et al. This criterion was applied in clinical practice based on visual analysis rather than explicit calculations.

4. INCREASING EAs. EAs were prespecified as sporadic epileptiform discharges, LRDA, LPD, or GPD, defined according to the 2012 Standardized American Clinical Neurophysiology Society (ACNS) ICU EEG terminology. For an increase in EAs, the alarm criterion of a "clear and persistent worsening or new emergence" was defined as appearance of a pattern absent in prior epochs (new emergence), or increase in the ACNS-defined prevalence of the pattern, for example, from "occasional" LPDs (1–9% of an epoch) to "frequent" (10–49% of an epoch). EEG report relied on expert visual interpretation of the EEG data as a gold standard. For example, the alarm criterion of a "clear and persistent worsening or new emergence" is qualitative in the case of EEG focal slowing or dropout of fast activity and is semiquantitative but still reliant on expert visual pattern recognition for decreasing ADR and epileptiform abnormalities. We prespecified expert visual review rather than computational analysis for the following reasons: (1) artifacts require verification by raw EEG (eg, to identify blinking inducing delta waves or breach rhythms), (2) generalization to other clinical practices requires an undistorted clinical workflow practicable at other institutions, and (3) expert visual analysis of EEG in SAH has yet to be matched by computer algorithms.

We promoted interrater reliability in several ways. First, guidelines for reporting EEGs in patients with SAH were developed specifically for this purpose. Educational sessions were held to instruct clinicians on applying the rules before their implementation. Institutional guidelines were posted in the EEG reading area, referred to frequently, and ultimately published in a methodologic article available to the clinical neurophysiology community. Additionally, weekly clinical conferences were attended by clinical neurophysiologists to review raw and quantitative EEG data as a group to maintain consistency. Finally, attending physicians reviewed EEG data regularly with clinical trainees to promote consistent application of the EEG guidelines' criteria.

Missing cEEG data (periods of interrupted or uninterpretable EEG) were handled using a carry-forward method; an alarm could not be coded until explicitly recorded in the clinical report.

**Primary Outcome Reference Standard**

We defined the primary outcome as the first DCI event. In STARD terminology, determination of DCI is the reference...
DCI was determined based on a recent consensus definition\(^\text{17}\) as: neurologic deficit or \(\geq 2\)-point decrement of the Glasgow Coma Scale (GCS) persisting for \(\geq 1\) hour, not attributable to other causes, including rerupture, hydrocephalus, elevated intracranial pressure, procedure-related complications, seizures, or systemic or metabolic abnormalities; or infarction on follow-up computed tomography or magnetic resonance imaging. EEG alarms not followed by DCI were considered false positives; alarms followed by DCI were considered true positives. Late EEG alarms (occurring after DCI) or absent EEG alarms despite a DCI event were considered false negatives.

DCI was determined by a prespecified blinded consensus review using a multistep process: (1) independent medical record review (by authors E.S.R., M.B.W., S.F.Z.) blinded to cEEG findings and (2) adjudication in cases of disagreement. Separate daily team interviews were performed to ensure that limitations in medical record documentation did not lead to missed events.

**Other Clinical Testing**

We used a composite admission risk score\(^\text{24}\) for baseline risk stratification in our multistate survival model. We assessed daily transcranial Doppler ultrasound (TCD) velocities for comparison, using institutional peak systolic velocity (PSV) thresholds for mild (\(>200\text{cm/s}\)), moderate (\(>250\text{cm/s}\)), or severe (\(>300\text{cm/s}\)) vasospasm.

**Prespecified Measures of Diagnostic Accuracy**

The prespecified primary statistical measures were the diagnostic sensitivity and specificity of cEEG for predicting DCI. Secondary outcome measures were odds ratios (ORs) for DCI for 2 cEEG alarm subtypes (background changes and epileptiform findings) and the latency from cEEG alarm to DCI.

**Exploratory Analysis**

We additionally explored the association of EEG alarm subtypes with DCI neurologic event subtypes.

**Post Hoc Analysis for Bias**

We examined the baseline characteristics of patients excluded from the study due to lacking sufficient cEEG (\(\geq 72\) hours) as prespecified by the inclusion criteria, such that the index test could not adequately be assessed (n = 88; see Fig 1). We compared both baseline illness severity (age, modified Fisher radiologic grade, HH clinical grade, and composite admission risk score) between these patients and the subjects who were enrolled. In addition to examining baseline characteristics, we examined rates of early withdrawal of life-sustaining therapy (WLST; within 3 days of admission) that would prevent sufficient cEEG from being performed.

**Post Hoc Analysis for Confounding**

We examined the frequency with which antiseizure medications, anesthetic infusions, and vasopressors were added, increased, or decreased during the baseline period and during the EEG alarm period, to ascertain the impact of management on state transitions. We defined dose or infusion rate increases or decreases as a change of at least 50%, or an increase in medication administration frequency (eg, from every 12 hours to every 8 hours), compared to the dose or frequency at the beginning of the baseline or EEG alarm state. Infusion changes were required to persist for at least 2 hours.

**Statistical Analysis**

Baseline characteristics in patients with and without DCI were compared utilizing \(t\) tests and Fisher exact tests. We used 1-tailed tests for radiologic grade, clinical grade, composite admission risk score, and EEG monitoring duration because prior literature\(^\text{19,24}\) suggests both symptomatic vasospasm and poor long-term outcome are positively associated with these factors. We used 2-tailed tests for age, gender, aneurysm management technique, and time from symptom onset to starting cEEG because no literature consistently associates DCI with these factors.

We measured the univariate time-dependent association between the following findings and subsequent DCI: (1) any documented EEG alarm; (2) EEG alarms due to worsening slowing, ADR, or RAV; (3) EEG alarms due to new epileptiform abnormalities; and basic sonographic findings of (4) mild (PSV > 200 cm/s), (5) moderate (PSV > 250 cm/s), and (6) severe vasospasm (PSV > 300 cm/s). Fisher exact test \(p\) values, OR values, and OR 95% confidence intervals were calculated for baseline characteristics.

A multistate survival analysis model,\(^\text{25}\) adjusted for baseline composite admission risk score,\(^\text{24}\) was prespecified as the statistical measure assessing the time-dependent probability of DCI following SAH onset. In our analysis, patients occupy 1 of 3 states at any given time (Fig 2A). Patients begin in the baseline state. Patients with an EEG alarm but without DCI are in the alarm state. Patients who suffer a DCI event are in the DCI state. Transitions are allowed only in one direction. This is known as an “illness–death” model, with “illness” and “death” corresponding to the alarm and DCI states.\(^\text{26,27}\) The proportional hazard assumption on state transitions was checked graphically.\(^\text{27}\) We assumed that the baseline composite admission risk score affects all 3 transitions, but each transition has a unique hazard rate function. Although cEEG monitoring duration varied (see Fig 2B), we did not treat data as censored because: (1) all DCI events occurred during or within 24 hours of cEEG monitoring; and (2) DCI is a clinical diagnosis, independent of cEEG. All events were defined with respect to the final state of the patients 20 days after SAH onset (ie, DCI or no DCI). True positive predictions were defined as cases in which an EEG alarm preceded a diagnosis of DCI, that is, a baseline→alarm→DCI state transition sequence. Missed events were cases with DCI without a preceding EEG alarm, that is, a baseline→DCI transition sequence. False alarms were cases with an EEG alarm reported without subsequent DCI, that is, a baseline→alarm transition sequence. Using this method, sensitivity and specificity were calculated for patients with a low, medium, and high composite admission risk score.
In addition to sensitivity and specificity, we calculated these measures of test performance: positive predictive value (PPV), negative predictive value (NPV), false positive rate (1 - specificity), positive likelihood ratio, negative likelihood ratio, diagnostic OR, pretest probability of DCI, absolute risk increase (ARI) after a positive test result, absolute risk decrease after a negative test result, and the number needed to monitor to successfully predict 1 additional DCI event (1/ARI). We estimated these statistics for patients with low, medium, and high composite admission risk scores (score = 1, 2.5, 4, respectively).

To quantify the precision of our estimates, we calculated Bayesian 95% credible intervals (CIs) via 10,000 rounds of bootstrapping, as follows. Bootstrapping was performed by sampling with replacement from the 103 time-to-event entries in our data (1 row per case in the cohort), with equal probabilities of drawing each case. Bootstrap samples each had the same number of entries (103) as the original dataset. For each bootstrap sample, we fit a full multistate survival model, and obtained values for the parameters for the performance measures for patients with low, intermediate, or high composite admission risk score. In this way, we obtained 10,000 bootstrap values for each of the statistics reported in Table 3. The 10,000 samples can be interpreted as forming an approximate, nonparametric posterior distribution for each parameter. The 95% CI was then computed from each posterior distribution as the narrowest interval, that is, the interval of highest probability density (including the mode of the distribution) containing 95% of the total probability mass.

We carried out analyses using the mstate package28 in R (The R Foundation) and Statistics Toolbox in MATLAB (MathWorks, Natick, MA).

Results

Of 227 consecutive patients screened (April 2013 to November 2015), 103 met criteria (75.7% women, mean age = 57.7 years; Table 1) and were enrolled. Fifty-two (50.5%) developed DCI (see Fig 1). Patients with DCI had higher baseline mFS, HH, and composite admission risk scores (see Table 1). Subjects with and without DCI did not differ statistically in age, gender, or proportion undergoing endovascular aneurysm management. Patients who were excluded due to insufficient EEG (Supplementary Table S2; n = 88) did not differ in illness severity (age, modified Fisher radiologic grade, HH clinical grade, or the composite admission risk score). Patients with early WLST were unlikely to undergo the index test; 21 (23.9%) of the 88 patients not enrolled had early WLST, whereas none of the 103 subjects enrolled had early WLST (p < 0.0001).

Most DCI events were preceded by EEG alarms (see Fig 2). EEG alarms were documented in 60 patients. Of these, 50 preceded DCI, and 10 were false positives. Forty-three patients had no EEG alarms; 41 were true negatives, and 2 developed DCI without a preceding EEG alarm. From these numbers, unadjusted sample statistics for cEEG as a predictor for DCI were: sensitivity, 96.2%; specificity, 80.4%; PPV, 83.3%; and NPV, 95.4%.

We examined the predictive value of prespecified EEG alarm subtypes (Table 2). Background deterioration (new slowing, decreasing ADR, or decreasing RAV) strongly predicted DCI (63.5% vs 17.7%; OR 9.11,
TABLE 1. Patient Characteristics

<table>
<thead>
<tr>
<th>Characteristic</th>
<th>DCI, n = 52</th>
<th>No DCI, n = 51</th>
<th>p</th>
</tr>
</thead>
<tbody>
<tr>
<td>Age, yr, mean ± SD</td>
<td>59.6 ± 14.6</td>
<td>55.8 ± 12.7</td>
<td>0.16</td>
</tr>
<tr>
<td>Female, %</td>
<td>82.7</td>
<td>68.6</td>
<td>0.11</td>
</tr>
<tr>
<td>Modified Fisher scale, mean ± SD</td>
<td>3.3 ± 0.5</td>
<td>3.1 ± 0.3</td>
<td>0.03</td>
</tr>
<tr>
<td>Hunt and Hess grade &gt; 3, %</td>
<td>50.0</td>
<td>21.6</td>
<td>&lt;0.01</td>
</tr>
<tr>
<td>Composite admission risk score ± SD</td>
<td>2.4 ± 0.82</td>
<td>2.0 ± 0.8</td>
<td>0.01</td>
</tr>
<tr>
<td>Aneurysm location, %</td>
<td></td>
<td></td>
<td>0.42</td>
</tr>
<tr>
<td>Anterior cerebral artery</td>
<td>28.9</td>
<td>30.8</td>
<td></td>
</tr>
<tr>
<td>Middle cerebral artery</td>
<td>19.2</td>
<td>7.7</td>
<td></td>
</tr>
<tr>
<td>Internal carotid artery</td>
<td>19.2</td>
<td>13.5</td>
<td></td>
</tr>
<tr>
<td>Posterior communicating artery</td>
<td>17.3</td>
<td>19.23</td>
<td></td>
</tr>
<tr>
<td>Vertebobasilar and posterior cerebral artery</td>
<td>11.5</td>
<td>17.3</td>
<td></td>
</tr>
<tr>
<td>Other</td>
<td>3.9</td>
<td>9.6</td>
<td></td>
</tr>
<tr>
<td>Endovascular aneurysm management, %</td>
<td>48.1</td>
<td>58.8</td>
<td>0.32</td>
</tr>
<tr>
<td>EEG monitoring start time, days after SAH onset ± SD</td>
<td>1.5 ± 0.9</td>
<td>1.5 ± 1.3</td>
<td>0.99</td>
</tr>
<tr>
<td>EEG monitoring duration, days, mean ± SD</td>
<td>9.1 ± 3.3</td>
<td>6.3 ± 2.4</td>
<td>&lt;0.01</td>
</tr>
<tr>
<td>Time of DCI, days after SAH onset, mean ± SD</td>
<td>6.6 ± 2.4</td>
<td>—</td>
<td>—</td>
</tr>
</tbody>
</table>

DCI = delayed cerebral ischemia; EEG = electroencephalographic; SAH = subarachnoid hemorrhage; SD = standard deviation.

95% CI = 3.25–20.2, p < 0.01). EEG alarms due to new or worsening epileptiform abnormalities showed a stronger association (63.5% vs 7.84%, OR = 20.4, 95% CI = 6.36–65.5, p < 0.01). A post hoc analysis of background deterioration showed that RAV had a particularly low false positive rate (2%) and the highest OR within the subtypes of EEG background deterioration. Deterioration of the raw EEG alone was reported in only

TABLE 2. Univariate Association between Time-Dependent Predictors and Subsequent DCI

<table>
<thead>
<tr>
<th>Predictor</th>
<th>DCI, n = 52</th>
<th>No DCI, n = 51</th>
<th>OR (95% CI)</th>
<th>p</th>
</tr>
</thead>
<tbody>
<tr>
<td>Any EEG alarm documented</td>
<td>96.2%</td>
<td>19.6%</td>
<td>102.5 (21.3–494)</td>
<td>&lt;0.01</td>
</tr>
<tr>
<td>Worsening slowing, ADR, or RAV</td>
<td>63.5%</td>
<td>17.7%</td>
<td>8.11 (3.25–20.2)</td>
<td>&lt;0.01</td>
</tr>
<tr>
<td>Worsening focal slowing</td>
<td>15.4%</td>
<td>7.8%</td>
<td>2.14 (0.60–7.60)</td>
<td>0.19</td>
</tr>
<tr>
<td>Worsening ADR</td>
<td>32.7%</td>
<td>9.8%</td>
<td>4.47 (1.50–13.3)</td>
<td>&lt;0.01</td>
</tr>
<tr>
<td>Worsening RAV</td>
<td>42.3%</td>
<td>2.0%</td>
<td>36.7 (4.70–286.11)</td>
<td>&lt;0.01</td>
</tr>
<tr>
<td>New epileptiform abnormality</td>
<td>63.5%</td>
<td>7.84%</td>
<td>20.4 (6.36–65.5)</td>
<td>&lt;0.01</td>
</tr>
</tbody>
</table>

Sonographic vasospasm

<table>
<thead>
<tr>
<th>Predictor</th>
<th>DCI, n = 52</th>
<th>No DCI, n = 51</th>
<th>OR (95% CI)</th>
<th>p</th>
</tr>
</thead>
<tbody>
<tr>
<td>Maximum PSV &gt; 200cm/s</td>
<td>75.0%</td>
<td>45.1%</td>
<td>3.65 (1.58–8.42)</td>
<td>&lt;0.01</td>
</tr>
<tr>
<td>Maximum PSV &gt; 250cm/s</td>
<td>57.7%</td>
<td>33.3%</td>
<td>2.73 (1.2–6.1)</td>
<td>0.01</td>
</tr>
<tr>
<td>Maximum PSV &gt; 300cm/s</td>
<td>30.8%</td>
<td>19.6%</td>
<td>1.80 (0.73–4.52)</td>
<td>0.14</td>
</tr>
</tbody>
</table>

ARD = alpha-to-delta ratio; CI = confidence interval; DCI = delayed cerebral ischemia; EEG = electroencephalographic; OR = odds ratio; PSV = transcranial Doppler ultrasound peak systolic velocity; RAV = relative alpha variability.
15.4% of patients with subsequent DCI, whereas the overall rate of background abnormalities rose to 63.5% when including all 3 indicators of background deterioration. Background deterioration and epileptiform alarm subtypes were also synergistic; detection of any EEG alarm conferred substantially higher risk (96.2% vs 19.6%, OR \(5^{102.5, 95\% \text{ CI}} = 21.3–494, p < 0.01\)).

For comparison, we examined the association of TCD vasospasm with DCI (see Table 2). Mild vasospasm (PSV > \(200\text{ cm/s}\)) was significantly more common in DCI cases (75.0% vs 45.1%); however, compared with EEG, the association was substantially weaker (OR 3.65, 95% CI \(5^{1.58–8.42, p < 0.01}\)). Moderate vasospasm (PSV > \(250\text{ cm/s}\)) predicted DCI weaklier (57.7% vs 33.3%, OR = 2.73, 95% CI = 1.2–6.1, \(p = 0.01\)). Severe vasospasm (PSV > \(300\text{ cm/s}\)) was not a significant predictor (30.8% vs 19.6%, OR = 1.80, 95% CI = 0.73–4.52, \(p = 0.14\)).

To investigate diagnostic accuracy accounting for time dependence, monitoring duration, and baseline risk, we fit a multistate survival model to the time-to-event data, using the composite admission risk score as a baseline covariate. Table 3 reports the resulting diagnostic accuracy, estimated from the proportion of patients predicted to be in each state 20 days after SAH. The plots in Figure 3 show how these values arise from the evolution of state probabilities (see Fig 3A–C). Transitions to the EEG alarm state begin around day 2; transitions to DCI begin around day 3. State transitions cease by day 15. In high-risk patients, the high prevalence of DCI (79%, 95% CI = 61–92) and high PPV of EEG alarms (94%, 95% CI = 79–100) arise from a high rate of transitions to the alarm state and from nearly all patients with alarms subsequently transitioning to DCI. Conversely, for low-risk patients, the low DCI prevalence (37%, 95% CI = 25–50) and lower PPV (76%, 95% CI = 58–90) arise from a lower rate of transitions into the alarm state and from some patients of low admission risk with EEG alarms never developing DCI. Similar considerations explain the higher NPV of EEG alarms for patients with low (94%, 95% CI = 87–99) compared to those with high baseline risk (81%, 95% CI = 47–97).

The model also assigns a time-dependent risk of DCI, individualized by baseline admission risk and the specific time a cEEG alarm (if any) is reported (see Fig 3D–F). Of the low-risk subgroup (composite admission risk score = 1), 0% had an HH score of 4–5 at admission, whereas 86% of the high-risk subgroup (composite admission risk score = 4) had an HH score of 4–5 at admission.

The number needed to monitor to predict 1 additional case of DCI (NNM) ranged from 2.6 among patients with low admission risk, to 6.7 among those at high risk

<table>
<thead>
<tr>
<th>Measure</th>
<th>Low Risk</th>
<th>Medium Risk</th>
<th>High Risk</th>
</tr>
</thead>
<tbody>
<tr>
<td>Sensitivity, %</td>
<td>91 (81–98)</td>
<td>94 (88–99)</td>
<td>95 (87–99)</td>
</tr>
<tr>
<td>Specificity, %</td>
<td>83 (71–93)</td>
<td>80 (69–90)</td>
<td>77 (36–99)</td>
</tr>
<tr>
<td>LR(^+)</td>
<td>5.37 (3.1–13.2)</td>
<td>4.7 (3.0–9.8)</td>
<td>4.2 (1.5–66.3)</td>
</tr>
<tr>
<td>LR(^-)</td>
<td>0.1 (0.02–0.24)</td>
<td>0.08 (0.02–0.15)</td>
<td>0.06 (0.01–0.22)</td>
</tr>
<tr>
<td>PTP, %</td>
<td>37 (25–50)</td>
<td>58 (50–66)</td>
<td>79 (61–92)</td>
</tr>
<tr>
<td>ARI, %</td>
<td>39 (26–51)</td>
<td>29 (21–36)</td>
<td>15 (4–28)</td>
</tr>
<tr>
<td>PPV, %</td>
<td>76 (58–90)</td>
<td>87 (79–94)</td>
<td>94 (79–100)</td>
</tr>
<tr>
<td>ARR, %</td>
<td>32 (20–43)</td>
<td>48 (39–57)</td>
<td>60 (30–77)</td>
</tr>
<tr>
<td>NPV, %</td>
<td>94 (87–99)</td>
<td>90 (81–98)</td>
<td>81 (47–97)</td>
</tr>
<tr>
<td>DOR</td>
<td>52 (16–448)</td>
<td>57 (24–321)</td>
<td>69 (8–4204)</td>
</tr>
<tr>
<td>NNM</td>
<td>2.6 (2.0–3.8)</td>
<td>3.5 (2.8–4.8)</td>
<td>6.7 (3.6–25.3)</td>
</tr>
</tbody>
</table>

Statistical measures given in the table as parameter estimate (Bayesian 95% credible interval) are determined using multistate survival analysis. Low, medium, and high baseline risk levels correspond to composite admission risk scores of 1, 2.5, and 4.

ARI = absolute risk increase; ARR = absolute risk reduction; DOR = diagnostic odds ratio; LR = likelihood ratio; NNM = number needed to monitor (1/ARI); NPV = negative predictive value; PPV = positive predictive value; PTP = pretest probability.
The lower NNM in low-risk, noncomatose patients reflects the larger change from pre- to posttest probability when an EEG alarm occurs (ARI = 39%) compared with a high-risk patient (ARI = 15%).

The latency from an EEG alarm to DCI in true positive cases ranged from 30 minutes to 9.1 days (median = 1.9 days, interquartile range = 0.9–4.1; Fig 4) and exceeded 12 hours in 82% of cases (n = 41).

Clinical presentations for the 52 DCI events varied. Presenting signs occurring in isolation were new or worsening focal weakness (38%, n = 20), decline in level of consciousness (LOC; 33%, n = 17), or aphasia (8%, n = 4). DCI was silent in 4 cases, discovered incidentally upon neuroimaging. DCI presented in 7 cases (13%) with combinations of signs, including focal weakness plus either decreased LOC (n = 4), infarction on imaging (n = 1), aphasia (n = 1), or decreased LOC accompanied by a new radiologic infarct (n = 1).

Figure 5 categorizes EEG findings preceding DCI among the 50 true positive cases by EEG alarm subtypes (see Table 3).
and DCI subtypes. More than 1 EEG feature of worsening was often present; focal EEG abnormalities were evident for most true positive DCI predictions, including 18 of 27 (67%) with focal weakness, 17 of 22 (77%) with decline in LOC, all 6 (100%) with radiologic infarction, and 4 (80%) of 5 with aphasia. Among true positive alarms from epileptiform abnormalities (n = 33), most (82%, n = 27) were in patients without prior epileptiform activity; the rest were due to increasing frequency of epileptiform discharges or periodic patterns (eg, from 1Hz to 2Hz; n = 4, 12%), or increasing prevalence (eg, from intermittent to continuous; n = 3, 9%). Although status epilepticus prior to enrollment was an exclusion criterion for the study, 1 patient developed status epilepticus during the study period, which was nonconvulsive. In this patient, the last seizure recorded was 5 days before an EEG alarm, and the EEG alarm in this patient was due to background deterioration rather than epileptiform activity.

The 2 undetected (false negative) DCI events included 1 patient developing left hemiparesis that was transient but long enough to meet the DCI consensus definition, and 1 with re-emergence of leg weakness that had been present days prior.

There was no association to suggest that state transitions (baseline to alarm, or alarm to DCI) were due to adding, increasing, or decreasing antiseizure medications, anesthetic infusions, or vasopressor infusions (Supplementary Table S3). On the contrary, the only apparent association that reached statistical significance was that patients who transitioned from baseline to the alarm state were less likely to have had new antiseizure medications started compared with patients who did not have EEG deterioration (6.67% vs 23.3%, p = 0.02). These results suggest that changes in medications do not cause the baseline to alarm or alarm to DCI state transitions.

Discussion
This prospective study, performed according to STARD criteria, demonstrates that cEEG monitoring accurately predicts DCI following SAH. Routine reporting of visually identified EEG features (new or worsening ADR trends, RAV trends, focal slowing, epileptiform discharges, or rhythmic and periodic patterns) showed...
excellent sensitivity and high specificity across baseline risk levels. The number of patients needed to monitor to predict one additional case of DCI prior to clinical symptoms was between 3 and 7.

cEEG predicted DCI over 24 hours before clinical symptoms in the majority of cases, prospectively validating findings from previous retrospective studies8,29 and demonstrating the opportunity for cEEG to aid early detection of and rescue from impending secondary brain injury. We speculate that early cEEG findings that predict DCI represent a presymptomatic early phase of subclinical ischemia ultimately becoming persistent or severe enough to manifest. One mechanism by which this may occur is through cortical spreading depolarizations, which may manifest in intracranial EEG as transient electrographic suppressions associated with local transient brain tissue hypoxia, ultimately culminating in infarction when spreading depolarizations are repeated over time, cluster, or occur in the setting of vasospasm or hypotension.15,30

An important secondary finding is that EEG predicts DCI with greater sensitivity and specificity than TCD criteria employing absolute velocities, which identify DCI with poor sensitivity,31 late detection,10 and high false positive rates.9 TCD interrogates vascular supply alone, whereas the “supply-demand mismatch model”32 of DCI pathogenesis posits that when increased metabolic demand due to depolarizing events (eg, spreading depolarization or epileptiform activity) exceeds the blood supply due to ischemia or vascular dysfunction (eg, large- and small-vessel vasospasm, microthrombosis, inflammation, or inverse neurovascular coupling), a mismatch in neuronal metabolism occurs. This mismatch might cause epileptiform activity to progress toward and limit recovery from spreading depolarizations,30 triggering toxic intracellular changes, additional depolarizing events, and ultimately neuronal death, infarction, and disability.

Although using the entire battery of prespecified EEG features produced the best predictions, late appearing epileptiform abnormalities were especially strong predictors of DCI. This new finding, together with the experience that seizures occur later following SAH than after other neurocritical care illnesses,33 raises the possibility that some DCI cases may reflect seizures detectable by invasive but not scalp electrodes.34 Another consideration is that secondary ischemic brain injury may both cause and be caused by epileptiform activity via either spreading depolarizations or direct metabolic strain.11–14,35 Biophysical models of ischemia suggest epileptiform discharges may arise from selective ischemic vulnerability of inhibitory neurons, yielding disinhibition of glutaminergic pyramidal cells and a feed-forward cycle of excitation.36 The current study raises the hypothesis that preventing DCI might be possible in some cases by pharmacologically suppressing epileptiform EEG abnormalities or by augmenting cerebral perfusion and oxygen delivery.

EEG changes predicted DCI despite pathology that was often severe at admission (early infarcts, intracerebral hematoma, etc), which can disturb EEG recordings such that detecting further deterioration might seem difficult (ie, a “floor” effect). Nevertheless, our findings suggest that both low- and high-risk patients do usually first exhibit EEG deterioration prior to developing DCI.

Several limitations apply to our study. First, we were only able to evaluate the diagnostic performance of the index test among patients undergoing sufficient cEEG. However, the composite admission risk score and its subscores were not systematically associated with the probability of undergoing the index test itself (see Supplementary Table S2). Moreover, we have shown through stratified analysis that EEG deterioration predicted DCI independent of the composite admission risk score. These findings suggest that our results are unlikely to be biased by excluding patients who did not undergo sufficient EEG monitoring. Although patients not undergoing the index test had a high rate of undergoing early WLST, this did not occur in those undergoing the index test, possibly due to the requirement of cEEG lasting beyond this 3-day period. Second, interventions in response to EEG changes were not standardized. Nevertheless, we found no evidence that state transitions (baseline to alarm, or alarm to DCI) were caused by changes in antiseizure, anesthetic, or vasopressor medications. Third, this was a single center study, although our findings are concordant with prior retrospective studies.8,9 To ensure consistent application across centers in the future, a curriculum and certification test may help ensure uniform implementation, interrater agreement, and replication. Fourth, we did not perform routine neuroimaging; imaging was performed at clinicians’ discretion. This limitation is partly balanced by the observation that DCI does not entirely overlap with imaging findings; some patients have clinical worsening without radiologic infarction, potentially due to successful interventions,3 whereas others have silent radiologic infarction.37 Fifth, we did not routinely perform invasive EEG, and could not detect seizures lacking manifestations in scalp EEG34,35 or cortical spreading depolarizations,38 which may underlie DCI events. Sixth, the latency from EEG alarm to DCI exceeded 2 days in 50% of cases. Our data do not discriminate between a biological explanation for such prolonged latencies such as an early presymptomatic phase of DCI versus a more mundane explanation,

Rosenthal et al: EEG Accurately Predicts DCI
delayed bedside recognition of DCI due to coma. Seventh, it is possible that information from cEEG reports increased the vigilance of the neurocritical care team documenting neurologic examinations. However, DCI was not determined by the clinical team; rather DCI was determined by blinded investigators employing strict criteria for focal neurologic changes, persistent GCS decline, and radiologic infarcts. Additionally, most DCI events occurred >36 hours after an EEG alarm, suggesting that EEG alarms did not influence examination findings. Similarly, EEG more accurately predicted DCI events than TCD velocities, which were also available to treating clinicians. Sharing of information in the opposite direction through awareness of clinical changes by the clinical neurophysiology team is not a possible source of bias; EEG alarms were required to precede clinical and radiologic DCI events to be considered true positive predictions. Eighth, treating physicians may have prevented DCI in some cases by modifying treatment following EEG alarms. However, our institutional guideline recommended treatment for DCI, not for cEEG alarms in isolation. Additionally, if clinicians did treat cEEG alarms, then the excellent performance statistics we found for cEEG are conservative; interventions following alarms that prevented DCI would have produced false alarms. Finally, although prior literature suggests that DCI triples the odds of poor long-term outcomes, we did not independently investigate the impact of DCI detected by cEEG on long-term outcome; rather, our study was limited to assessing the diagnostic accuracy of cEEG for predicting DCI.

Delayed diagnosis of DCI remains a major challenge in SAH management. Evidence supports the concept of hemodynamic or endovascular rescue therapy, but clinical efficacy depends critically on early detection. Our data suggest that reliance on serial neurologic examinations and vascular studies, the current standard of care, could lead to delays and missed opportunities for medical intervention, while failing to measure additional pathophysiologic mechanisms that result in neuronal injury. cEEG monitoring might enable more timely identification of impending DCI before irreversible injury ensues, focusing clinical interventions and clinical trials on patients at greatest risk of secondary brain injury and poor long-term outcomes.

Acknowledgment
This work was supported by the Andrew David Heitman Neuroendovascular Research Foundation, NIH/NINDS 1K23NS090900-01 and NIH/NINDS 1K23NS109590-01, and the Phyllis & Jerome Lyle Rappaport Foundation.

We thank the nurses, technologists, clinical fellows, and faculty who contributed to this study.

Author Contributions

Potential Conflicts of Interest
Nothing to report.

References


