

1 **Enhanced visualization of optimal cerebral perfusion pressure over time to**
2 **support clinical decision making**

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1 **Abstract**

2

3 **Objective:** Cerebrovascular reactivity can provide a continuously updated

4 individualised target for management of CPP, termed CPPopt.

5 **Data Sources:** Here we present a concept method of visualisation of

6 autoregulation based CPPopt using data of 4 severe TBI patients with ICP

7 monitoring.

8 **Conclusions:** The visualization method addresses some of the main drawbacks

9 of the original methodology and might bring the potential for its clinical

10 application closer.

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1 **Introduction**

2 Current guidelines for management of severe traumatic brain injury (TBI)
3 patients recommend keeping ICP below 20 mmHg and CPP within the range of
4 50-70 mmHg.¹ Although some success has been achieved, it ignores substantial
5 injury-specific and patient-specific variability.² A recent trial showed lack of any
6 important outcome benefits of applying one particular fixed ICP treatment cut-
7 off value.³ One promising approach supports the idea of individualizing
8 perfusion treatment strategies guided by the state of cerebral autoregulation.⁴⁻⁶
9 Cerebrovascular pressure reactivity represents a key element of autoregulation.
10 The pressure reactivity index (PRx) can be determined as the moving correlation
11 coefficient between ABP and ICP.⁷ With this approach active cerebrovascular
12 reactions can be assessed by observing the response of cerebral blood volume
13 and subsequently ICP to slow spontaneous changes in ABP.⁸ However, minute-
14 by-minute values of PRx vary over time and require averaging to provide
15 meaningful values. Additionally whilst PRx provides a method for assessing
16 autoregulation, it does not, by itself, suggest any particular course of action in
17 patient management.

18 One useful way of 'averaging' PRx and at the same time providing it with an
19 immediate clinical meaning, is to divide its values into different bins according to
20 corresponding predefined CPP ranges. Plotting mean PRx against associated CPP
21 bins frequently produces a U-shaped curve with both hypoperfusion (low CPP)
22 and hyperperfusion (high CPP) associated with worsened cerebrovascular
23 reactivity.^{4,5} Employing curve fitting the lowest point of the individual
24 autoregulation curve can be marked as the 'optimal' CPP (CPP_{opt}) value,

1 corresponding to the CPP where individual autoregulation is the most effective.
2 These calculations can be repeated every minute from a chosen time range of
3 past data samples (moving window) thus producing a time-trend of CPPopt that
4 can be plotted alongside of CPP and ICP (Figure 1a). Recently, we have
5 demonstrated that larger deviation of CPP from the automatically calculated
6 CPPopt was associated with worse clinical outcome.⁴ However, the CPPopt trend
7 does not fully reflect the character of the PRx-CPP relationship, nor does it
8 capture its dynamic nature. In addition, the CPPopt trends can be fairly 'erratic'
9 (noisy), and may often contain many gaps where the PRx-CPP curves cannot
10 robustly be fitted. These effects are likely to be detrimental to the process of
11 clinical introduction of the autoregulation guided CPP therapy.

12 In this study we therefore aim to improve the CPPopt methodology by
13 introducing a new visualization method that may provide insight into the
14 complete characteristics of the CPP-PRx relationship, and its temporal evolution.

15 **Materials and Methods**

16 **Patients**

17 We present the concepts of the new visualization method using data from four
18 randomly selected severe TBI patients who were admitted to the neurocritical
19 care unit in 2013 and underwent monitoring of ICP as part of the TBI
20 management protocol at the University Medical Center Groningen. The local
21 medical ethics committee waived the need for informed consent. The local TBI
22 protocol aimed at keeping the CPP at approximately 60-70 mmHg and the ICP
23 below 20 mmHg.

1 **Data acquisition**

2 ABP was monitored invasively with an intravascular line connected to a pressure
3 transducer (Baxter Healthcare Corp. CardioVascular Group, Irvine, CA) and
4 zeroed at right atrium level. An intraventricular ICP probe (Raumedic Neurovent,
5 Raumedic AG, Helmbrechts, Germany) was used. All monitoring data were stored
6 using ICM+[®] software (Cambridge Enterprise, Cambridge, UK,
7 <http://www.neurosurg.cam.ac.uk/icmplus>). Time-averaged means for ABP, ICP
8 CPP (ABP minus ICP), and PRx⁷ were calculated and stored every minute.

9 **Data processing and visualisation**

10 MATLAB (The MathWorks, Inc., Natick, Massachusetts, USA) was used to
11 implement a curve-fitting procedure based on an algorithm described
12 elsewhere⁴ in order to retrieve the PRx-CPP curves and the corresponding
13 CPPopt values every minute, with a calculation data buffer of 4 hours .
14 Importantly, all the fitted PRx-CPP curves were extended to cover the whole
15 examined range of CPP, from 40 to 120 mmHg.
16 The sequential PRx-CPP curves were then used to create a colour-coded map of
17 PRx-CPP relationship evolution over time (Figure 1b). The time (horizontal) axis
18 represents the position of the moving window for CPPopt calculation. The fitted
19 values of PRx are color-coded for every CPP-time point in the plot. The cool (blue
20 to yellow) colors represent intact cerebral pressure reactivity while impaired
21 pressure reactivity is represented by hot (orange to red) colors. Black areas
22 represent time points for which no CPPopt could be determined. In the second
23 step a non-causal, exponentially weighted moving average (EWMA) filter ($n=240$
24 data points (i.e. 240 minutes), $\alpha=0.005$) was applied to the image along the time

1 axis only. This filter has a low-pass (smoothing) effect in time, and moreover it
2 allows to fill in some of the gaps (of duration not exceeding the filter length) with
3 appropriately weighted average of the preceding and following data values
4 (Figure 1c). In a third step the measured CPP (blue line) values were smoothed
5 with the same EWMA filter and added to the image. Finally, the boundaries of the
6 actual CPP ranges used for individual curve fitting (reflecting the number of
7 included CPP intervals and thereby providing a proxy of the curve reliability) are
8 indicated with black lines. Transparent overlays on both sides of these black
9 lines make clear within which CPP range the patient was kept and where
10 interpolation of the PRx-CPP curves has taken place. A 'quality' indicator bar was
11 added on top of the figure, marking sections of the image where the original gaps
12 were present but which were subsequently interpolated by the EWMA filter
13 (figure 2a).

15 **Results**

16 We illustrate the new CPPopt visualization method for the first three monitoring
17 days of four TBI patients (Figure 2) and provide some retrospective observations
18 that could not have been made with the traditional approach.

19 In patient 1 (Figure 2a), the PRx-CPP landscape indicates that lower CPP values
20 could have probably been well tolerated on day two. By day three however PRx
21 becomes positive over the whole CPP range (complete loss of autoregulation). In
22 such situations, autoregulation cannot be optimised and non CPP orientated,
23 management protocols are probably temporarily more appropriate. In patient 2
24 (Figure 2b) PRx became consistently negative (improving autoregulation) for
25 CPP values around 70 mmHg on day 2 but in the later part of day 3 the patients'

1 autoregulation deteriorated considerably suggesting that a more aggressive and
2 targeted management of CPP at higher values (80-90) could have perhaps been
3 attempted. The PRx-CPP image for patient 3, (Figure 2c), tells the opposite story.
4 The patient started off with global loss of autoregulation, then on day 2 the
5 autoregulation seemed to have recovered but only for a relatively narrow and
6 high (75-90) range of CPPs. Subsequently, from day 3 onwards autoregulation
7 recovered over a broad range (55-75) of CPP. Also patient 4 (Figure 2d) started
8 with global loss of autoregulation with the patient kept at very high CPPs (above
9 90) at end of day 1. Subsequently, from day 3 improved autoregulation in the
10 range 60-75 mmHg might have enabled keeping CPP more 'stable' in this range
11 over time.

12 **Discussion and conclusions**

13 In our previous work⁴ we used PRx as a marker of cerebrovascular reactivity to
14 provide a continuously updated individualised target for management of CPP,
15 termed CPPopt. Here, we present a visualisation tool which may help clinicians
16 understand the prevailing physiology in the context of time variation so as to
17 help them in their decision making in individual patients.

18 First, by reducing the complexity of the CPP-PRx relationship to a single value
19 (CPPopt) is an oversimplification that may omit clinically important aspects of
20 autoregulatory behaviour. For example, in addition to a CPPopt target it is also
21 useful to understand what the overall autoregulatory capacity is and how
22 dependent autoregulation is on CPP. Second, the CPPopt time series may
23 sometimes behave quite erratically with large jumps in CPPopt despite relatively
24 stable overall clinical condition of the patient. Finally the current CPPopt

1 calculation does not always return a valid result at every instant leading to
2 periods with no data (gaps).

3 Such observations naturally reduce the physiological relevance of any single
4 value of CPPopt and are probably in part a consequence of the assumptions of
5 the CPPopt calculation including the assessment of autoregulation itself using the
6 PRx index. Since PRx (and therefore CPPopt) is calculated from spontaneous
7 variations in ICP and ABP rather than diagnostic interventions, it is
8 fundamentally a statistical parameter, with all uncertainties this brings.

9 The proposed visualisation method attempts to address and ameliorate these
10 limitations by providing a continuous representation of the relationship between
11 autoregulation and CPP over time. This allows for not only an indicator of the
12 instantaneous CPPopt but also for the full appreciation of the CPP-dependence of
13 autoregulation past and present. The erratic behaviour and 'missing values' of
14 CPPopt is addressed by smoothly interpolating the CPP-PRx behaviour. This
15 smoothing is physiologically plausible when we consider the timescales of the
16 underlying pathobiology likely to be responsible for changes in autoregulation
17 are also likely to be in the order of hours-days rather than minutes.

18 What we describe here is a natural extension of the concept of autoregulatory
19 assessment, providing the full retrospective 'landscape' of PRx-CPP relationship
20 extending over the past several hours. Although further methodological
21 improvements and a test of functionality are needed, the proposed visualisation,
22 while addressing some of the problems discussed above, may improve individual
23 CPP management methods based on the status of cerebral autoregulation,
24 current and past. The visualisation tool could be helpful in the development and

1 fine tuning of an autoregulation-guided CPP treatment protocol that needs

2 prospective testing.

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1 References

- 2 1. Bratton SL, Chestnut RM, Ghajar J, et al: Guidelines for the management of
3 severe traumatic brain injury. IX. Cerebral perfusion thresholds. *J*
4 *Neurotrauma* 2007;24: S59-S64
- 5 2. Maas AI, Menon DK. Traumatic brain injury: rethinking ideas and
6 approaches: *Lancet Neurol* 2012; 11:12-13
- 7 3. Chesnut RM, Temkin N, Carney N, et al. A Trial of Intracranial-Pressure
8 Monitoring in Traumatic Brain Injury: *N Engl J Med* 2012; 367:2471-2481
- 9 4. Aries MJ, Czosnyka M, Budohoski KP, et al: Continuous determination of
10 optimal cerebral perfusion pressure in traumatic brain injury. *Crit Care Med*
11 2012; 40:2456-2463
- 12 5. Steiner LA, Czosnyka M, Piechnik SK, et al: Continuous monitoring of
13 cerebrovascular pressure reactivity allows determination of optimal
14 cerebral perfusion pressure in patients with traumatic brain injury. *Crit*
15 *Care Med* 2002; 30:733-738
- 16 6. Le Roux P, Menon DK, Citerio G, et al: Consensus summary statement of the
17 International Multidisciplinary Consensus Conference on Multimodality
18 Monitoring in Neurocritical Care : A statement for healthcare professionals
19 from the Neurocritical Care Society and the European Society of Intensive
20 Care Medicine. *Intensive Care Med* 2014; 40:1189-1209
- 21 7. Czosnyka M, Smielewski P, Kirkpatrick P, Laing RJ, Menon D, Pickard JD:
22 Continuous assessment of the cerebral vasomotor reactivity in head injury.
23 *Neurosurgery* 1997; 41:11-17
- 24 8. Czosnyka M, Piechnik S, Richards HK, Kirkpatrick P, Smielewski P, Pickard
25 JD: Contribution of mathematical modelling to the interpretation of bedside
26 tests of cerebrovascular autoregulation. *J Neurol Neurosurg Psychiatry*
27 1997; 63:721-731

1 Figure legends

2 **Figure 1** Visualization of the PRx-CPP relationship and 'optimal CPP' (CPPopt)
3 time profile: A) the original visualization showing one curve snapshot and
4 CPPopt time trend (green line)⁴; B) consecutive PRx-CPP curves plotted using a
5 color map, along the time axis; C) as above, but with exponential smoothing
6 added; the final, proposed, complete visualisation image for CPPopt of this
7 patient is in figure 2a.

8 ABP indicates arterial blood pressure; ICP, intracranial pressure; CPP, cerebral
9 perfusion pressure; CPPopt, optimal cerebral perfusion pressure; PRx, pressure
10 reactivity index; PRxopt, optimal pressure reactivity index.

11
12 **Figure 2** Examples of the new visualisation method applied to 4 selected
13 patients, over the first 3 days of monitoring: A) male, 54 years old, fall from roof,
14 GCS of 7, GOS of 4 (moderate disability) B) male, 16 years old, RTA, GCS of 7, GOS
15 of 5 (low disability) C) female, 19 years old, RTA, GCS of 3, GOS of 1 (Death) and
16 D) male, 58 years old, fall of stairs, GCS of 7, GOS of 1 (Death). The blue line
17 indicates the patients' (smoothed) CPP. The Quality Indicator (QI) above the
18 figure shows 'grey' bars indicating interpolated PRx-CPP landscapes (with
19 exponential smoothing) and 'black' bars representing absence of landscape data
20 due to the set smoothing criteria. The 'transparent' areas reflect the CPP
21 intervals where the fitted PRx-CPP curves were extended (interpolated on both
22 sides) to cover the whole examined range of CPP from 40 to 120 mmHg. In that
23 respect the 'black lines' represent the boundaries of the actual CPP ranges used
24 for individual curve fitting.

1 GCS indicates Glasgow Coma score (after resuscitation); RTA, Road Traffic

2 Accident; GOS, Glasgow Outcome Scale (at 6 months).

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Figure 1

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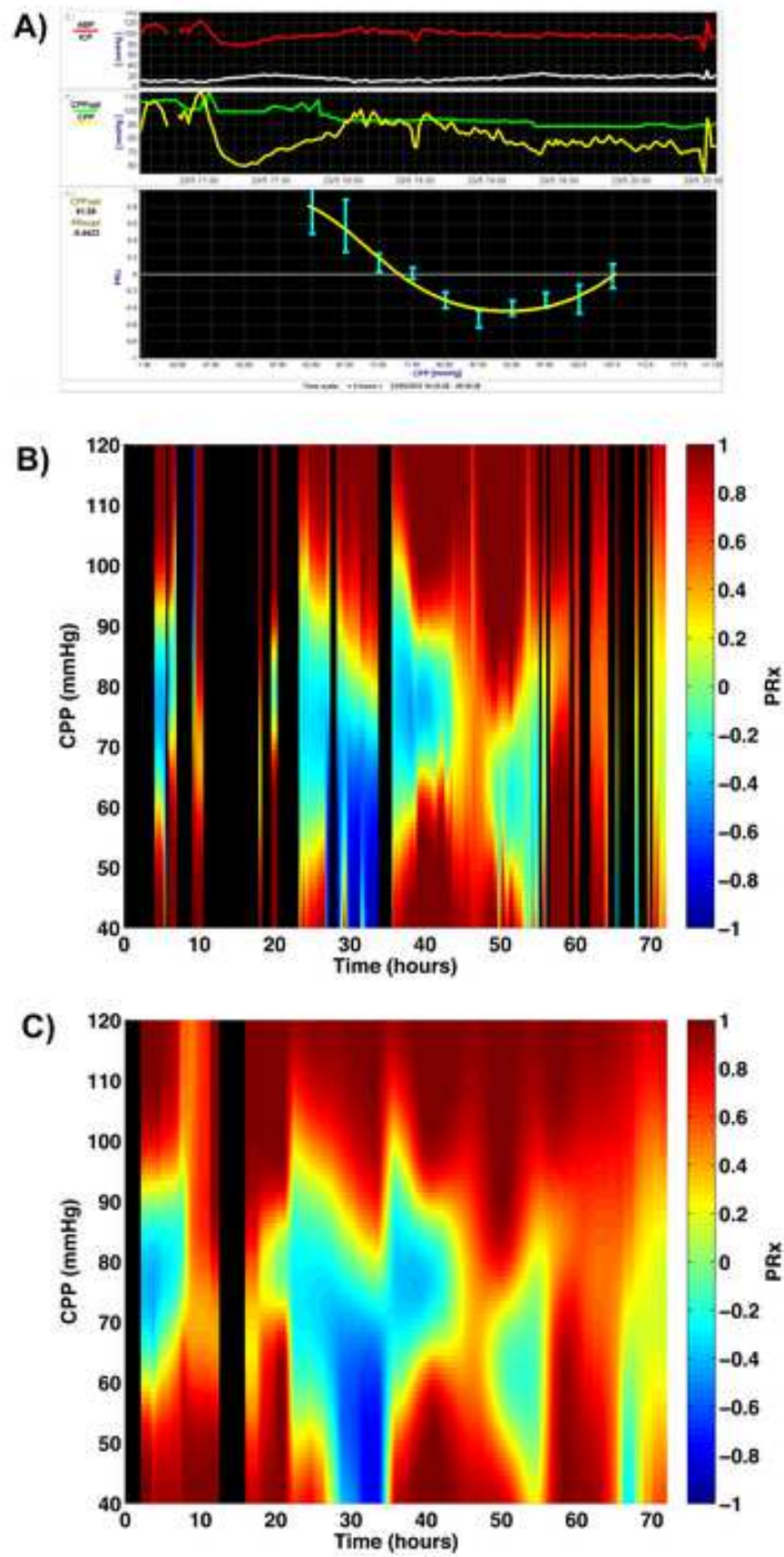


Figure 2

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