# Making sense of astrocytic calcium signals — from acquisition to interpretation

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Abstract | Astrocytes functionally interact with neurons and with other brain cells. Although not electrically excitable, astrocytes display a complex repertoire of intracellular Ca<sup>2+</sup> signalling that evolves in space and time within single astrocytes and across astrocytic networks. Decoding the physiological meaning of these dynamic changes in astrocytic Ca<sup>2+</sup> activity has remained a major challenge. This Review describes experimental preparations and methods for recording and studying Ca<sup>2+</sup> activity in astrocytes, focusing on the analysis of Ca<sup>2+</sup> signalling events in single astrocytes and in astrocytic networks. The limitations of existing experimental approaches and ongoing technical and conceptual challenges in the interpretation of astrocytic Ca<sup>2+</sup> events and their spatio-temporal patterns are also discussed.

Intracellular Ca<sup>2+</sup> signals in astrocytes are vital for the optimal functioning of the CNS<sup>1,2</sup> and represent the astrocytic counterpart of neuronal membrane potential changes such as action potentials. However, the properties, underlying mechanisms, physiological and pathophysiological significance and putative information content of astrocytic Ca<sup>2+</sup> signals are far less thoroughly understood than neuronal excitability. The accelerating pace of development of optical imaging techniques and the emergence of several unexpected observations have put Ca<sup>2+</sup> signalling at the centre of debates on the molecular and cellular aspects of astrocyte physiology. Hence, decoding astrocytic Ca<sup>2+</sup> signalling is an immediate and important challenge in modern neurobiology.

Neuronal physiology was primarily elucidated by use of electrophysiological methods; refinement of these approaches led to important advances such as the invention of the patch clamp technique. These methods have also greatly contributed to studying the role of astrocytes in regulating synaptic transmission and neuronal excitability3. The development of advanced optical imaging techniques (such as two-photon excitation fluorescence imaging) and sensitive genetically encoded Ca2+ indicators (GECIs), which change their fluorescence properties on binding to Ca2+ ions, enabled the visualization of intracellular Ca<sup>2+</sup> concentrations in electrically non-excitable astrocytes. As a result, astrocytes were discovered to possess complex ionic signalling mechanisms, including some involving Ca<sup>2+</sup>. The Ca<sup>2+</sup> signals were found to have highly regulated spatial and temporal dynamics that were not amenable to investigation using electrode-based methods.

This Review focuses on how these technological advances have reshaped our understanding of astrocytic  $Ca^{2+}$  signalling. Specifically, we describe the key properties of astrocytic  $Ca^{2+}$  signals and the mechanisms that generate and shape them in space and time, and discuss how these signals interact and spread in individual astrocytes and astrocytic networks. Finally, we explore the computational properties of  $Ca^{2+}$  signalling in astrocytic networks and consider how these compare with established concepts in neuronal signalling. To what extent these properties are dependent on neuronal circuit activity and sensory input is also addressed.

## **Experimental preparations**

Experimental preparations using a variety of Ca<sup>2+</sup> indicators, each with their own advantages and limitations, have been used to explore Ca<sup>2+</sup> signalling dynamics. Astrocytic Ca<sup>2+</sup> activity has been successfully studied across many species from *Drosophila*<sup>4</sup>, zebrafish<sup>5</sup>, rodents and ferrets<sup>6</sup> to humans<sup>7</sup>. However, most of the experiments described in this Review were performed in rodents as the most commonly used model organism in neurobiology.

*Cell cultures.* Pioneering work on astrocyte physiology began on cultured cells at the beginning of the 1990s, when astrocytes were first observed to generate spontaneous Ca<sup>2+</sup> transients<sup>8</sup>. As astrocytes in a pure monolayer culture do not develop the complex morphology characteristic of their in vivo counterparts, most Ca<sup>2+</sup> activity in cultured astrocytes either occupies the entire cell or occurs close to the plasma membrane<sup>9</sup>. These Ca<sup>2+</sup> signals

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are qualitatively different from those observed in intact preparations (FIG. 1). This difference could be caused by many factors, including alterations in the geometry of the cytosol or in the spatial distribution of crucial Ca<sup>2+</sup> signalling components (such as Ca<sup>2+</sup> stores, pumps and buffers), or atypical expression of receptors and channels compared with astrocytes in vivo<sup>10,11</sup>. Nonetheless, cell culture systems remain a powerful tool for dissecting fundamental cellular pathways. Improved culture methods are pushing astrocytes towards in vivo-like characteristics<sup>12</sup>.

Brain slices. Acute brain slices are another widely used preparation that offers the advantage that cells and their connections originally developed in their natural in vivo environment. Astrocytes in brain slices retain highly ramified processes (branchlets) and thin protrusions that contact synapses (leaflets) and blood vessels (end-feet), the morphological characteristics of in vivo tissue<sup>13-16</sup>, and exhibit focally restricted and complex Ca2+ activity patterns<sup>17-19</sup> (FIG. 1). As local neuronal circuitry and the spatial arrangement of the various cell types in the neuropile are largely preserved in brain slice preparations, they have been instrumental in uncovering the basic mechanisms that drive astrocytic Ca2+ signalling and in revealing how these depend on neuronal activity<sup>18,20-23</sup>. However, the disruption of long-range connectivity during tissue preparation limits the usefulness of brain slices beyond the study of astrocytes within their local cell assemblies. Moreover, tissue damage during slice preparation can potentially trigger reactive astrogliosis, which might change astrocyte physiology<sup>24</sup>. Nonetheless, acute brain slices remain ideally suited for studying the interactions between neurons and astrocytes by electrophysiological, optical and combined methods at high spatial and temporal resolution, and for local and targeted manipulations.

*Intravital preparations.* The advent of two-photon excitation fluorescence microscopy enabled the recording and correlation of in vivo astrocytic Ca<sup>2+</sup> activity with neuronal activation<sup>25,26</sup> (FIG. 1). Most of the early in vivo imaging experiments were performed in anaesthetized animals. However, researchers soon realized that general anaesthetics suppress astrocytic Ca<sup>2+</sup> signalling<sup>27</sup>. With advances in imaging methods, in vivo approaches evolved towards studies in awake and behaving animals<sup>28-32</sup>. Several configurations for imaging of head-fixed, awake mice have been developed, such as an air-suspended

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<sup>7</sup>Interdisciplinary Center for Neurosciences, Heidelberg University, Heidelberg, Germany. <sup>8</sup>These authors contributed equally: Alexey Semyanov, Christian Henneberger, Amit Agarwal. Styrofoam ball, a mobile home cage and a treadmill or running disc combined with virtual reality<sup>28,33–35</sup>. However, craniotomy and implantation of the glass window can still trigger reactive astrogliosis and potentially change the physiology of astrocytes. This issue can be overcome by use of thinned-skull preparations, albeit at the expense of reductions in spatial resolution and the imaging time frame<sup>36</sup>. Thus, despite the limited amenability of in vivo preparations to pharmacological and electrophysiological experimentation, they remain the tool of choice to study astrocytic Ca<sup>2+</sup> signals in the intact brain and during defined behavioural paradigms.

Induced astrocytes. Astrocytes in primates, including humans, are divided into various anatomical classes<sup>37,34</sup> and express several genes that are not expressed in the astrocytes of other mammals (reviewed elsewhere<sup>39</sup>). In addition to the anatomical astrocyte classes present in both humans and mice (namely Bergmann glia, fibrous astrocytes, protoplasmic astrocytes and velate astrocytes), the primate cortex contains two unique astrocyte classes: varicose projection astrocytes and interlaminar astrocytes. Hence, the outcomes of studies of rodent astrocytes, especially those in rodent models of disease, might not be generalizable to human astrocytes. Access to human brain tissue is limited to surgical biopsy samples obtained during resection of tumours or epileptic foci. Whether the data obtained from such patient-derived tissue samples (which have usually been exposed to various medications) capture the physiological properties of astrocytes in the healthy human brain remains an open question7,37,39. A promising approach to study the basic physiology of human astrocytes is direct genetic reprogramming of either human embryonic stem cells or induced pluripotent stem cells into astrocytes<sup>40</sup>. However, the functionality of such astrocytes needs to be extensively validated<sup>41</sup>.

Moving towards ever more advanced experimental paradigms in intact preparations might intuitively be expected to be the key to understanding fundamental principles of astrocytic  $Ca^{2+}$  signalling. However, these advances come at the expense of the very restricted toolsets for manipulating  $Ca^{2+}$  signals in these preparations, compared with those available for simpler experimental set-ups. Hence, to fully decode  $Ca^{2+}$  signalling mechanisms in astrocytes it is essential to integrate the results obtained from several different preparations.

## Visualizing astrocytic Ca<sup>2+</sup> signals

Overall, the experimental techniques for monitoring astrocytic Ca<sup>2+</sup> dynamics by fluorescence microscopy do not differ from those in other areas of neuroscience and biology. Approaches for introducing Ca<sup>2+</sup>-sensitive fluorescent dyes into cells are summarized in TABLE 1. In the following sections, we highlight a few key aspects that can substantially affect calcium imaging results and their interpretation.

*The dimensionality of Ca*<sup>2+</sup> *events.* Changes in the cytosolic Ca<sup>2+</sup> concentration in astrocytes occur in three spatial dimensions and over time. Thus, each event can have a characteristic spread, speed and temporal



Fig. 1 | Visualization of astrocytic Ca<sup>2+</sup> signals. a | Cultured astrocytes typically develop a very different morphology to astrocytes either in vivo or in acute brain slices, characterized by few, if any, main processes (which are homologous to astrocytic branches in vivo) and the absence of leaflets. Instead, cultured astrocytes form a thin organelle-free protoplasmic cloud around their processes. A large number of small Ca<sup>2+</sup> events are triggered in this protoplasmic cloud, some of which are amplified and propagate through the processes and soma.  $\mathbf{b}$  | Imaging of Ca<sup>2+</sup> events in brain slices (a hippocampal slice is depicted). Spontaneous Ca<sup>2+</sup> transients in quiescent ex vivo astrocytes occur predominantly in distal astrocytic processes and occasionally in the soma.  $\mathbf{c}$  | Neuronal activity increases the spread and duration of spontaneous Ca<sup>2+</sup> events and also triggers new Ca<sup>2+</sup> events in astrocytes. Some Ca<sup>2+</sup> events in processes become sufficiently amplified to propagate all the way to the soma. **d** Genetic deletion of inositol 1,4,5-trisphosphate receptor type 2 ( $lnsP_3R2$ ) ( $lp3r2^{-/-}$ ) in astrocytes dampens  $Ca^{2+}$  events. Although spontaneous  $Ca^{2+}$  events are considerably reduced, new events can still be triggered by Ca<sup>2+</sup> entry through the plasma membrane and Ca<sup>2+</sup> efflux from mitochondria. The absence of InsP<sub>2</sub>R2 prevents the amplification (spreading and prolongation) of Ca<sup>2+</sup> events and the generation of new events that rely on  $Ca^{2+}$  release from the endoplasmic reticulum. e | Imaging of  $Ca^{2+}$  events in awake mice reveals astrocytic responses to sensory stimulation and behaviour (such as locomotion, foot shock and whisker stimulation).  $f | Each Ca^{2+}$  signal can be characterized by several parameters: the magnitude of the elevation in  $Ca^{2+}$  concentrations (amplitude), its spatial spread in three dimensions and its duration and temporal pattern. Within a given pattern of  $Ca^{2+}$  activity, the event coordinates can also be defined within the astrocytic domain or within the local astrocytic network in both space and time.

profile (FIG. 1). However, astrocytic  $Ca^{2+}$  events are mostly detected by monitoring the intensity of  $Ca^{2+}$  indicator fluorescence in a single focal plane. Three-dimensional (3D) scanning enables information about  $Ca^{2+}$  signal manifestations in a third dimension (the *z* axis) to be obtained<sup>42</sup>. However, stepwise frame-by-frame scanning along the z axis necessarily reduces the imaging

speed of 3D scanning, meaning that rapid  $Ca^{2+}$  events might go undetected. Decreasing the voxel dwell time can compensate for this inherent limitation of 3D imaging, albeit at the expense of collecting fewer photons per voxel, which inevitably means that small-amplitude (less bright)  $Ca^{2+}$  events might go undetected. Furthermore, as each plane scanned along the *z* axis is imaged at a

#### Table 1 | Fluorescent indicators for detecting astrocytic Ca<sup>2+</sup>

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Examples	Advantages	Limitations	Refs
AM ester dyes: Oregon Green, BAPTA AM and Fluo AM indicator families	Fluo-4 Ca <sup>2+</sup> binding and unbinding rates are superior to those of GECIs for fully resolving rapid Ca <sup>2+</sup> dynamics	Cell non-specific; co-staining with, for instance, sulforhodamine 101 (which can also stain oligodendrocytes and increase neuronal excitability); detects Ca <sup>2+</sup> signals only at the soma or large processes <sup>a</sup>	8,18,115, 128–132
Fluo and Oregon Green BAPTA indicator families, Fura-2	Can be microinjected into individual cells; neighbouring astrocytes can also be imaged owing to dye diffusion through gap junctions; enables microinjection of $Ca^{2+}$ chelators and $Ca^{2+}$ signalling inhibitors; facilitates monitoring the activity and plasticity of nearby synapses	Dialysis of the cell and washout of proteins and possibly organelles could affect Ca <sup>2+</sup> activity in patch-clamped astrocytes	18,44,125, 133,134
GFP-calmodulin fusion proteins expressed using astrocyte-specific promoters (e.g. GFAP) in AAV vectors and Cre-dependent transgenic mice	Widely used to study astrocytic $Ca^{2+}$ transients; subcellular targeting sequences bound to GECIs enable recording of $Ca^{2+}$ dynamics from the membrane vicinity and within intracellular $Ca^{2+}$ stores such as mitochondria and ER	The Ca <sup>2+</sup> -buffering effect of GECIs affects Ca <sup>2+</sup> -dependent processes; mode and level of GECI expression can alter astrocyte behaviour; prolonged overexpression of modified GFP can induce a reactive phenotype; on their own, GECIs detect relative Ca <sup>2+</sup> changes rather than actual intracellular Ca <sup>2+</sup> concentrations	9,31,45, 135–140
Yellow chamaeleon-Nano50 <sup>6</sup>	More accurate measurement than with single-wavelength GECIs; single-wavelength GECI co-expressed with a reference fluorescent protein can be used for ratiometric imaging across cell subregions	The need for two distinct colour channels limits their use in multiplexed imaging (e.g. simultaneous imaging of neurons and astrocytes)	32,135, 141,142
	ExamplesAM ester dyes: Oregon Green, BAPTA AM and Fluo AM indicator familiesFluo and Oregon Green BAPTA indicator families, Fura-2GFP-calmodulin fusion proteins expressed using astrocyte-specific promoters (e.g. GFAP) in AAV vectors and Cre-dependent transgenic miceYellow chamaeleon-Nano50b	ExamplesAdvantagesAM ester dyes: Oregon Green, BAPTA AM and Fluo AM indicator familiesFluo-4 Ca2+ binding and unbinding rates are superior to those of GECIs for fully resolving rapid Ca2+ dynamicsFluo and Oregon Green BAPTA indicator families, Fura-2Can be microinjected into individual cells; neighbouring astrocytes can also be imaged owing to dye diffusion through gap junctions; enables microinjection of Ca2+ chelators and Ca2+ signalling inhibitors; facilitates monitoring the activity and plasticity of nearby synapsesGFP-calmodulin fusion proteins expressed using astrocyte-specific promoters (e.g. GFAP) in AAV vectors and Cre-dependent transgenic miceWidely used to study astrocytic Ca2+ transients; subcellular targeting sequences bound to GECIs enable recording of Ca2+ dynamics from the membrane vicinity and within intracellular Ca2+ stores such as mitochondria and ERYellow chamaeleon-Nano50bMore accurate measurement than with single-wavelength GECIs; single-wavelength GECI co-expressed with a reference fluorescent protein can be used for ratiometric imaging across cell subregions	ExamplesAdvantagesLimitationsAM ester dyes: Oregon Green, BAPTA AM and Fluo AM indicator familiesFluo-4 Ga <sup>2+</sup> binding and unbinding rates are superior to those of GECIs for fully resolving rapid Ca <sup>2+</sup> dynamicsCell non-specific; co-staining with, for instance, sulforhodamine 101 (which can also stain oligodendrocytes and increase neuronal excitability); detects Ca <sup>2+</sup> signals only at the soma or large processes*Fluo and Oregon Green BAPTA indicator families, Fura-2Can be microinjected into individual cells; neighbouring astrocytes can also be imaged owing to dye diffusion through gap junctions; enables microinjection of Ca <sup>2+</sup> chelators and Ca <sup>2+</sup> signalling inhibitors; facilitates monitoring the activity and plasticity of nearby synapsesDialysis of the cell and washout of proteins and possibly organelles could affect Ca <sup>2+</sup> activity in patch-clamped astrocytesGFP-calmodulin 

AAV, adeno-associated virus; AM, acetoxymethyl; BAPTA, 1,2-bis(o-aminophenoxy)ethane-N,N,N',N'-tetraacetic acid; ER, endoplasmic reticulum; GECI, genetically encoded Ca<sup>2+</sup> indicator; GFAP, glial fibrillary acidic protein; GFP, green fluorescent protein. <sup>a</sup>Fluorescence originating from thin branchlets and leaflets cannot be distinguished from that of nearby neuronal structures. <sup>b</sup>Based on Förster resonance energy transfer.

different time,  $Ca^{2+}$  signals that extend along the *z* axis might end before 3D scanning is complete. In addition, the tissue depth amenable to 3D imaging is limited by light scattering, with the consequence that the fluorescent signal collected from deep frames might not be directly comparable to that collected from frames near the surface during the same 3D scan. Finally, the highly nonlinear relationship between indicator fluorescence and the actual  $Ca^{2+}$  concentration in various cellular compartments is rarely considered (BOX 1). Thus, depending on the research question, single-plane or line-scan twodimensonal imaging of astrocytic  $Ca^{2+}$  signals (which can be done at faster rates than 3D imaging) might provide more reliable information than 3D scanning.

Quantitative imaging approaches can reveal otherwise undetectable basic properties of  $Ca^{2+}$  signalling, including the resting  $Ca^{2+}$  concentration in astrocytes<sup>43,44</sup>. These modalities were instrumental in showing that the resting  $Ca^{2+}$  concentration controls the scale of local  $Ca^{2+}$  signals, irrespective of whether they were triggered via various receptor pathways in vitro or by running of awake animals<sup>32</sup>.

**Imaging resolution.** Although astrocytic  $Ca^{2+}$  signals are generally considered to be infrequent and to have slow kinetics, studies in ex vivo or in vivo rodent preparations using state-of-the-art GECIs and fast two-photon imaging have reported subsecond fluorescence transients, which still seem to be slower than those reported in neurons<sup>19,45,46</sup>. Further improvement in GECIs, their kinetics and imaging speeds could lead to the detection of even faster subsecond  $Ca^{2+}$  transients. Alternatively, modelling of  $Ca^{2+}$  transients and the kinetics of  $Ca^{2+}$  binding to and unbinding from fluorescent

indicators could lead to further insights into astrocytic Ca<sup>2+</sup> dynamics<sup>47,48</sup>. The subcellular distribution of Ca<sup>2+</sup> indicators (BOX 1) and the effective resolution of 3D imaging approaches also require consideration.

Tissue heating and reactive oxygen species. Obtaining high-quality imaging data or performing optogenetic stimulation often requires prolonged exposure of cells to laser light. Astrocytes seem to be particularly sensitive to such extended exposures<sup>49</sup>, which can increase the local temperature and activate heat-sensitive channels;  $\sim$ 30% of astrocytes in the mouse brain express transient receptor potential vanilloid 4 (TRPV4)<sup>50,51</sup>. Additionally, light exposure can induce excessive generation of intracellular reactive oxygen species (ROS), which can trigger Ca<sup>2+</sup> transients in astrocytes<sup>45,52</sup>. Such photodamage can be greatly reduced by imaging astrocytes with the lowest laser light intensity possible and in sessions of short duration interspersed with imaging-free periods. In experiments on cultured cells and brain slices, photodamage can be further reduced by adding antioxidants such as L-ascorbate and Trolox (6-hydroxy-2,5,7,8tetramethylchroman-2-carboxylic acid, a water-soluble analogue of vitamin E) to the culture medium<sup>53,54</sup>. However, antioxidants need to be used with an extreme caution, as high concentrations or prolonged exposure to these agents can directly influence Ca2+ signalling<sup>55,56</sup>.

*Ca*<sup>2+</sup> *buffering.* Ca<sup>2+</sup> indicators bind Ca<sup>2+</sup> and, hence, have an inherent Ca<sup>2+</sup>-buffering effect. This property raises at least two issues that influence the interpretation of indicator-reported Ca<sup>2+</sup> changes (TABLE 1; BOX 1). First, changes in indicator fluorescence do not directly capture Ca<sup>2+</sup> dynamics in an unperturbed cell because

these indicators have distinct Ca2+ binding and unbinding rates and compete for Ca2+ with endogenous Ca2+binding sites in a concentration-dependent manner<sup>47,57,58</sup>. Determining the time course of 'true' Ca2+ concentrations is a challenging task that requires precise knowledge of, for instance, all the buffering agents involved, their biophysical properties, their concentrations and the underlying Ca<sup>2+</sup> signalling mechanisms. Second, the addition of Ca2+ indicators could disrupt endogenous signalling mechanisms, in a similar way to the inhibition of Ca2+ signalling caused by widely used non-fluorescent Ca<sup>2+</sup> buffers such as ethylene glycol-bis(2-aminoethyl ether)-N,N,N',N'-tetraacetic acid (EGTA) and 1,2bis(o-aminophenoxy)ethane-N,N,N',N'-tetraacetic acid (BAPTA). Their addition can shield native Ca<sup>2+</sup>-binding sites and also alter the effective diffusion coefficient of  $Ca^{2+}$  (REFS<sup>59,60</sup>) in the cytosol, thereby changing its range of action<sup>59,60</sup>. In astrocytes, fluctuations in Ca<sup>2+</sup> levels can be blunted by the indicators and might not reach the threshold for Ca2+-dependent Ca2+ release from internal stores such as the endoplasmic reticulum and mitochondria.

Mathematical modelling suggests that exogenous buffers or  $Ca^{2+}$  indicators can reduce the amplitude and width of  $Ca^{2+}$  events induced by inositol 1,4,5-trisphosphate (InsP<sub>3</sub>) receptors (InsP<sub>3</sub>Rs)<sup>59</sup>. This prediction was experimentally confirmed by the loading of cultured astrocytes with low-affinity and high-affinity membrane-permeant  $Ca^{2+}$  chelators<sup>61</sup>. Thus,  $Ca^{2+}$  indicators can considerably alter the spatio-temporal properties of  $Ca^{2+}$  activity in astrocytic networks. Similarly, low-affinity endogenous  $Ca^{2+}$  buffers can profoundly

## Box 1 | Ca<sup>2+</sup> indicator fluorescence and astrocytic Ca<sup>2+</sup> concentrations

Fluorescence intensity reflects the concentration of Ca<sup>2+</sup>-bound Ca<sup>2+</sup> indicator, which has a non-linear relationship with ambient Ca<sup>2+</sup> concentrations and experimental factors (including indicator concentration, excitation and fluorescence detection method). Interpretation of the intensity and changes in Ca<sup>2+</sup> indicator fluorescence is further complicated by the inherent Ca<sup>2+</sup>-buffering capacity of Ca<sup>2+</sup> indicators, which compete with endogenous molecules for Ca<sup>2+</sup> binding<sup>47,57,58,143</sup>.

Astrocytic Ca<sup>2+</sup> transients (departures of the Ca<sup>2+</sup> concentration from the resting level) are often approximated as  $\Delta F/F_{o}$ , where  $\Delta F$  denotes the change in fluorescence intensity at a given time point relative to the baseline intensity,  $F_{o}$ . Such measures account for changes in indicator concentration, excitation and fluorescence collection between experiments and cells, but are easily distorted by movement artefacts (caused by contraction or dilation of blood vessels in contact with astrocyte end-feet and changes in volume or morphology of the astrocyte investigated) that create spurious changes in fluorescence. In addition, organic Ca<sup>2+</sup> indicators can pass through gap junctions or hemichannels and be sequestered within organelles, thereby lowering their intracellular concentration. Genetically encoded Ca<sup>2+</sup> indicators also aggregate, accumulate or are sequestered by endogenous proteins<sup>143</sup>, which might lead to an undesirable spatial distribution.

 $F_0$  depends on both the indicator concentration in the imaged voxel and the resting Ca<sup>2+</sup> concentration. For astrocytic transients calculated as  $\Delta F/F_0$ , the same increase in Ca<sup>2+</sup> concentration appears smaller when the resting Ca<sup>2+</sup> concentration (and thus  $F_0$ ) is higher in one cellular compartment than in another. Also, for commonly used dyes,  $\Delta F$  is decreased for identical Ca<sup>2+</sup> concentration rises when the resting Ca<sup>2+</sup> concentration is high. Resting Ca<sup>2+</sup> concentration can differ substantially between astrocytes and across their subcellular domains<sup>32,44</sup>. Ideally, direct estimates of Ca<sup>2+</sup> concentrations are obtained with use of calibrated ratiometric dyes (TABLE 1). Alternatively, fluorescence lifetime imaging relies on changes in the fluorescence lifetime of some indicators<sup>144</sup> and has been used successfully to study astrocytic Ca<sup>2+</sup> signalling<sup>32,43,44,125</sup>. Quantitative two-photon excitation imaging modalities have been reviewed in detail elsewhere<sup>145</sup>.

shape astrocytic Ca<sup>2+</sup> signals and their propagation<sup>48,61</sup>. Importantly, the ability of endogenous Ca<sup>2+</sup> buffers to bind additional Ca<sup>2+</sup>, for instance during Ca<sup>2+</sup> influx into the astrocyte cytosol, is also influenced by resting Ca<sup>2+</sup> levels. In turn, resting Ca<sup>2+</sup> levels determine to what extent endogenous Ca<sup>2+</sup> buffers are preloaded with Ca<sup>2+</sup>. Detailed information on the identity, concentration and biophysical properties of mobile and immobile Ca<sup>2+</sup> buffers in astrocytes will be important to obtain in the future.

Imaging  $Ca^{2+}$  signals in astrocytes is a favoured method for studying the complex physiology of these cells. Owing to the availability of various viral vectors and transgenic mouse lines<sup>62</sup> carrying GECIs and of two-photon excitation fluorescence microscopy, this versatile method is becoming widely used. Caution in choosing appropriate imaging parameters and awareness of their limitations are required when one is interpreting the biological significance of recorded  $Ca^{2+}$  transients.

## Analysing astrocytic Ca<sup>2+</sup> signals

Ca<sup>2+</sup> activity within a single astrocyte and in astrocytic networks consists of discrete individual events that emerge at different locations and times. These events differ widely in their amplitude and duration; quite often, neighbouring events can undergo spread and merge into larger events that have distinct spatio-temporal characteristics<sup>18,63,64</sup>. Several concepts, algorithms and methods have been developed to characterize the spatio-temporal patterns of astrocytic Ca<sup>2+</sup> events. Methods such as single-plane time-lapse fluorescence imaging involve extraction of the total number of active pixels in a time series, whereas other techniques determine the number, sizes and relative positions of individually detected Ca2+ events8,21,45,63-68. All these methods address different aspects of Ca2+ signals. At present, the major challenge is to come up with a robust and physiologically relevant definition of an astrocytic Ca2+ event that can be used to design novel, computationally sound and comprehensive analytical tools.

Detecting astrocytic Ca2+ signals. Detection of an astrocytic Ca2+ signal usually requires the Ca2+ level to depart substantially from a fairly well-defined resting value. In common with other types of image processing, setting an appropriate threshold for detection of a Ca<sup>2+</sup> signal presents a formidable challenge. Among many potential issues, biases can arise from the non-linear transformation of Ca2+ concentration transients into fluorescent signals (BOX 1). For instance, when thresholds are applied to data quantified as  $\Delta F/F_0$  instead of actual Ca<sup>2+</sup> concentrations, it is unclear whether Ca2+ level increases across the cell and over time have to reach different magnitudes to be detected as events. Thus, threshold selection is non-trivial and can skew the results by including falsepositive events as well as by excluding genuine Ca2+ events. Multiple-threshold-based and non-thresholdbased detection methods could increase the accuracy of event analysis. Indeed, the benefits of multiple-threshold analysis are well known in image segmentation69 and immunocytochemical studies70,71. Such methods could also be useful for the segmentation of Ca<sup>2+</sup> events in

# Deconvolution-based techniques

Deconvolution (reversing the inherent image distortion specific to a given microscope or other imaging instrument) is usually done by imageprocessing software as part of image generation.

#### Schaffer collaterals

Axon collaterals derived from CA3 pyramidal cells that project to hippocampal area CA1. Schaffer collaterals influence learning and memory via activity-dependent plasticity and are integral to hippocampal medial limbic and trisynaptic circuits. time-lapse imaging of astrocytes. In addition, individual  $Ca^{2+}$  transients could be located by template-matching methods or quantified by deconvolution-based techniques, which have been successfully used to improve the detection of spontaneous synaptic currents<sup>72,73</sup> and  $Ca^{2+}$  transients<sup>74,75</sup> in neurons. Finally, frequency-domain analysis (such as spectral or wavelet analysis of overall  $Ca^{2+}$  dynamics) might avoid the need to identify distinct astrocytic  $Ca^{2+}$  signalling events.

Region of interest-based analysis. Manual or semiautomatic selection of a fixed region of interest (ROI) and the subsequent analysis of time-dependent fluorescence changes in that ROI is a classic method of analysis in all cell types, including astrocytes (FIG. 2a). ROI-based analysis has been successfully used in many preparations, including those in which the initial observations of astrocytic Ca2+ signals were made8,18. ROI-based analysis is straightforward and easy to implement but has various limitations. First, defining objective criteria for ROI selection is non-trivial, especially in astrocytes with their complex structure and morphology; many astrocyte processes cannot be resolved by diffractionlimited microscopy. Second, the fluorescence intensity of the Ca<sup>2+</sup> indicator is commonly averaged across the ROI, but this approach results in all information on the spatial structure of the event and its changes within the ROI being lost. This loss is especially problematic for complex astrocytic Ca2+ transients, which might develop separately in space and time and merge later, or vice versa (FIG. 2). Therefore, 'smart' ROI-based approaches to automatically identify ROIs have been developed with use of various mathematical models, such as principal component analysis<sup>19,76,77</sup> and machine learning algorithms, including support vector machines<sup>45</sup> (FIG. 2b). Another major problem in automated signal processing is defining the baseline fluorescence value in an ROI. Owing to high variability in the number of Ca<sup>2+</sup> transients in each ROI, simple mean or median values of these signals cannot be used to normalize the data. A possible solution is to use iterative methods to calculate the absolute mean and standard deviation of the background noise in each ROI, and subsequently to use these values for data normalization in the corresponding ROIs. Both machine learning-based automatic ROI detection and an iterative method for noise calculation in the analysis of astrocyte Ca2+ transients have been implemented in a newly developed MATLAB-based algorithm called 'CaSCaDe' (for 'Ca2+ signal classification and decoding')45. Once ROIs have been defined and baseline fluorescence values have been calculated for each ROI, Ca<sup>2+</sup> activity within these ROIs is analysed with use of standard signal-processing parameters such as the number of active microdomains and the frequency, amplitude or duration of Ca2+ transients. However, the activity patterns and characteristics of Ca<sup>2+</sup> signals within each ROI are complex, and further work is required to refine and develop methods to characterize signals within these ROIs.

 $Ca^{2+}$  event-based analysis. As  $Ca^{2+}$  events in astrocytes merge, split and propagate in space and time, some events will start and finish outside the boundaries of

spatially fixed ROIs (FIG. 2c,d). An increase in the spatial size of  $Ca^{2+}$  events could result in their invasion of another nearby fixed ROI, where they will be falsely detected as a new  $Ca^{2+}$  transient. The appearance of such false new  $Ca^{2+}$  transients has been demonstrated in somatic ROIs in response to bath application of a metabotropic glutamate receptor agonist in cultured astrocytes<sup>21</sup>.

The observation that Ca<sup>2+</sup> events propagate within single astrocytes and through the astrocytic syncytium was first made in cell culture experiments in the 1990s<sup>8,64</sup>. Application of an algorithm for the detection of spatio-temporal Ca2+ events in cultured astrocytes64 showed that the spatial extent of Ca2+ events follows a power-law distribution, which suggests that widely used statistics assuming a Gaussian distribution cannot be applied to compare Ca<sup>2+</sup> event properties. Consistent with this finding in cultured astrocytes<sup>64</sup>, a similar algorithm applied to mouse hippocampal slices showed that the size and duration of Ca2+ events also followed power-law distributions<sup>21</sup>. In this study, stimulation of Schaffer collaterals increased the spread of Ca<sup>2+</sup> events detected in the CA1 region, which also changed the power-law exponent.

The detection of spatio-temporal Ca<sup>2+</sup> events can be used to characterize the patterns of Ca<sup>2+</sup> activity within the spatial domains of single astrocytes<sup>65,66</sup> in terms of the number of events per frame and the total active area. Ca<sup>2+</sup> event starting points have also been characterized in relation to astrocyte morphology<sup>67</sup>. Development of the Astrocyte Quantitative Analysis (AQuA) machine learning algorithm led to substantial advances in Ca2+ event-based analysis63. This algorithm can be used to analyse the propagation path, direction and speed of Ca<sup>2+</sup> events in different preparations, including in vivo. Importantly, individual Ca2+ events in an astrocyte population are associated with a unique pattern of parameters, such as the density of events and their relative positions, sizes and durations (reviewed elsewhere<sup>78</sup>). The links between these patterns and physiological functioning of the astrocytic network are still unclear.

At present, only a few approaches are available to quantify limited aspects of  $Ca^{2+}$  activity in astrocytes at the population level, such as measurements of the total active area or the number of  $Ca^{2+}$  events per imaging frame<sup>63,65</sup>. The emergence of 3D  $Ca^{2+}$  imaging of astrocytes<sup>42</sup> adds another level of complexity and requires the development of sophisticated data-analysis tools to evaluate dynamic changes in the volume and propagation of  $Ca^{2+}$  events. No single algorithm is ultimately likely to capture all the diverse activity patterns of  $Ca^{2+}$  signals in an astrocyte or an astrocytic network. However, combinations of several complementary analytical methods offer a plausible strategy to extract relevant information for decoding the biological significance of  $Ca^{2+}$  transients.

## Interpreting astrocytic Ca<sup>2+</sup> signals

Neuronal physiology had already been extensively explored with electrophysiological tools before the advent of detailed analysis of astrocytic Ca<sup>2+</sup> signalling. Therefore, neuronal concepts have often been applied to astrocytic Ca<sup>2+</sup> signals for convenience. However, the expression profiles of various channels and receptors suggest that astrocytic signalling operates according to biophysical principles distinct from those in neurons. Hence, the mechanisms that regulate neuronal responses probably cannot be directly extrapolated to astrocytic Ca<sup>2+</sup> signalling (FIG. 3). Attempts to adapt neuromorphic interpretations and



region of interest (ROI)-based analysis of astrocytic Ca2+ signals, ROIs are defined according to visually identified anatomical structures or other criteria without a prior in-depth analysis of Ca<sup>2+</sup> signals. Therefore, such ROIs might include only parts of spreading events or might contain multiple foci of events within the same frame. When selected ROIs are all the same size (ROIs 1-4), the weight of the pixels in mean fluorescence terms is the same in each ROI. ROIs of differing sizes might also be selected (not shown). The graphs at the bottom show the mean fluorescence intensity from each pixel of ROIs 1-4. b | In smart ROI-based analysis of astrocytic Ca<sup>2+</sup> signals, ROIs are defined with use of mathematical models or machine learning-based algorithms that analyse Ca2+ activity in the entire imaging stack and then use various parameters to both select and analyse optimally active regions. These algorithms are designed to adapt to changing levels and distributions of activity across cells and experiments. ROIs can also be determined or refined by astrocyte morphology (such as endoplasmic reticulum tangles or mitochondrial location) and physiology (such as local synaptic activity). As for manual ROIs, Ca<sup>2+</sup> events in smart ROIs might occupy only part of the frame and might propagate through several adjacent ROIs (see ROIs 3-5). Moreover, smart ROIs have different sizes,

and hence different pixel weights contribute to mean fluorescence. The graphs at the bottom show the average of the normalized fluorescence from each pixel of the soma and five selected ROIs. c | In event-based analysis, all pixels in which the fluorescence increase exceeds a given threshold are considered active in each recording frame. All adjoining active pixels are considered to be part of a single Ca<sup>2+</sup> event, and the evolution of this event is traced in subsequent frames. The time course of events in a single astrocyte is shown, with shapes indicating individual Ca<sup>2+</sup> events. The major drawback of this method is that the spread and duration of Ca<sup>2+</sup> events strongly depend on the detection threshold selected. The graphs show the time courses of the active area, the density of Ca<sup>2+</sup> events detected in each frame and the maximal event size. **d** Limitations of ROI-based analysis are illustrated using an astrocytic process divided into three ROIs at three moments in time  $(t_1, t_2, t_3)$ . For localized or focal Ca<sup>2+</sup> signals (left panel), one Ca<sup>2+</sup> event occurs in each ROI during the recording and event-based imaging analysis records three separate events, whereas ROI-based analysis records one event per ROI. However, when these events expand and propagate (right panel), event-based analysis still reports three separate events, whereas ROIs-based analysis reports multiple events per ROI. Part **d** adapted with permission from REF.<sup>21</sup>, Elsevier.



Fig. 3 | Signal processing in astrocytes and neurons. a | Simplified information flow in an excitatory neuron such as a pyramidal cell. Spatially and temporally distributed synaptic input is integrated locally in dendritic segments. Dendritic mechanisms determine the flow of electrical signals towards the soma and the axonal hillock, where sequences of action potentials are generated and propagate down the axon to reach their downstream synaptic targets. **b** | In contrast to neurons, the somatic region of astrocytes is not a central signalling hub. Instead, widely distributed foci of Ca<sup>2+</sup> signals are thought to trigger local downstream signalling cascades that in turn modify local neuronal signalling. Astrocytic processes are categorized as primary branches, higher-order branchlets, terminal leaflets and end-feet that contact blood vessels. Branchlets carry the thin organelle-free leaflets, which are intermingled with neuronal structures and (with a few rare exceptions) do not invade the synaptic cleft. Leaflets generate Ca<sup>2+</sup> transients owing to Ca<sup>2+</sup> entry through the plasma membrane (via sodium/calcium exchanger (NCX)) following Na<sup>+</sup> level elevation during

neurotransmitter uptake and other receptors or channels. Ca<sup>2+</sup> level elevations can propagate into branchlets, which contain endoplasmic reticulum (ER), and can be amplified and propagated by Ca<sup>2+</sup>-dependent Ca<sup>2+</sup> release through inositol 1,4,5-trisphosphate receptors (IP3Rs). G-protein-coupled receptors (GPCRs) are abundantly expressed by astrocytes and drive astrocytic Ca<sup>2+</sup> signalling by production of inositol 1,4,5-trisphosphate. In the cytosol, Ca<sup>2+</sup> is buffered by endogenous buffers and (when they are introduced) Ca<sup>2+</sup> indicators. Then, Ca<sup>2+</sup> is removed from the cell by plasma membrane Ca<sup>2+</sup> ATPase (PCMA) or moved to the ER by sarcoplasmic/endoplasmic reticulum calcium ATPase (SERCA). In addition to ER, astrocytic branchlets contain elongated mitochondria, which actively participate in local Ca<sup>2+</sup> dynamics by releasing Ca<sup>2+</sup> through the mitochondrial permeability transition pore (mPTP) and mitochondrial NCX (mNCX) and by sequestering Ca2+ via the mitochondrial Ca2+ uniporter (MCU). Mitochondria also serve as a source of reactive oxygen species (ROS), which regulate astrocytic Ca<sup>2+</sup> activity.

neuron-derived concepts to astrocytes are ultimately likely to prove futile.

Astrocytic  $Ca^{2+}$  events can be classified as either spontaneous or triggered. Spontaneous  $Ca^{2+}$  events are generated intrinsically without any external stimuli, whereas triggered  $Ca^{2+}$  events occur in response to changes in the astrocytic environment, such as synaptic or neuronal activity and physiologically relevant internal and external triggers (FIG. 1). **Spontaneous Ca**<sup>2+</sup> **events.** The precise mechanisms by which spontaneous Ca<sup>2+</sup> transients are generated in astrocytes remain under investigation. Astrocytes are able to generate spontaneous Ca<sup>2+</sup> events even when neuronal firing is blocked by tetrodotoxin<sup>79</sup>, when neuronal and astrocytic vesicular release is blocked by bafilomycin A1 (REFS<sup>18,80</sup>) and despite genetic knockout of astrocytic InsP<sub>3</sub>R type 2 (InsP<sub>3</sub>R2)<sup>45,77,81</sup>. Most likely, these spontaneous Ca<sup>2+</sup> events are triggered by stochastic Ca<sup>2+</sup>

fluxes through multiple pathways. Ca<sup>2+</sup> can enter the cell through Ca<sup>2+</sup>-permeable receptors, Ca<sup>2+</sup> channels and Na<sup>+</sup>/Ca<sup>2+</sup> exchangers located on the plasma membrane and can pass through InsP<sub>3</sub>Rs on the endoplasmic reticulum and through mitochondrial permeability transition pores<sup>17,45,67,78,82,83</sup>. Superposition of these small and spatially restricted Ca<sup>2+</sup> fluxes leads to local cytosolic fluctuations of Ca<sup>2+</sup> concentration that can reach the threshold for Ca<sup>2+</sup>-dependent Ca<sup>2+</sup> release through InsP<sub>3</sub>Rs, leading to the amplification and propagation of spontaneous Ca<sup>2+</sup> events<sup>84</sup> (FICS 3,4).

External stimuli can either modulate existing spontaneous Ca2+ activity or trigger new Ca2+ responses, although distinguishing between these two scenarios might prove challenging. Glutamate, ATP and noradrenaline can activate the  $\alpha$ -subunits of astrocytic G<sub>a</sub> proteins  $(G, \alpha)$  via the corresponding G-protein-coupled receptors, which leads to the production of diacylglycerol and InsP<sub>3</sub> by phospholipase C. The levels of InsP<sub>3</sub> and Ca<sup>2+</sup> jointly determine the open probability of InsP<sub>3</sub>Rs<sup>85</sup>, and a high cytosolic InsP<sub>3</sub> concentration increases the chance of spontaneous Ca2+ fluctuations becoming amplified through Ca<sup>2+</sup>-dependent Ca<sup>2+</sup> release. This amplification can convert spatially restricted spontaneous Ca2+ events into propagating events, and neuronal activity can thereby boost the propagation of Ca<sup>2+</sup> events in astrocytes<sup>21</sup>. When InsP<sub>3</sub>R2 is genetically deleted in mouse astrocytes, spontaneous Ca2+ fluctuations (which are mediated by Ca2+ entry through the plasma membrane or released by mitochondria) still occur but can no longer be amplified by Ca2+-dependent Ca2+ release. Hence, the proportion of spreading Ca<sup>2+</sup> events is greatly decreased in mice lacking  $InsP_3R2$  (REFS<sup>45,77,86</sup>).

The stochastic probability of InsP<sub>3</sub>R opening and mitochondrial permeability transition pore opening can be further enhanced by increased ROS production<sup>87,88</sup> during states of high metabolic demand, such as increased neuronal firing or enhanced cellular stress during pathological conditions such as epileptic seizures<sup>89</sup>, and in astrocytes that overexpress a mutant superoxide dismutase 1 (SOD1) bearing the amino acid substitution Gly93Ala, which leads to the accumulation of cytotoxic levels of intracellular ROS<sup>45</sup>. These studies indicate that ROS can modulate the frequency, spread and duration of spontaneous Ca2+ activity in astrocytes. Hence, spontaneous Ca2+ transients can be considered to report the internal state of astrocytes. Changes in the characteristics of these transients might act as a sensitive indicator of the metabolic or redox state of the cell.

*Triggered Ca*<sup>2+</sup> *events.* Ca<sup>2+</sup> events in astrocytes can be triggered by activation of a plethora of cell surface receptors, channels and exchangers. A very common signalling motif is the activation of metabotropic receptors, which increase both cytosolic InsP<sub>3</sub> levels and the InsP<sub>3</sub>R open probability, thereby promoting Ca<sup>2+</sup> release from Ca<sup>2+</sup> stores<sup>1,2</sup>. However, Ca<sup>2+</sup> can also directly enter the astrocyte cytosol — via, for instance, ionotropic glutamate receptors, purinergic P2X and nicotinic cholinergic receptors — in response to neuronal activity (reviewed elsewhere<sup>2</sup>). In addition, the uptake of glutamate and GABA leads to Na<sup>+</sup> influx, which activates Na<sup>+</sup>/Ca<sup>2+</sup> exchangers and can trigger Ca<sup>2+</sup> transients in astrocytes<sup>90-92</sup>. G<sub>s</sub>α-coupled and G<sub>1</sub>α-coupled metabotropic receptors can also trigger Ca<sup>2+</sup> transients in astrocytes, via an unknown mechanism<sup>62,93</sup>. Astrocytes sense many types of signals, including the volumetric release of neuromodulators and changes in the partial pressures of CO<sub>2</sub> and O<sub>2</sub>, pH, temperature and cerebral perfusion pressure, and often respond to these changes by modulating Ca<sup>2+</sup> signals<sup>78,94-98</sup>.

As a result of the shared intracellular signalling mechanisms involving cytosolic Ca<sup>2+</sup>, InsP<sub>2</sub> and InsP<sub>2</sub>Rs, spontaneously generated Ca2+ transients as well as their modulation by receptor activity and receptor-dependent induction of new Ca<sup>2+</sup> transients are tightly interlinked. Each experimental setting provides a snapshot of this continuum but its specific make-up will depend on many parameters, including neuronal and neuromodulatory activity and metabolic state. This convergence of intracellular signalling mechanisms puts InsP<sub>3</sub>Rs at centre stage; astrocytic Ca<sup>2+</sup> signalling was long thought to depend almost exclusively on InsP<sub>3</sub>R signalling. Although InsP<sub>3</sub>R2 has a major role in astrocytes<sup>99</sup>, other InsP<sub>2</sub>Rs are also involved<sup>86</sup>. Genetic deletion of InsP<sub>2</sub>Rs can be used as a tool to disentangle and isolate Ca2+ signalling cascades. In Ip3r2-/- mice (Ip3r2 is also known as *Itpr2*), for instance, very few Ca<sup>2+</sup> transients are directly triggered by neuronal activity, and most activity represents spontaneous Ca2+ transients45,46,77,100.

Ca<sup>2+</sup> activity and astrocyte morphology. The amplitude of stochastic Ca2+ level fluctuations in astrocytic branchlets depends on their surface-to-volume ratio<sup>68</sup>, which is highest in the distal branchlets, where Ca2+ entry into the cytosol therefore produces the largest Ca<sup>2+</sup> level elevations<sup>13,101</sup>. Hence, Ca<sup>2+</sup> level fluctuations in thin distal branchlets are more likely than somatic Ca<sup>2+</sup> level fluctuations to reach the threshold for amplification by Ca2+-dependent Ca2+ release67. Quantitative fluorescence lifetime imaging has revealed bigger amplitudes of Ca2+ transients in response to metabotropic glutamate receptor agonist treatment in astrocyte regions dominated by distal processes<sup>32</sup>. Several groups have also observed spatial restriction of spontaneous Ca<sup>2+</sup> events in ex vivo and in vivo preparations<sup>17,45,67,68,81</sup>. These events occur predominantly in distal parts of the astrocyte processes called 'microdomains'<sup>17,45,67,68,81</sup>. Each individual astrocyte possesses a myriad of such microdomains<sup>102</sup>. A study that used stimulated emission depletion microscopy to look for correlations between sub-diffraction-limit astrocyte morphology and subcellular Ca2+ activity103 found that most astrocytic Ca2+ transients originate at node-like and synapse-associated structures<sup>103</sup>. Further studies are needed to clarify the ultrastructural composition and molecular make-up of these compartments.

The observation that specific subcellular compartments are privileged with regard to the generation of Ca<sup>2+</sup> events is intriguing in many ways, not least with regard to the potential relationship between Ca<sup>2+</sup> dynamics and astrocyte morphology. Morphological remodelling events such as changes in the number of branchlets might regulate Ca<sup>2+</sup> dynamics<sup>104</sup>. Conversely, Ca<sup>2+</sup> activity can

### **b** Interactions at groups of synapses

### a Interactions at individual synapses



## c Interactions between neuronal and astrocytic networks



also sculpt astrocyte morphology because  $Ca^{2+}$  level rises trigger the outgrowth of peripheral processes through binding of actin to profiline 1 (REF.<sup>105</sup>). Furthermore, expression of an InsP<sub>3</sub>-absorbing recombinant peptide ( $InsP_3$  sponge) reduces activity-dependent modulation of astrocytic Ca<sup>2+</sup> signals and causes retraction of perisynaptic leaflets in a transgenic mouse model<sup>106</sup>. Hence, neuronal network activity positively modulates Fig. 4 | Different levels of interaction between neurons and astrocytes. a | Synaptic release of neurotransmitters, extrasynaptic neuromodulators such as dopamine and noradrenaline, and retrograde signals such as endocannabinoids trigger Ca<sup>2+</sup> events in perisynaptic astrocytic leaflets. These Ca<sup>2+</sup> events induce the release of signalling molecules that affect neuronal excitability, synaptic transmission and plasticity. b | Ca<sup>2+</sup> events within astrocytic microdomains include the territories of multiple synapses and can influence their activity and/or plasticity by releasing signalling molecules or by changing the synaptic microenvironment. This shared exposure leads to the co-modulation of multiple synapses (synaptic clusters) both on the same and on different dendrites and/or neurons. c | Ca<sup>2+</sup> events (waves) spread through astrocytes and the astrocytic network and change the state of groups of neurons, thereby guiding information processing across the neuronal network. GPCR, G-protein-coupled receptor.

astrocytic  $Ca^{2+}$  signalling, and the reduction of neuronal activity can lead to the retraction of astrocytic leaflets. This interplay between neuronal activity and astrocyte structural changes ultimately reaches an equilibrium that ensures the optimal operation of an astrocyte–neuron network.

Speed of astrocytic Ca<sup>2+</sup> signalling. Neuronal activity, as opposed to non-neuronal brain processes, is often solely linked to real-time information processing in the brain (examples of which include place cell activity, rate coding and neuronal firing locked to the phase of brain rhythms)<sup>107-109</sup>. Astrocytic Ca<sup>2+</sup> signalling is considered too slow to be involved in real-time information processing. Indeed, a single action potential in a neuron lasts a few milliseconds and postsynaptic potentials last a few tens of milliseconds, whereas astrocytic Ca<sup>2+</sup> events occur over durations of several hundred milliseconds to a few seconds. In addition, astrocytic Ca<sup>2+</sup> signalling is characterized by large jitter, meaning that astrocytic responses to external stimulation or neuronal activity might be considerably delayed. The mean interval between sensory stimulation and onset of an astrocytic Ca<sup>2+</sup> event is highly variable (range 1.0-5.5 s)<sup>31,46,110</sup>. Nonetheless, a small subset (~8%) of astrocytic Ca2+ events are 'fast' events, which have a mean onset time of ~333 ms, as rapid as that of some neurons (neuronal mean onset time ~208 ms)46,111. On average, an astrocyte microdomain experiences 0.5-1.0 Ca2+ transients per minute during baseline activity, and this rate can rise to 5-10 Ca2+ transients per minute during stimulation<sup>42,45</sup>. Therefore, an individual astrocyte can sense a diverse range of neuronal signals and integrate this information to derive an appropriate response, which can be simultaneously 'fast' and 'slow' at distinct locations of the cell.

The human reaction time to visual and auditory stimuli is ~100 ms (REFS<sup>112,113</sup>), whereas responding to the conscious intention to move takes more than 1 s (REF.<sup>114</sup>). Neurons can generate meaningful sequences of tens to hundreds of action potentials in such time spans. Astrocytic Ca<sup>2+</sup> events might therefore be too slow for rate-based information encoding. However, astrocytes could also encode information in patterns of Ca<sup>2+</sup> events. Imaging data show that astrocytic Ca<sup>2+</sup> activity patterns (that is, the total area, number and duration of Ca<sup>2+</sup> events) change in each imaging frame<sup>63,65</sup>. Indeed, some Ca<sup>2+</sup> events start and others end at any given moment in time. As a result, spatial patterns of astrocytic activity can change almost instantaneously (FIG. 2).

Ca2+ signalling in astrocytic networks. Individual astrocytes are coupled to their neighbours via gap junctions to form large-scale networks. Gap junctions are permeable to small molecules, including Ca2+, InsP3 and ROS, a characteristic that has long been considered to enable Ca<sup>2+</sup> signals to propagate through the network. Indeed, an early discovery in cultured astrocytes was that intercellular Ca2+ waves are sensitive to gap junction blockade<sup>115</sup>. Furthermore, although connexins are closed by high concentrations of Ca2+ (such as are found in the extracellular space)<sup>116</sup>, intracellular Ca<sup>2+</sup> waves can be mediated by InsP<sub>3</sub> diffusion through gap junctions<sup>117</sup>. In addition to gap junctions, astrocytes communicate with each other through vesicular and non-vesicular release of gliotransmitters such as ATP, glutamate and D-serine<sup>3</sup>. Astrocytic ATP release is also implicated in the propagation of Ca<sup>2+</sup> activity in cultured astrocytic networks<sup>118</sup>, although no intercellular Ca<sup>2+</sup> waves have been detected in brain slices<sup>20</sup>. Nevertheless, simultaneous Ca2+ transients have been observed in multiple astrocytes in vivo during locomotion<sup>28,31,81</sup>, in response to visual<sup>30,119</sup> or whisker<sup>46</sup> stimulation and in APP/PS1 mice<sup>43</sup>. However, Ca<sup>2+</sup> signals could falsely seem to travel in a wave-like manner through an astrocytic network when Ca2+ transients are separately but sequentially triggered in different cells, for example by neuromodulators or spreading neuronal activity (such as spreading depression or epilepsy)31,120.

Effect of neuromodulators. A neuromodulator is a molecule that is not classed as a fast synaptic neurotransmitter but nonetheless affects the excitability and/or firing rate of a population of neurons, a sometimes ambiguous distinction. Classic neuromodulators such as noradrenaline, dopamine, acetylcholine and serotonin are released throughout the brain and spinal cord from subcortical projections located in distinct nuclei. However, such direct neuron-to-neuron neuromodulation is complemented by emerging findings that neuromodulators can also target astrocytes and influence Ca<sup>2+</sup> activity in astrocytic networks across brain regions and species<sup>4,5,121-123</sup>. Noradrenaline, in particular, can modulate the Ca2+ activity of astrocytic networks and enable them to respond to local changes in neuronal activity<sup>29,31,119,124</sup>. For example, in zebrafish, repetitive noradrenaline-mediated Ca2+ signals in astrocytes lead to activation of downstream neurons and suppression of futile behaviour<sup>5</sup>. In Drosophila, noradrenaline-like neuromodulators such as tyramine and octopamine directly activate astrocytes, which in turn modulate downstream dopaminergic neurons and alter complex behaviours such as olfactory-driven chemotaxis and the touch-induced startle response<sup>4</sup>. Similarly, in rodents, a transient increase in noradrenaline in response to whisker stimulation resulted in a transient Ca<sup>2+</sup> rise in astrocytes, whereas repetition of an aversive stimulus led to sustained adrenergic release resulting in increased levels of intracellular Ca2+ and cAMP in a large population of astrocytes<sup>124</sup>. The neuromodulators dopamine and acetylcholine can also trigger or modify astrocytic Ca2+ signals. For instance, dopamine can induce dosedependent and bidirectional astrocytic Ca2+ responses in

#### InsP<sub>3</sub> sponge

A recombinant peptide including modified ligand-binding domains from mouse inositol 1,4,5-trisphosphate (IP<sub>3</sub>) receptor type 1 (IP<sub>3</sub>R1), designed to sequester intracellular InsP<sub>3</sub> owing to its ~ 1,000-fold higher affinity for InsP<sub>3</sub> than for native IP3Rs.

#### APP/PS1 mice

A double-transgenic mouse model of Alzheimer disease that expresses both chimeric (mouse–human) amyloid precursor protein (APP) and mutant human presenilin 1 (PS1) specifically in CNS neurons.

the hippocampus<sup>125</sup> and nucleus accumbens<sup>126</sup>. Similarly, acetylcholine can induce Ca<sup>2+</sup> transients in cortical and hippocampal astrocytes that modulate synaptic transmission and synaptic plasticity<sup>121,127</sup>. In general, astrocytic responses increase the number of possible local effects of a single neuromodulator, and the net effect is likely to differ between different brain regions and according to behavioural context. In turn, the physiological or pathophysiological remodelling of astrocytes, with respect to their ability to sense neuromodulators, integrate this input and modify neuronal signalling, might profoundly alter the local effect of a neuromodulator. Thus, by integrating the information carried by neuromodulators, astrocytes act as potent and rapid regulators of behavioural states.

Neurons influence astrocytic  $Ca^{2+}$  activity via two pathways: local interactions at the level of individual synapses and volume transmission through the diffuse release of neuromodulators. Both pathways change the spatio-temporal properties of spontaneous  $Ca^{2+}$  events and trigger new  $Ca^{2+}$  events. These observations raise several important questions: does a specific pattern of  $Ca^{2+}$  events underlie the activation of astrocytes embedded in neural circuits? If such a pattern exists, what information could be encoded by the activation of ensembles of astrocytes and/or astrocyte subregions, and how do they specifically affect neural network activity? (See FIG. 4.)

#### Conclusions

Advances in imaging technologies have driven a corresponding increase in the complexity of experimental preparations for studying astrocytic  $Ca^{2+}$  events, from cultured cells and brain slices towards imaging in freely moving animals and 3D methods for imaging  $Ca^{2+}$  events (although 3D approaches have not yet been widely adopted). ROI-based and event-based data analysis offer complementary approaches for the detection and analysis of spatio-temporal  $Ca^{2+}$  signals. Such multifaceted characterization of the spatio-temporal properties of  $Ca^{2+}$  events is expected to enable researchers to identify the most physiologically relevant event characteristics — for example, those specifically associated with sensory input, behavioural output, patterns of neuronal network activity or wakefulness.

For example, despite the much slower time course of astrocytic Ca2+ signals compared with neuronal electrical signals, population activity in the astrocytic network as a whole can change very quickly, and hence astrocytes could potentially participate in real-time coding of information in the brain. Ca<sup>2+</sup> signalling in individual astrocytes and astrocytic networks is now known to be intimately linked to astrocyte morphology and to the spatial distribution of the cellular and subcellular components that shape Ca2+ signals. However, Ca2+-dependent morphological interactions between neurons and astrocytes need to be further investigated, especially in in vivo models. Until the development of super-resolution microscopy, in vivo morphological studies of astrocytes were subject to diffraction-limited optical imaging, which fails to resolve fine astrocytic processes. Astrocyte morphology studies using super-resolution microscopy in combination with simultaneous Ca<sup>2+</sup> imaging can potentially close this knowledge gap.

Further studies will also be essential to identify links between the appearance of specific astrocytic Ca<sup>2+</sup> patterns (such as 'place patterns') and animal behaviour, location in space, emotional state and memory acquisition. Indeed, the fact that external stimuli and behaviours can robustly trigger astroglial Ca2+ signalling raises several important questions: can defined levels of neuronal activity summon specific Ca<sup>2+</sup> patterns in astrocytes? Can learning produce long-term changes in astrocytic Ca<sup>2+</sup> patterns, for example through the morphological and functional plasticity of astrocytes? Can the reproduction of specific astrocytic Ca2+ patterns with optogenetic tools result in either the recall of corresponding memories or the triggering of corresponding behaviours? Astrocytic Ca2+ activity patterns could therefore represent a guiding template that modifies the state of the local neuronal network, an intriguing possibility suggesting that the information-possessing capacity of the mammalian brain is considerably larger than we currently acknowledge.

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