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Abstract. Large vessel occlusion (LVO) stroke might cause different degrees of hemodynamic impairment that affects microcirculation and contributes to metabolic derangement. Time-domain near-infrared spectroscopy (TD-NIRS) estimates the oxygenation of microcirculation of cerebral outer layers. We measure hemoglobin species and tissue oxygen saturation (StO2) of anterior circulation stroke patients, classified as LVO or lacunar, and assess the differences compared with controls and according to LVO recanalization status. Fiducial markers categorize the brain region below each TD-NIRS probe as ischemic or nonstroke areas. The study includes 47 consecutive acute ischemic stroke patients and 35 controls. The ischemic area has significantly higher deoxy-hemoglobin (HbR) and total hemoglobin (HbT) compared with controls in both recanalized and nonrecanalized patients. Recanalized patients have significantly lower mean StO2 in the ipsilateral hemisphere compared with nonrecanalized patients. This is the first study to report TD-NIRS measurements in acute ischemic stroke patients. TD-NIRS is able to detect significant differences in hemoglobin species in LVO stroke compared with controls and according to recanalization status. This preliminary data might suggest that StO2 can serve as a surrogate functional marker of the metabolic activity of rescued brain tissue. © The Authors. Published by SPIE under a Creative Commons Attribution 4.0 Unported License. Distribution or reproduction of this work in whole or in part requires full attribution of the original publication, including its DOI. [DOI: 10.1117/1.NPh.6.1.015003]

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1 Introduction

Acute ischemic stroke is a highly dynamic condition. Indeed, large vessel occlusion (LVO) might cause different degrees of hemodynamic impairment that result in complex interplay between LVO, collateral status, and clinical symptomatology. The study of microcirculation, which is the site of cerebral autoregulation and neurovascular coupling, might be a valuable strategy to improve our insight in this field. The concept of the neurovascular unit is one of the key elements of stroke pathophysiology. It has been shown that capillary flow patterns undergo profound changes in cerebral ischemia and affect local oxygen delivery.1 Modifications in the capillary bed contribute to the neurovascular dysfunction and to the metabolic derangement in the ischemic tissue, where tissue survival depends on oxygen extraction to compensate for the reduced perfusion. Other factors such as involvement of small cerebral veins and the role of the rete vasorum remain undefined.4 In addition, secondary changes may develop in ipsilateral hemisphere outside the ischemic area and in the contralateral hemisphere as well. The alteration of regional cerebral blood flow and metabolism in the contralateral hemisphere has been reported.1,3 Near-infrared spectroscopy (NIRS) is an optical technique that provides information about oxygenation in the microcirculation of cerebral outer layers.6,7 Furthermore, it is a noninvasive, safe, and portable methodology that enables real-time monitoring at the bedside of the patient.5,7 Technical advances have overcome some limitations of the previous NIRS systems. Indeed, the contamination from the extra-cerebral layers and the possibility to retrieve only relative changes with respect to a baseline were the most limiting drawbacks of the continuous-wave NIRS (CW-NIRS) technique.8 Advanced optical techniques, such as time-domain NIRS (TD-NIRS) and frequency-domain (FD)-NIRS, allow to recover the absolute concentrations of hemoglobin species and to better separate the contribution of the extra-cerebral layers from the brain cortical ones.6 In particular, in TD-NIRS with single source–detector pair, the effect of extra-cerebral layers can be marginal even if fitting with homogeneous model is used.9 Therefore, the estimation of brain optical properties is less dependent on the superficial layers. Of course, the use of a multidistance approach and of a priori information on the head anatomy could further improve the accuracy of the estimate, at the cost of increased complexity of the approach. A recent study reported TD-NIRS measurements of cerebral deoxyhemoglobin (HbR), oxyhemoglobin (HbO), total hemoglobin (HbT = HbR + HbO), and tissue oxygen saturation (StO2 = HbO/HbT) values of healthy subjects, demonstrating the reproducibility of results.10 The study of the cerebral microcirculation by means of cerebral time-domain near infrared spectroscopy (TD-NIRS) could inform about the effect of LVO. The vast majority of studies in ischemic stroke patients have used CW-NIRS,11-17 whereas only few were performed with FD-NIRS.18,19 In addition, in all but one

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previous studies, recordings were limited to the forehead of the subjects, irrespective of the site of ischemic area.

The aim of this prospective study was to evaluate the concentration of hemoglobin species and \( \text{StO}_2 \) as measured by TD-NIRS in acute ischemic stroke patients, examining both ischemic and nonstroke brain areas. In addition, we assessed the presence of differences compared with control subjects and according to LVO recanalization status.

2 Methods

The study received approval by the Institutional Ethical Committee and by the Ministry of Health and was conducted in compliance with the Declaration of Helsinki. An informed consent was obtained from both patients and controls. We prospectively enrolled consecutive acute ischemic stroke patients with the following inclusion criteria: (a) involvement of the anterior circulation, (b) able to perform TD-NIRS measurements within 24 h from stroke onset, and (c) absence of respiratory insufficiency or need of \( \text{O}_2 \)-therapy at the time of the measurements. Patients underwent clinical and neuroimaging evaluation as per standard of care for acute stroke patients including National Institute of Health Stroke Scale (NIHSS) assessment, brain computed tomography (CT) or magnetic resonance (MR), CT or MR angiography, digital subtraction angiography, and transcranial Doppler ultrasonography. At baseline, stroke subtypes were classified according to the Oxfordshire Community Stroke Project Classification (OCSP) in partial/total anterior circulation syndrome (PACS/TACS) and lacunar syndrome (LACS). Neurovascular imaging performed at baseline assessed LVO, and follow-up imaging assessed recanalization status.

Patients with PACS/TACS were divided into two groups: (i) recanalized LVO including patients with recanalization either spontaneous or subsequent to treatment [recombinant tissue plasminogen activator (rtPA) and/or mechanical thrombectomy] and (ii) nonrecanalized LVO.

To avoid any delay in treatment, for patients eligible for the recanalization procedure (rtPA and/or thrombectomy), TD-NIRS recording was performed afterward. Baseline OCSP clinical syndromes classification was confirmed as OCSP infarcts classification by follow-up neuroimaging. Subjects older than 65 years were selected as a control group from a cohort of healthy volunteers described in a previous study.

TD-NIRS measurements were performed in the Stroke Unit, at the bedside of the patient, in condition of dimmed light, with the patient resting with an angle-of-bed inclination of 30 deg. Arterial blood pressure and peripheral pulse oximetry (\( \text{SpO}_2 \)) were acquired during each recording session.

TD-NIRS measurements were obtained in both controls and patients by placing a pair of illuminating and collecting optical fibers (i.e., an optical probe) in selected standard positions of frontal, central, and parietal brain regions of each hemisphere using an EEG cap (g.EEGcap, g.tec medical engineering GmbH, Austria) according to the 10-10 international positioning system (F3-F5, C3-C1, P3-P5 for the left hemisphere and F4-F6, C4-C2, P4-P6 for the right hemisphere). For stroke patients, additional positions of interest for optical probes were identified at baseline according to the OCSP classification combined with neuroimaging features [ischemic signs (ASPECTS) on baseline CT scan; site of large vessel involvement] and with arterial territory maps of human brain (Fig. 1). To classify the probed brain areas, we designed a cap equipped with fiducial markers on the same positions of the EEG cap used for TD-NIRS measurements (Fig. 2). By projecting orthogonal lines from the fiducial markers to the brain in 3-D reconstructed images (XERO® Viewer-Agfa HealthCare), we could classify the brain area underlying each position of the optical probe as ischemic or nonstroke area according to follow-up neuroimaging (Fig. 2). We discarded recordings with optical probe falling across two different areas (stroke and nonstroke) or on atrophic or past-injured tissue. Recordings were obtained from positions of interest on the affected hemisphere and the matched area on the contralateral hemisphere. The recording session consisted of three sets of measurements for each position of interest repeated at two time points: within 24 h of stroke symptoms onset (first time point) and after 24 h from the first time point up to 5 days (second time point).

![Fig. 1 Selection of positions for TD-NIRS measurement. Example of positions’ selection for TD-NIRS measurement in a patient with TACS. (a) baseline CT-scan showing indirect ischemic signs in the left hemisphere (white extracranial dots are the fiducial markers), (b) digital subtraction angiography showing occlusion of left middle cerebral artery (distal M1 tract), and (c) selected positions for TD-NIRS measurement (in light blue) on the 10-10 international positioning system.](https://www.spiedigitallibrary.org/journals/Neurophotonics.org)
2.1 Instrumentation and Data Acquisition

TD-NIRS data were acquired by means of a device designed and developed at the Department of Physics of Politecnico di Milano. The light sources are three pulsed diode lasers working at 690, 785, and 830 nm, respectively (mod. LDH series, PicoQuant GmbH, Germany) and at a 80-MHz repetition rate. Laser pulses are injected into the tissue by a multimode-graded index optical fibers (100/140 μm core/cladding diameter) paying attention in maintaining the power density below the maximum permissible exposure of 2 mW/mm² thanks to a spacer placed at the tip of the probe. Photons are collected from the tissue in reflectance mode by means of a custom-made three furcate fiber bundle made of graded index plastic fibers (1-mm core diameter, 0.29 NA; mod. OM-GIGA POF, Luceat Srl, Italy) and then detected by three hybrid photomultipliers (mod. HPM-100-50, Becker-Hickl GmbH, Germany), each dedicated to a specific wavelength using bandpass filters centered at 690, 785, and 830 nm (mod. Hard Coated OD4, 10 nm Bandpass Filters, Edmund Optics GmbH, Germany).

Finally, three time-correlated single photon counting boards acquire the distributions of photon time of flight that is the TD-NIRS signal or curves.

The instrument response function (IRF), obtained by facing the injection fiber with the collection fiber, features a full width at half maximum (FWHM) <200 ps.

2.2 Data Analysis

Quality control criteria described in details in a previous study were applied to data of stroke patients and control subjects. They included the number of detected photons, the minimization of the least square error between experimental data and theoretical model of photon diffusion ($\chi^2$), the reproducibility of measurement on a calibrated phantom, and the difference between the
temporal position of TD-NIRS experimental curves and the IRF ($\Delta t_{TDNIRS-IRF}$).

At each recording session, the values of HbR, HbO, HbT, and StO2 of every single position were averaged across the three sets of measurement. Final data for analysis consisted of grand averages of positions belonging to the ischemic area, to the ipsilateral nonstroke area, and to the contralateral nonstroke area.

Clinical and demographic variables were compared using a two-sided independent sample $t$-test for continuous normal variables, $\chi^2$ for categorical variables, and Mann–Whitney for nonparametric variables. Group comparisons for hemoglobin species (HbR, HbO, HbT) and StO2 were performed with a generalized linear mixed model using patient’s categories, brain regions, and time points as fixed effects and subjects as random effects. The correction for multiple testing was performed with

| Table 1 Characteristics of stroke patients. |
|--------------------------------------------|
|                                            |
| LACS ($n = 5$)                             | Recanalized LVO ($n = 18$) | Nonrecanalized LVO ($n = 18$) | $P^d$ |
| Age ($\text{y}$$^a$)                        | 75.4 ± 5.4                  | 76 ± 9.6                     | 76.3 ± 13.4       | 0.94 |
| Gender (M/F)                               | 1/4                         | 3/15                         | 5/13             | 0.42 |
| NIHSS at arrival$^b$                       | 4 (4 to 5)                  | 16 (12 to 19.75)             | 18 (15 to 22)    | 0.034 |
| NIHSS first time point$^b$                 | 4 (3 to 6)$^c$             | 9.5 (4 to 13)$^c$            | 18 (16 to 21)$^c$| 0.003 |
| NIHSS second time point$^b$                | 2 (0 to 2)$^c$             | 4.5 (1 to 9.25)$^c$          | 17 (12 to 19)$^c$| 0.001 |
| mRS at 3 months$^b$                        | 1 (0 to 2)                  | 3 (0.5 to 3)                 | 5 (4 to 5)       | <0.001 |
| ASPECTS$^b$                                | 10 (10 to 10)               | 10 (8 to 10)                 | 5 (3 to 6)       | <0.001 |
| OCSP                                       |                             |                              |                  |
| LACI                                       | 5                           | 0                            | 0                | 1    |
| PACI                                       | 0                           | 16                           | 2                | <0.001 |
| TACI                                       | 0                           | 2                            | 16               | <0.001 |
| Treatment                                  |                             |                              |                  |
| rTPA                                       | 1                           | 8                            | 2                | 0.03 |
| IAT                                        | 0                           | 9                            | 3                | 0.03 |
| Onset-to-first time point (h)$^a$          | 21 ± 4$^c$                  | 15 ± 8$^c$                   | 19 ± 5$^c$       | 0.25 |
| Onset-to-second time point (h)$^a$         | 67 ± 27                     | 84 ± 25                      | 86 ± 25          | 0.8  |
| First to second time point (h)$^a$         | 64 ± 14$^c$                 | 58 ± 24$^c$                  | 50 ± 16$^c$      | 0.32 |
| Mean ABP (mmHg)                            |                             |                              |                  |
| First time point$^a$                       | 92.3 ± 7.7$^c$             | 94.5 ± 16.0$^c$              | 98.2 ± 14.1$^c$ | 0.99 |
| Second time point$^a$                      | 93.3 ± 15.4                 | 86.5 ± 24.9                  | 97.3 ± 10.0      | 0.68 |
| Heart rate (beats/min)                     |                             |                              |                  |
| First time point$^a$                       | 74 ± 15.9$^c$              | 75.6 ± 14.8$^c$              | 80 ± 13.4$^c$   | 0.83 |
| Second time point$^a$                      | 69.9 ± 8.2                  | 74.6 ± 14.1                  | 81.8 ± 9.8       | 0.24 |
| SpO2 (%)                                   |                             |                              |                  |
| First time point$^a$                       | 96.3 ± 1.1$^c$             | 96.6 ± 2.0$^c$               | 96.5 ± 2.5$^c$  | 0.69 |
| Second time point$^a$                      | 96.8 ± 0.8                  | 95.5 ± 1.6                   | 95.5 ± 1.6       | 0.99 |
| Hb (g/dL)                                  |                             |                              |                  |
| First time point$^a$                       | 14.5 ± 0.4$^c$             | 12.6 ± 2.3$^c$               | 13.4 ± 2.4$^c$  | 0.78 |
| Second time point$^a$                      | 14.2 ± 0.6                  | 11.9 ± 2.0                   | 13.1 ± 2.1       | 0.16 |

$^a$Mean ± standard deviation;  
$^b$Median (interquartile range);  
$^c$NIHSS calculated on patients with available TD-NIRS at both time points ($n = 10$ recanalized, $n = 11$ nonrecanalized, $n = 3$ LACS);  
$^d$p-value for the comparison between recanalized LVO and nonrecanalized LVO patients. ASPECTS, Alberta Stroke Program Early CT Score; OCSP, neuroradiological Oxfordshire Community Stroke Project Classification; LACI, lacunar anterior circulation infarct; PACI, partial anterior circulation infarct; TACI, total anterior circulation infarct; rTPA, recombinant-tissue plasminogen activator; IAT, intra-arterial thrombectomy.
the FDR method. To explore the association of neurological outcome with hemoglobin species and \(\text{StO}_2\), we analyzed:

1. the improvement in stroke severity, defined as (baseline NIHSS—(discharge NIHSS)) ≥ 0;
2. the functional outcome measured by modified Rankin scale (mRS) at 90 days after stroke dichotomized for statistical analysis in a good functional outcome mRS ≤ 3 and poor functional outcome mRS > 3.

Data analysis was performed with lmer package of RStudio version 1.1.453 (©2009-2018 RStudio, Inc.).

3 Results

The patient cohort included 47 consecutive acute ischemic stroke patients. We recorded a mean of 14 positions per patient (7 per hemisphere) (range 6 to 24). Quality controls yielded to the exclusion of 34.1% of the measurements (15.5% for \(\chi^2\), 7.4% phantom quality, 2.2% for \(\Delta t_{\text{TD-NIRS-IRF}}\), 9% for more than one quality control) leaving for final analysis, 24 patients with TD-NIRS measurements at both first and second time points and 41 patients with TD-NIRS measurement at the second time point. According to the OCSP classification, 36 stroke patients were classified as PACS/TACS (18 patients as recanalized LVO and 18 patients as nonrecanalized LVO), and five patients as LACS. Baseline demographics, clinical features, mean peripheral blood hemoglobin concentration, arterial blood pressure, heart rate, \(\text{SpO}_2\), and time-to-TD-NIRS measurements were balanced among LVO stroke patients (Table 1).

Stroke severity measured with NIHSS was stable between the two time points in both recanalized LVO [median (IQR), 18 (16 to 21) versus 17 (12 to 19), \(p = 0.36\)] and nonrecanalized LVO patients [median (IQR), respectively, 18 (16 to 21) versus 17 (12 to 19), \(p = 0.36\)] with available measurements at both time points. The control group included 35 healthy subjects with mean age of 74.1 ± 5.4 years, comparable with ischemic stroke patients [76.0 ± 10.9, \(p = 0.31\)]. The mean \(\text{SpO}_2\) (±SD) in controls was 97% (±1.5).

The median within-area coefficient of variation (standard deviation/mean) of the probed positions was <15% for \(\text{HbR}\), \(\text{HbO}\), \(\text{HbT}\) (IQR: first quartile <10%, second quartile <20%) and ≤5% for \(\text{StO}_2\) (IQR: first quartile <3.5%, second quartile <7%). In Fig. 3, we report an example of a fit of the distributions of photon time of flight (DTOF) at 690 nm obtained in a single patient from a position within the nonstroke region of the contralateral hemisphere and from a position within the ischemic area.

Patients with LVO stroke, regardless of recanalization status, had a higher concentration of \(\text{HbR}\) and lower \(\text{StO}_2\) values in ipsilateral and contralateral hemispheres compared with controls at both time points (ipsilateral hemisphere versus controls: first time point \(\text{HbR} p = 1.4 \times 10^{-4}\), \(\text{StO}_2 p = 0.004\); second time point \(\text{HbR} p = 8.2 \times 10^{-5}\), \(\text{StO}_2 p = 2.3 \times 10^{-5}\); contralateral hemisphere versus controls, first time point \(\text{HbR} p = 0.002\), \(\text{StO}_2 p = 0.002\); second time point \(\text{HbR} p = 1.4 \times 10^{-4}\), \(\text{StO}_2 p = 2.9 \times 10^{-6}\) (Fig. 4 and Table 2).

Within 24 h from symptoms onset, recanalized LVO patients had increased \(\text{HbR}\) and decreased \(\text{StO}_2\) in the ipsilateral and the contralateral hemisphere compared with controls (respectively, \(\text{HbR} p = 5.9 \times 10^{-3}\), \(p = 0.03\); \(\text{StO}_2 p = 6.5 \times 10^{-4}\), \(p = 7.9 \times 10^{-4}\) (Fig. 4 and Table 3). The ipsilateral nonstroke area had decreased \(\text{StO}_2\) compared with controls (\(p = 2.0 \times 10^{-4}\) (Fig. 4 and Table 3). The ischemic area of recanalized LVO patients had increased \(\text{HbR}\) (\(p = 8.2 \times 10^{-4}\), increased \(\text{HbT}\) (\(p = 0.03\), and decreased \(\text{StO}_2\) (\(p = 0.015\)).

![Fig. 3 Example of IRF (green line) and of distribution of photon time of flight (DTOF) at 690 nm from a position within the nonstroke contralateral region (source–detector position F3 to F5, red line) and from a position within the ischemic area (source–detector position F4 to F6, blue line) and from](image-url)

In yellow best fits with the model of photon diffusion are also shown.
compared with controls (Fig. 4 and Table 3); higher concentration of HbR ($p = 0.01$), HbO ($p = 3.6 \times 10^{-3}$) and HbT ($p = 2.0 \times 10^{-3}$) compared with the ipsilateral nonstroke area; higher concentration of HbO ($p = 0.049$), HbT ($p = 0.03$) compared with the contralateral hemisphere (Table 3). Measurements at the second time point were obtained at a mean interval of 84 ± 25 h from onset. Compared with controls, recanalized patients had a pattern of hemoglobin species and StO2 similar to the first time point (Fig. 4 and Table 3). In recanalized LVO patients with available measurements at both time points, the concentration of hemoglobin species and StO2 in ischemic area and nonstroke areas of ipsilateral and contralateral hemisphere was comparable between first and second time points (Table 3).

Within 24 h from symptoms onset, nonrecanalized LVO patients had increased HbR in the ipsilateral hemisphere and increased HbR and HbT in the ischemic area compared with controls (respectively, HbR $p = 5.9 \times 10^{-3}$; HbR $p = 4.9 \times 10^{-3}$; HbT $p = 0.03$) (Fig. 4 and Table 4). Measurements at the second time point were obtained at a mean interval of 86 ± 25 h from onset. Compared with controls, nonrecanalized LVO patients had a pattern of hemoglobin species and StO2 similar to the first time point except that contralateral hemisphere had increased HbR and decreased StO2. HbR $p = 0.02$, StO2 $p = 0.03$ (Fig. 4 and Table 4). In nonrecanalized LVO patients with available measurements at both time points, the concentration of hemoglobin species and StO2 in ischemic area and nonstroke areas of ipsilateral and contralateral hemisphere were comparable between first and second time points (Table 4).

At both time points, the ipsilateral hemisphere of recanalized LVO patients had lower mean StO2 compared with nonrecanalized LVO patients (respectively, $p = 0.016$, $p = 0.011$) and comparable HbR, HbO, and HbT (Tables 3 and 4).

Recanalized LVO patients with good functional outcome, defined as modified Rankin scale (mRS) ≤ 3 after 3 months, had a significantly higher StO2 in the ipsilateral hemisphere [first time point 53.7% (±2.8) versus 46.1% (±3.7), $p = 0.012$; second time point 51.9% (±3.1) versus 47.7% (±4.2), $p = 0.042$]. Improvement of stroke severity, defined as a positive difference between baseline and discharge NIHSS, was associated with higher StO2 in recanalized LVO patients in the ipsilateral hemisphere [first time point 53.7% (±2.8) versus 46.1% (±3.7), $p = 0.012$; second time point 51.7% (±3.0) versus 44.6% (±3.7), $p = 0.006$].

Patients with LACS stroke had similar concentration of hemoglobin species and StO2 values of both hemispheres compared with controls at both time points (Table 2).

### 4 Discussion

The present study shows that TD-NIRS is able to detect significant differences in hemoglobin species in LVO stroke compared with controls and according to recanalization status. TD-NIRS measurement is feasible in the real-life scenario of the stroke unit even on patients with severe functional impairment.
Table 2  Estimated mean concentration of hemoglobin species and StO$_2$ values in controls, LACS and LVO stroke patients according to linear mixed model.

|               | N  | HbR$^a$   | HbO$^a$   | HbT$^a$   | StO$_2$$^a$ |
|---------------|----|-----------|-----------|-----------|-------------|
| Controls$^b$  | 35 | 22.3 (0.9)| 30.5 (1.2)| 52.9 (2.0)| 57.6 (0.7)  |
| Ipsilateral hemisphere |    |           |           |           |             |
| First time point | 3  | 23.5 (2.5)| 29.4 (3.4)| 52.9 (5.4)| 55.0 (1.9)  |
| Second time point | 5  | 24.1 (2.4)| 30.1 (3.1)| 54.3 (5.1)| 55.4 (1.7)  |
| Contralateral hemisphere |    |           |           |           |             |
| First time point | 3  | 23.9 (2.6)| 30.3 (3.6)| 54.2 (5.7)| 55.8 (1.9)  |
| Second time point | 5  | 22.6 (2.4)| 28.1 (3.2)| 50.7 (5.3)| 55.2 (1.7)  |
| All LVO stroke patients |    |           |           |           |             |
| Ipsilateral hemisphere |    |           |           |           |             |
| First time point | 21 | 28.1 (0.9)$^c$ | 33.5 (1.3) | 61.5 (2.0) | 54.0 (0.7)$^c$ |
| Second time point | 36 | 28.2 (0.9)$^c$ | 32.3 (1.2) | 60.5 (1.9) | 53.0 (0.7)$^c$ |
| Contralateral hemisphere |    |           |           |           |             |
| First time point | 21 | 27.0 (0.9)$^c$ | 31.7 (1.3) | 58.6 (2.0) | 53.8 (0.7)$^c$ |
| Second time point | 36 | 27.8 (0.9)$^c$ | 31.2 (1.2) | 59.0 (1.9) | 52.4 (0.7)$^c$ |

$^a$Columns HbR, HbO, HbT, StO$_2$ represent mean (standard error); measure unit for HbR, HbO, HbT: mol/L; measure unit for StO$_2$ = %.
$^b$Control values stem from a subgroup of Ref. 10.
$^c$p-value < 0.05 in the statistical comparison with controls. N = number of valid measurements for statistical analysis. LACS, lacunar anterior circulation syndrome; LVO, large vessel occlusion.

Table 3  Estimated mean concentration of hemoglobin species and StO$_2$ values in controls and recanalized LVO stroke patients, according to linear mixed model.

|               | N  | HbR$^a$   | HbO$^a$   | HbT$^a$   | StO$_2$$^a$ |
|---------------|----|-----------|-----------|-----------|-------------|
| Controls$^b$  | 35 | 22.3 (0.9)| 30.5 (1.2)| 52.9 (2.0)| 57.6 (0.7)  |
| Recanalized LVO |    |           |           |           |             |
| Ipsilateral hemisphere |    |           |           |           |             |
| First time point | 10 | 28.1 (1.3)$^c$ | 31.8 (1.8) | 59.9 (2.9) | 52.4 (1.0)$^c$ |
| Second time point | 18 | 28.8 (1.2)$^c$ | 30.3 (1.6) | 59.1 (2.7) | 51.0 (0.9)$^c$ |
| Ischemic area |    |           |           |           |             |
| First time point | 10 | 29.9 (1.4)$^c$ | 35.3 (1.9) | 65.1 (3.1)$^c$ | 53.6 (1.0)$^c$ |
| Second time point | 18 | 30.8 (1.3)$^c$ | 33.2 (1.7) | 64.0 (2.8)$^c$ | 51.7 (0.9)$^c$ |
| Nonstroke area |    |           |           |           |             |
| First time point | 9  | 26.2 (1.4)| 28.5 (1.9) | 54.8 (3.1) | 51.6 (1.0)$^c$ |
| Second time point | 18 | 26.8 (1.3)| 27.4 (1.7) | 54.3 (2.8) | 50.2 (0.9)$^c$ |
| Contralateral hemisphere |    |           |           |           |             |
| First time point | 10 | 27.6 (1.4)$^c$ | 30.3 (1.9) | 57.9 (3.1) | 52.1 (1.0)$^c$ |
| Second time point | 18 | 28.1 (1.3)$^c$ | 29.4 (1.7) | 57.5 (2.8) | 50.6 (0.9)$^c$ |

$^a$Columns HbR, HbO, HbT, StO$_2$ represent mean (standard error); measure unit for HbR, HbO, HbT: mol/L; measure unit for StO$_2$ = %.
$^b$Control values stem from a subgroup of Ref. 10.
$^c$p-value < 0.05 in the statistical comparison with controls. N = number of valid measurements for statistical analysis. LACS, lacunar anterior circulation syndrome; LVO, large vessel occlusion.
TD-NIRS is an advanced noninvasive optical technique to study real-time oxygenation of cerebral outer layers at the bedside of the patient. Previous NIRS studies of ischemic stroke were performed mainly with the CW-NIRS technique that measures relative changes of HbR, HbO, HbT, and StO2. Despite its limitations, CW-NIRS provided useful information about the status of the patients and the use of fiducial markers allowed to separate TD-NIRS measurements obtained from ischemic areas and nonstroke areas. In our study, we used fiducial markers to categorize the brain region below each TD-NIRS probe as ischemic or nonstroke area. Patients with LACS acute ischemic stroke, regardless of recanalization status, had a significantly higher concentration of HbR and significantly decreased StO2 values in ipsilateral hemisphere compared with control subjects. In addition, we found different TD-NIRS patterns according to the recanalization status of the patients and the use of fiducial markers allowed us to separate TD-NIRS measurements obtained from ischemic areas and nonstroke areas. Indeed, ischemic and nonstroke areas of acute ischemic stroke patients featured significantly different TD-NIRS values compared with controls. Recanalized patients as compared with controls had lower StO2 in ischemic area and nonstroke areas of both hemispheres. Furthermore, the ischemic area had a higher concentration of HbR and HbT. The changes in hemoglobin species and StO2 are certainly due to a complex process resulting from the interaction of several factors. A potential role played by respiratory insufficiency in reducing StO2 was ruled out by normal peripheral arterial pulse oxygen saturation (SpO2 > 94%) during TD-NIRS measurements; furthermore, we did not find any correlation between SpO2 and TD-NIRS values. Considering that recanalized patients feature restoration of arterial blood flow within a metabolically challenged area, the observed pattern might reflect the activation of global hemodynamic and metabolic compensation to the ischemic injury (vasodilation resulting in increased HbT, hypoxia, and local acidosis might act as a chemical vasodilatory stimulus in the ischemic area. On the other hand, the lower StO2 values in ipsilateral and contralateral hemisphere compared with controls could be a marker of increased oxygen extraction due to

### Table 4: Estimated mean concentration of hemoglobin species and StO2 values in controls and nonrecanalized LVO stroke patients, according to linear mixed model.

|                  | N | HbRa       | HbOa       | HbTa       | StO2a       |
|------------------|---|------------|------------|------------|-------------|
| Controlsb         | 35| 22.3 (0.9) | 30.5 (1.2) | 52.9 (2.0) | 57.6 (0.7)  |
| Nonrecanalized LVO |   |            |            |            |             |
| Ipsilateral hemisphere |   |            |            |            |             |
| First time point  | 11| 28.0 (1.3)c| 35.2 (1.8) | 63.1 (2.9) | 55.7 (1.0)  |
| Second time point | 18| 27.7 (1.2)c| 34.3 (1.6) | 62.0 (2.7) | 54.9 (0.9)  |
| Ischemic area     |   |            |            |            |             |
| First time point  | 11| 28.9 (1.4)c| 35.9 (1.9) | 68.4 (9.1)c| 55.5 (1.0)  |
| Second time point | 18| 28.3 (1.3)c| 35.4 (1.7) | 63.7 (10.7)c| 55.3 (0.9)  |
| Nonstroke area    |   |            |            |            |             |
| First time point  | 7 | 26.3 (1.5) | 33.8 (2.1) | 65.6 (11.6)| 55.8 (1.1)  |
| Second time point | 12| 26.7 (1.4) | 32.7 (1.8) | 59.1 (14.9)| 54.6 (1.0)  |
| Contralateral hemisphere |   |            |            |            |             |
| First time point  | 11| 26.4 (1.4) | 32.9 (1.9) | 63.0 (11.3)| 55.5 (1.0)  |
| Second time point | 18| 27.5 (1.3)c| 33.0 (1.7) | 60.5 (10.7)c| 54.1 (0.9)c |

- Columns HbR, HbO, HbT, StO2 represent mean (standard error); measure unit for HbR, HbO, HbT: mol/L; measure unit for StO2 = %. 
- Control values stem from a subgroup of Ref. 10. 
- p-value < 0.05 in the statistical comparison with controls. 

Overall, patients with LVO acute ischemic stroke, regardless of recanalization status, had a significantly higher concentration of HbR and significantly decreased StO2 values in ipsilateral hemisphere compared with control subjects. In addition, we found different TD-NIRS patterns according to the recanalization status of the patients and the use of fiducial markers allowed us to separate TD-NIRS measurements obtained from ischemic areas and nonstroke areas. Indeed, ischemic and nonstroke areas of acute ischemic stroke patients featured significantly different TD-NIRS values compared with controls. Recanalized patients as compared with controls had lower StO2 in ischemic area and nonstroke areas of both hemispheres. Furthermore, the ischemic area had a higher concentration of HbR and HbT. The changes in hemoglobin species and StO2 are certainly due to a complex process resulting from the interaction of several factors. A potential role played by respiratory insufficiency in reducing StO2 was ruled out by normal peripheral arterial pulse oxygen saturation (SpO2 > 94%) during TD-NIRS measurements; furthermore, we did not find any correlation between SpO2 and TD-NIRS values. Considering that recanalized patients feature restoration of arterial blood flow within a metabolically challenged area, the observed pattern might reflect the activation of global hemodynamic and metabolic compensation to the ischemic injury (vasodilation resulting in increased HbT, hypoxia, and local acidosis might act as a chemical vasodilatory stimulus in the ischemic area. On the other hand, the lower StO2 values in ipsilateral and contralateral hemisphere compared with controls could be a marker of increased oxygen extraction due to
the increased metabolic activity of the rescued brain tissue, increased glutamate in the peri-infarct area along with cortical activation of nonstroke areas. In addition, the increase in oxygen extraction in the ischemic area might also be due to the Bohr’s effect of local acidosis with a shift of the O₂-Hb dissociation curve toward right. Differences in vascular resistance in the microcirculation between the ischemic area and the ipsilateral nonstroke area might cause a preferential distribution of flow to the ischemic area, which would explain the higher concentration of HbO and HbT compared with the ipsilateral nonstroke area. It is known that ischemic stroke may induce widespread cerebral hemodynamic changes and activation of plasticity mechanisms.3–5 Arterial and venous collateral pathways and hemodynamic vasodilatation compensatory mechanisms may act also on noninfarcted brain areas. Functional MRI studies demonstrated widespread cortical activation in the acute phase in areas remote from ischemic lesions, suggestive of neuronal plasticity.10–31

Nonrecanalized patients had higher HbR and HbT but similar StO₂ values in the ischemic area compared with controls. Supposedly, the ischemic area of nonrecanalized patients might feature residual blood flow from leptomeningeal arterial and venous collaterals, altered venous drainage and reduced oxygen consumption because of absent metabolic activity of the infarcted tissue. The observed higher concentrations of HbR and HbT may also reflect blood stagnation through a deranged ischemic microcirculation. Interestingly, recanalized patients had lower StO₂ values compared with nonrecanalized patients suggesting that StO₂ could be a potential surrogate marker of metabolically active tissue.

We acknowledge that our study has a number of limitations among which the use of a prototype of TD-NIRS in a single center. In addition, the use of a homogenous model of photons’ diffusion instead of a two-layer algorithm is a possible limitation of our study. At present, the analysis of TD-NIRS data with a two-layer model is a time-consuming process that requires higher computational resources than a simple homogenous model,34 which is being inadequate for a prompt clinical decision setting such as the acute ischemic stroke. However, future studies might address whether the use of a two-layer model will yield comparable results. The sample size of our study, albeit being among the largest in NIRS studies in stroke so far, is still limited. Indeed, owing to the small sample size, the analysis to examine the association of neurological outcome with hemoglobin species and StO₂ was merely explorative and as such is not appropriate to derive any conclusion. In addition, due to the real life setting of the study, advanced stroke imaging was not a requirement, thus we cannot exclude that this could have limited the ability to detect potential changes in the extension of the ischemic stroke area between the first and second time points. On the other hand, a major change in extension of the ischemic area would have an effect on clinical severity, but we found a nonsignificant change of NIHSS between the two time points. Nevertheless, the results of the present study need to be interpreted with caution and certainly have to be confirmed on a larger sample. The absence of a concomitant measurement of local cerebral blood flow is prevented to enrich TD-NIRS data and derive a more accurate insight on the metabolism of the probed brain areas. We are planning to implement the concomitant use of diffuse correlation spectroscopy (DCS)35 with the development of hybrid systems. Finally, ischemic brain tissue may undergo structural changes among the occurrence of cytotoxic and vasogenic edema. In cytotoxic and vasogenic edema, water is redistributed, respectively, from the extracellular to intracellular space and from vascular blood to extracellular space. Brain edema develops in a closed system such that an increase in local brain tissue volume due to edema is partially compensated by a reduction in the cerebrospinal fluid component resulting in a change of compartmentalization of water. In addition, the water absorption in the spectral range of interest is rather low. On this ground, we do not expect major changes in the calculation of the absorption coefficient. Furthermore, the fitting process and the hemoglobin estimates accounted for possible modifications of scattering, which is mainly due to the refractive index mismatch of the different tissue components.

Measurements of peripheral blood hemoglobin, arterial blood pressure, and SpO₂ during the recording sessions minimized the risk of misinterpretation related to imbalance of systemic homeostatic parameters.

In summary, in this pivotal study we found significant differences of TD-NIRS values between patients and controls and among patients according to recanalization status. The ischemic area of both recanalized and nonrecanalized patients featured increased HbR and HbT that might reflect the hemodynamic compensation to the ischemic injury but only recanalized patient had reduced StO₂, a finding that might reflect the metabolic activity of the rescued brain tissue. The results obtained from this cohort of acute stroke patients suggest that StO₂ could serve as surrogate functional marker metabolic activity of rescued brain tissue and might be an additional parameter to account for in the prognostic process of acute stroke patients. Correlation of TD-NIRS with other techniques such as DCS may better inform on tissue viability and blood flow.

Disclosures
The authors have no conflicts of interest to declare.

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G.G. and L.R. made substantial contribution to the study conception and design and contributed to the statistical analyses of data, to their interpretation and to the drafting of the manuscript. G.G., M.Z., R.R., B.G., D.C., L.S., A.T. contributed to the acquisition of data. M.Z., R.R., D.C., L.S., A.T. contributed to the analysis of TD-NIRS data. All authors contributed to critical comments and revision of the paper. This study was not funded by any specific project grant.

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Giacalone et al.: Time-domain near-infrared spectroscopy in acute ischemic stroke patients

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