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# Pushing the frontiers: tools for monitoring neurotransmitters and neuromodulators

### Zhaofa Wu<sup>1,2</sup>, Dayu Lin<sup>3,4</sup> and Yulong Li<sup>1,2,5,6,7</sup>

Abstract | Neurotransmitters and neuromodulators have a wide range of key roles throughout the nervous system. However, their dynamics in both health and disease have been challenging to assess, owing to the lack of in vivo tools to track them with high spatiotemporal resolution. Thus, developing a platform that enables minimally invasive, large-scale and long-term monitoring of neurotransmitters and neuromodulators with high sensitivity, high molecular specificity and high spatiotemporal resolution has been essential. Here, we review the methods available for monitoring the dynamics of neurotransmitters and neuromodulators. Following a brief summary of non-genetically encoded methods, we focus on recent developments in genetically encoded fluorescent indicators, highlighting how these novel indicators have facilitated advances in our understanding of the functional roles of neurotransmitters and neuromodulators in the nervous system. These studies present a promising outlook for the future development and use of tools to monitor neurotransmitters and neuromodulators.

<sup>1</sup>State Key Laboratory of Membrane Biology, Peking University School of Life Sciences, Beijing, China. <sup>2</sup>PKU-IDG/McGovern Institute for Brain

Research, Beijing, China. <sup>3</sup>Neuroscience Institute, New York University Grossman School of Medicine, New York, NY, USA.

<sup>4</sup>Department of Psychiatry, New York University Grossman School of Medicine, New York, NY, USA.

<sup>5</sup>Peking-Tsinghua Center for Life Sciences, Academy for Advanced Interdisciplinary Studies, Peking University, Beijing, China.

<sup>6</sup>Chinese Institute for Brain Research, Beijing, China.

<sup>7</sup>Institute of Molecular Physiology, Shenzhen Bay Laboratory, Shenzhen, China.

*⊠e-mail: yulongli@pku.edu.cn* https://doi.org/10.1038/

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The nervous system is composed of various cell types, primarily neurons and glia. Neurons predominantly communicate with each other via specialized structures called synapses, which include electrical synapses and chemical synapses. In the chemical synapse, neurotransmitters (NTs) and/or neuromodulators (NMs) are released into synaptic cleft from one cell, typically from synaptic vesicles enriched in the presynaptic cell, and bind receptors on the targeted postsynaptic cells<sup>1,2</sup>. Classical NTs, including glutamate, GABA and acetylcholine (ACh), act through ligand-gated ionotropic receptors and G-protein-coupled receptors (GPCRs) to activate or inhibit the postsynaptic cells. NTs that bind with ionotropic receptors usually initiate rapid, spatially confined, point-to-point synaptic transmission, whereas NMs, including monoamines, nucleotides, neurolipids and neuropeptides, function mainly through GPCRs to initiate molecular signalling cascades, in a relatively slow, long-range and diffused way<sup>3,4</sup>.

Chemical neurotransmission drives a broad range of physiological processes such as arousal, attention, perception and learning, as well as other complex behaviours<sup>5,6</sup>. Impaired neurotransmission has been implicated in many brain disorders, including Alzheimer disease, Parkinson disease, schizophrenia, depression and drug addiction<sup>7–11</sup>. Thus, the ability to monitor the concentration and the dynamics of specific NTs and NMs in the extracellular space with high spatiotemporal precision will provide valuable information regarding the complex

processes that underlie intercellular communication in both health and disease.

As the Chinese philosopher Confucius said more than 2,000 years ago, "Good tools are prerequisite to the successful execution of a job." More recently, the South African biologist and Nobel laureate Sydney Brenner said<sup>12</sup> that "Progress in science depends on new techniques, new discoveries and new ideas, probably in that order." Thanks to the tireless efforts of many innovative researchers, we are entering an era in which NTs and NMs can be tracked at unprecedented spatiotemporal resolution.

Here, we review a range of non-genetically encoded methods (including electrophysiological methods, microdialysis and electrochemical methods) and genetically encoded indicators that have been developed for monitoring neurotransmission. These complementary tools have become indispensable for gaining insights into the dynamic regulation and function of various NTs and NMs in the highly complex nervous system. At the same time, discoveries using these tools are paving the way to explore novel strategies for preventing, diagnosing and treating a wide range of diseases and conditions.

### Non-genetically encoded methods Electrophysiological methods

Electrophysiological methods require the use of discrete electrodes (FIG. 1a), and so information is acquired from a single spatial location (mainly from somas) or, if a

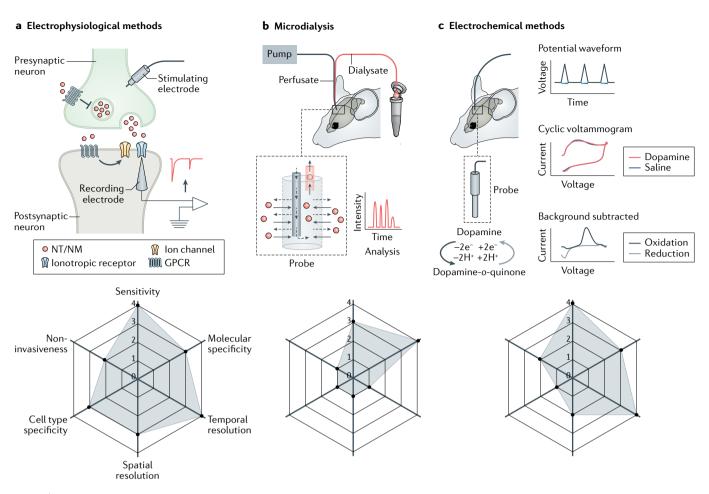


Fig. 1 | Non-genetically encoded methods used to measure neurotransmitters and neuromodulators. a | Electrophysiological methods. Upon stimulation via the stimulating electrode, neurotransmitters or neuromodulators (NTs/NMs) are released from the presynaptic terminal and activate either ionotropic receptors (which then serve as ion channels) or metabotropic receptors (G protein-coupled receptors (GPCRs)), which in turn can activate other ion channels in postsynaptic membrane. Thus, NTs/NMs induce a current in the postsynaptic cell that can be measured using an electrode. **b** | In microdialysis, a perfusate is pumped into the brain via a microdialysis probe, and dialysate containing NTs/NMs is collected for analysis. c | Fast-scan cyclic voltammetry (FSCV) as an example of an electrochemical method. FSCV probe shown implanted in the brain, with example of FSCV waveform for dopamine (DA). DA is oxidized to DA-o-quinone (blue arrow), which can be reduced back to DA (grey arrow). Current recorded by the microelectrode is plotted against voltage; by subtracting the large background current, oxidation (blue curve) and reduction (grey curve) peaks of DA at specific voltages can be seen on the

cyclic voltammogram. Each panel contains a radar chart summarizing the performance index of methods in arbitrary units ranging from 0 to 4, with larger numbers representing better performance (1, poor; 2, fair; 3, good; 4, excellent). For sensitivity: 3, can measure NTs/NMs at nanomolar level; 4, can measure quantal release of NTs/NMs. For molecular specificity: 3, cannot distinguish structure similar NTs/NMs without manipulations; 4, can distinguish structure similar NTs/NMs. For temporal resolution: 1, can measure NT/NM dynamics in the order of minutes; 3, can measure NT/NM dynamics in the order of milliseconds; 4, can measure NT/NM dynamics in the order of microseconds. For spatial resolution: 1, can only measure NT/NM dynamics at more than 100 µm level; 2, can measure NT/NM dynamics at 10-100 µm level; 3, can measure NT/NM dynamics at cellular level (under 10 µm); 4, can measure NT/NM dynamics at subcellular level (under 1 µm). For cell type specificity: 1, very difficult to measure NTs/NMs from a specific cell type; 4, easy to measure NTs/NMs from a specific cell type. For non-invasiveness: 1, severe damage to tissues or cells; 2, moderate damage to tissues or cells; 4, no detectable effects to cell physiology.

multiple-electrode system is used, from a finite number of locations. These recording methods take advantage of fairly standard electrophysiology recording resources and capabilities to measure NT or NM release, which contributes to their wide use<sup>13,14</sup>. However, electrophysiological recordings are technically demanding, of low throughput and largely limited to in vitro studies. Despite being highly sensitive (for example, detecting changes resulting from quantal presynaptic release of NTs<sup>13</sup>), electrophysiological readout (current or membrane potential) is not specifically determined by the ligand of interest; for this reason, receptor antagonists, if available, are often used to verify molecular specificity<sup>13</sup>.

Finally, although electrophysiological techniques offer sub-millisecond temporal resolutions, they do not provide a direct measure of release kinetics (FIG. 1a). Nevertheless, electrophysiology can be combined with the direct detection methods to study the release of NTs and NMs and their downstream effects in targeting cells (discussed below).

### Microdialysis

Since it was developed in the 1960s, in vivo brain microdialysis has become a well-established and widely used tool<sup>16</sup>. Microdialysis separates the perfusion media from the tissue using a semipermeable membrane with a specific pore size (mimicking the properties of capillary blood vessels) that permits the selective diffusion of soluble chemicals such as NTs and NMs in the dialysate from the extracellular space. The dialysate is then collected for further analysis (FIG. 1b).

Several advantages have led microdialysis to be a popular method for measuring NTs and NMs. First, microdialysis provides continuous sampling. When coupled with sensitive analytical techniques such as liquid chromatography or capillary electrophoresis, together with either an ultraviolet absorption detector or mass spectrometry, microdialysis could achieve nanomolar or even picomolar sensitivity with high molecular specificity<sup>17,18</sup>. Thus, for several decades, in vivo microdialysis has been extensively used to measure NTs and NMs, including in freely moving animals over several days, across multiple circadian cycles<sup>19,20</sup>. Second, microdialysis can be used to either simultaneously or sequentially monitor multiple NTs and/or NMs, including electrically inactive transmitters<sup>21</sup>. When combined with metabolomics, microdialysis can also be used for the discovery of small molecular metabolites with functional importance<sup>22</sup>. Microdialysis can similarly collect both endogenous molecules and exogenous substances such as drugs in local tissue regions of interest, thus providing clinically relevant information regarding pharmacokinetics and pharmacodynamics<sup>23</sup>. Moreover, because the movement of molecules through the semipermeable membrane is bidirectional, microdialysis can also be used to deliver compounds locally at defined concentrations and at specific time intervals.

However, despite these advantages, microdialysis has several limitations with respect to NT and NM measurement (FIG. 1b). First, the temporal resolution of microdialysis is relatively low, as minutes are typically needed to collect enough samples to measure specific analytes. In an attempt to increase temporal resolution to 50 s per acquisition, a microfabricated polymer-based probe was used as the droplet collection system<sup>24</sup>.

Second, similar to electrode-based probes, microdialysis lacks high spatial resolution (for example, at the subcellular level). Third, although microdialysis probes can be extremely small (about 100  $\mu$ m in diameter), microdialysis is still a relatively invasive procedure and is difficult to apply in small model organisms such as *Caenorhabditis elegans* and *Drosophila*. Even in rodents and some larger species, it takes several days for animals to recover from the implantation of the microdialysis probe. Furthermore, placement of the probe for a few days in the brain can induce local changes such as gliosis that can compromise the integrity of the blood–brain barrier<sup>25–27</sup>.

Last, although in vivo microdialysis has been widely used for measuring small, soluble NTs and NMs, it is not well suited (and thus rarely used) for measuring neuropeptides and neurolipids. Neuropeptides are rapidly diluted in the extracellular space as they diffuse from localized release sites, with their extracellular concentrations often in the picomolar to nanomolar range. Sample volumes for microdialysis are typically in the nanolitre to microlitre range, and the dialysate is often introduced to capillary-scale separations and requires high-sensitivity mass spectrometry (reviewed elsewhere<sup>28</sup>). Moreover, neurolipids are lipophilic chemicals, and so do not easily diffuse in the aqueous environment of the dialysis probe, and sometimes can even be adsorbed by the probes. These obstacles result in fairly low collection efficiencies and unreliable results<sup>29,30</sup>. Some efforts have been made to reduce the adsorption of neurolipids on the microdialysis probe, as well as to enhance the solubility and stability of neurolipids by adding ingredients. For example, one group chose probes with polyethersulfone membranes and added  $\beta$ -cyclodextrin (as ingredients) to the perfusion fluid<sup>29</sup>.

In addition to being combined with microdialysis for monitoring the dynamics of NTs and NMs, mass spectrometry can be used to measure the spatial distribution of these molecules. For example, a recently developed matrix selectively targeting phenolic and primary amine groups<sup>31</sup> was coupled with matrix-assisted laser desorption–ionization mass spectrometry imaging to simultaneously measure catecholaminergic and serotonergic signalling molecules — including their precursors and metabolites — in specific brain regions in post-mortem tissue of patients with Parkinson disease<sup>31</sup>. However, this method can only be used to measure NT or NM levels in a static state in brain sections, not in vivo, and cannot distinguish between extracellular and intracellular signalling molecules.

### **Electrochemical methods**

In the 1970s, Ralph Adams and colleagues demonstrated the use of voltammetry to measure chemicals in tissues by implanting a carbon-paste electrode into the brain of an anaesthetized rat<sup>32</sup>. Since then, several electrochemical techniques, including amperometry, various potential pulse methods and cyclic voltammetry, have been used to measure fluctuations in NTs and NMs (reviewed elsewhere<sup>33</sup>). Among these methods, fast-scan cyclic voltammetry (FSCV) using carbon-fibre microelectrodes has become a key method for detecting electrochemically active NTs and NMs - most notably, dopamine (DA) — in the nanomolar range and on a sub-second timescale<sup>34–37</sup>. In FSCV, cyclic voltage ramps are applied at a high scan rate (more than 100 V s<sup>-1</sup>) to rapidly oxidize and reduce the electroactive chemicals at the electrode's surface; the electrochemical current recorded by the microelectrode is then plotted against the applied voltage. By subtracting the background current, characteristic peaks in oxidation and/or reduction that occur at specific voltages are visible on the cyclic voltammogram, which are then matched to specific chemical species. The current measured at a specific voltage can then be plotted against time to obtain a time course of the chemical's concentration<sup>37</sup> (FIG. 1c).

Because the FSCV probe is relatively small (less than  $10 \,\mu\text{m}$  in diameter) compared with microdialysis probes, FSCV is less invasive (FIG. 1c) and can be used to measure endogenous NTs and NMs in small animal models such as *Drosophila*<sup>38</sup>. Moreover, FSCV-based methods have been used in vivo to measure sub-second fluctuations in NM levels in humans. To minimize damage, FSCV probes were adapted for use in patients receiving deep brain stimulation treatments for Parkinson disease

### Gliosis The hypertrophy of glial cells.

### Voltammetry

An electrochemical method used to measure the concentration of neurochemicals by detecting the oxidation and reduction processes; signals are calculated in terms of applied potential.

#### Amperometry

An electrochemical method used to measure the concentration of neurochemicals by detecting the oxidation and reduction processes; signals are determined at a fixed voltage.

### Cyclic voltammetry

A voltammetric method in which the current is measured while a linearly cycled potential is swept over the range of interest.

and essential tremor<sup>39</sup>. By using FSCV data to estimate DA and serotonin (5-HT) concentrations, researchers investigated the role of these NMs in reward-based decision-making<sup>40,41</sup> and non-reward-based aspects of cognition and behaviour<sup>39</sup> in humans.

Despite their advantages, FSCV-based methods cannot distinguish between structurally similar chemicals that are oxidized or reduced at similar potentials, such as DA and noradrenaline (NA). Thus, new strategies are needed to make more-selective electrodes, and to distinguish signals derived from multiple analytes. In addition, FSCV is not well suited to measuring NTs or NMs that are not readily oxidized, including glutamate, GABA, ACh, adenosine 5'-triphosphate (ATP), neurolipids and most neuropeptides<sup>42</sup>. Thus, enzyme-modified electrodes have been developed to measure these electrochemically inactive NTs and NMs, particularly glutamate, ATP and ACh<sup>42,43</sup>. In this approach, enzymes that act specifically on an analyte of interest are immobilized on the electrode's surface, and the analyte is detected by the formation of an electroactive product (for example, oxidase-generated hydrogen peroxide). For example, to detect extracellular ACh, the enzyme choline oxidase can be used to measure extracellular choline, a product of ACh hydrolysis by acetylcholinesterase. Choline oxidase catalyses the oxidation of choline in the presence of molecular oxygen, generating the electrochemically detectable hydrogen peroxide<sup>44</sup>. Notably, intermediate products such as choline can also be detected by the enzyme-based electrode. These neurochemical artefacts generate Faradaic currents that can be subtracted using a control biosensor that lacks the first enzyme in the cascade (for example, acetylcholinesterase or adenosine deaminase for measuring ACh44 and adenosine45, respectively) and is therefore not sensitive to the analyte of interest but remains sensitive to downstream products.

Despite recent technical improvements, microdialysis and electrochemical measurements still have relatively low temporal resolution and molecular specificity<sup>46</sup>. In particular, neither method is suitable for measuring in vivo release of NTs and/or NMs at the single-cell or subcellular level.

### Non-genetically encoded optical tools

Compared with the analytical detection methods discussed above, optical imaging methods are more suitable for measuring NTs and NMs, as they typically have higher spatiotemporal resolution and are less invasive. To date, several optical reporters of NTs and NMs have been developed, including chemical dyes (for example, 'false' NTs47, radiolabelled metabolites and MRI or functional MRI probes<sup>48,49</sup>), cell-based sensors such as CNiFERs (cell-based neurotransmitter fluorescent engineered reporters)50 and synthetic nanomaterial-based sensors<sup>51,52</sup>. For example, a non-genetically encoded fluorescent catecholamine nanosensor called nIRCat was synthesized by non-covalently conjugating singlewall carbon nanotubes to single-strand oligonucleotides, which served as the recognition element and enabled catecholamine-interacting nanotubes to act as near-infrared sensors<sup>51</sup>. The nIRCat approach could measure DA release in brain slices and was compatible with DA pharmacology. Importantly, the wide availability of sensors in the near-infrared range (for example, 1,000–1,300 nm wavelength sensors) provides the potential for nIRCat to be combined with other spectrally compatible optical sensors to simultaneously measure multiple signals, including calcium signals and the dynamics of other NTs or NMs. Nevertheless, the selectivity of nIRCat needs to be further improved, as it currently responds to both DA and NA with only 3-fold discrimination<sup>51</sup>.

Although non-genetically encoded tools do not require gene delivery or protein expression, they still need to be delivered to target areas, and cannot be used to measure NTs and NMs in specific cell types.

### **Genetically encoded methods**

Genetically encoded sensors can be expressed in specific cell types for days or even months, enabling researchers to perform long-term imaging of NTs and NMs. In the past few decades, major advances led to the development of various genetically encoded optical tools for imaging neurotransmission and neuronal activity (reviewed elsewhere<sup>53</sup>). In brief, this versatile toolbox includes indicators of vesicle release such as pHlourin<sup>54</sup>, pHTomato<sup>55</sup>, pHmScarlet<sup>56</sup> and multiple neuropeptide-release reporters (NPRRs)<sup>57-61</sup>; genetically encoded Ca<sup>2+</sup> indicators (GECIs) such as GCaMPs (which contain green fluorescent protein (GFP), calmodulin and the M13 peptide from myosin light-chain kinase fused together) and jRGECOs (reviewed elsewhere62); the recently developed voltage indicators (reviewed elsewhere<sup>63</sup>); and NT or NM indicators. The strategies used to develop, optimize and validate genetically encoded indicators - particularly GECIs - have facilitated the design of genetically encoded NT/NM indicators (GENIs). Below, we review the design principles, major properties, applications and limitations of GENIs for directly monitoring NTs and NMs.

### Design principles and properties of GENIs

A typical GENI is primarily composed of two components: a ligand-binding module that binds the NT or NM molecule, and a fluorescent module in the form of either a FRET (fluorescence resonance energy transfer) pair of fluorescent proteins or a single fluorescent protein. Upon binding of the appropriate NT or NM, the conformational change of the ligand-binding module will lead to changes in the signal produced by the fluorescent module. Depending on the type of ligand-binding module, GENIs are roughly categorized as bacterial periplasmic-binding protein (PBP)-based sensors or GPCR-based sensors (FIG. 2; TABLE 1; see Supplementary Table 1).

PBPs belong to a protein superfamily that bind a diverse range of ligands, including NTs and NMs. Ligand binding induces a conformational change in the PBP, providing the basis for GENI design<sup>64</sup>. PBPs are the ligand-binding module in engineered sensors to measure several NTs, including glutamate<sup>65–67</sup>, GABA<sup>68</sup>, ATP<sup>69</sup> and ACh<sup>70</sup> (TABLE 1; see Supplementary Table 1). However, naturally occurring PBPs may not be available for all NTs or NMs. Redesigning the binding pocket of

Faradaic currents

Currents generated by the reduction or oxidation of a chemical substance at an electrode.

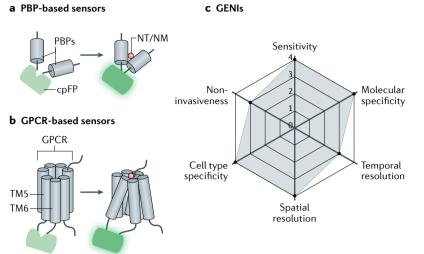


Fig. 2 | Genetically encoded indicators used to measure neurotransmitters and neuromodulators. a | Periplasmic-binding protein (PBP)-based genetically encoded neurotransmitter or neuromodulator (NT/NM) indicators (GENIs) contain a circularly permuted fluorescent protein (cpFP) moiety. Following NT or NM binding, conformational changes of PBP will change fluorescence of cpFP. b | G protein-coupled receptor (GPCR)based GENIs. Similar to PBP-based sensors, cpFP moiety is inserted into the intracellular loop of GPCR between transmembrane domains 5 and 6 (TM5 and TM6). Following NT or NM binding, conformational changes of GPCR induce changes in fluorescence of cpFP. c | Radar chart summarizing performance index of GENIs in arbitrary units, as in FIG. 1.

an existing PBP-based sensor could be a promising approach to develop a sensor that can selectively bind other NTs or NMs. Computational design combined with machine learning was used to implement this approach recently<sup>71</sup> to design a 5-HT sensor called iSeroSnFR, which contains 19 mutations introduced to a previously developed ACh sensor<sup>70</sup> called iAChSnFR0.6. The iSeroSnFR sensor has an approximately 15-fold higher response to 5-HT than to ACh or choline.

Half-maximal effective concentration (EC<sub>50</sub>). The concentration

of a chemical (for example, dopamine (DA)) which induces a response halfway between the baseline and the maximum.

### Dynamic range

The ratio between the largest signal and the lowest one induced by neurochemicals.

### Site-saturation mutagenesis

A powerful mutagenesis strategy for protein engineering and directed evolution, which allows the substitution of predetermined protein sites against all 20 possible amino acids at once.

### $\Delta F/F_0$

A commonly used equation to quantify the fluorescent intensity changes of fluorescent indicators, in which F is the signal trace from each detector and  $F_0$  is the fluorescence baseline. Most PBP-based sensors have relatively low affinity for NMs, which allows them to respond to NMs with millisecond kinetics. However, their low affinity may also limit their application. For example, the physiological concentration of extracellular ATP is in the tens of nanomoles, and yet the half-maximal effective concentration  $(EC_{50})$  for the PBP-based iATPSnFR sensor is about  $350 \,\mu M^{69}$ ; therefore, this sensor may not be sensitive enough to measure changes in extracellular ATP in certain conditions. The relatively low specificity of PBP-based GENIs could also limit their application; for example, the iAChSnFR sensor responds to both ACh and its precursor choline<sup>70</sup>.

GPCRs are the largest family of membrane-spanning proteins and have evolved as natural sensors for detecting extracellular signalling molecules — including NTs and NMs — with remarkably high specificity. Indeed, at least one GPCR has been identified that binds to each small NT, NM and neuropeptide. For example, five subtypes of ACh-binding GPCRs have been identified in humans, each with different affinities and/or pharmacological selectivities. This naturally developed repertoire of diverse GPCRs provides a wide range of choices for engineering GENIs with specific properties and applications. Upon binding of corresponding ligand, the GPCR rapidly (in the order of tens of milliseconds) undergoes a conformational change, with the largest change occurring between the fifth and sixth transmembrane domains<sup>72</sup>. A series of FRET-based sensors have been engineered<sup>73</sup> in which a FRET pair such as CFP and YFP is fused to an intracellular part of the GPCR; upon the conformational change in the GPCR, the distance between the FRET proteins changes, resulting in a change in the FRET signal.

Unlike FRET-based sensors, which use two fluorescent proteins (FPs), sensors that include a single FP rely on detecting a simple increase or decrease in fluorescence intensity. Thus, these single FP-based sensors usually show a relatively high signal-to-noise ratio (SNR) and are more suitable for easy use in vivo. Conformation-sensitive circularly permuted fluorescent proteins (cpFPs)74,75 have been combined with GPCRs to create a series of GENIs called GPCR activation-based (GRAB) sensors for detecting various NMs, including the muscarinic acetylcholine receptor M3 (M3R)-based GRAB<sub>ACh</sub> for ACh<sup>76,77</sup>, the dopamine receptor D2 (D2R)-based GRAB<sub>D4</sub> for DA<sup>78,79</sup> and the a2-adrenergic receptor (a2-AR)-based GRAB<sub>NE</sub> for NA<sup>80</sup> (TABLE 1; see Supplementary Table 1). In a GRAB sensor, a cpFP moiety is inserted into the highly conserved third intracellular loop of the GPCR, as this domain undergoes the largest conformational change upon ligand binding<sup>81-83</sup>.

Here we use the GRAB<sub>DA</sub> sensor<sup>78</sup> as an example to summarize how such NT or NM sensors are designed and optimized. The first step is to select a suitable GPCR scaffold for further optimization. There are five subtypes of dopamine receptor (D1R-D5R), so the green cpFP (called cpEGFP) was inserted into each of the five subtypes and the performances of these chimeras evaluated - including their plasma membrane trafficking dynamics, initial dynamic range, affinity and selectivity. The D2R-cpEGFP chimaera was further optimized owing to its superior membrane trafficking and high affinity for DA. To increase the coupling of fluorescence changes to conformational changes induced by ligand binding, the third intracellular loop was systematically truncated to determine the optimal position of cpEGFP insertion. Subsequent site-saturation mutagenesis on the linker region generated the  $\mathrm{GRAB}_{\mathrm{DA1m}}$  sensor. The maximal  $\Delta F/F_0$  (in the presence of a saturating concentration of DA) of GRAB<sub>DA1m</sub> is ~90% and its  $EC_{50}$  is about 130 nM. To generate GRAB<sub>DA</sub> with distinct affinities, to match the concentrations of released DA in different brain regions or conditions, GPCR variants (for example, with alterations in ligand-binding pockets or other sites affecting ligand-binding affinity) were introduced. A high-affinity sensor  $\text{GRAB}_{\text{DA1h}}$  (EC<sub>50</sub> of about 10 nM) was generated by making a T205M substitution in  $\text{GRAB}_{\text{DAlm}}$ . To further improve the dynamic range of the first-generation GRAB<sub>DA</sub> sensors, site-saturation mutagenesis was performed at 32 sites on cpEGFP that were chosen for their potential to improve the folding ability or brightness of the protein, or its structural coupling with the GPCR<sup>74,84-86</sup>. A screen of about 1,000 site-saturation mutagenesis variants79 yielded GRAB<sub>DA2h</sub> and GRAB<sub>DA2m</sub>, which have a 2-fold to 3-fold greater  $\Delta F/F_0$  than GRAB<sub>DA1m</sub>.

${\sf Table \ 1} \   \ \textbf{Genetically encoded single-wavelength indicators for neurotransmitters and neuromodulators}$									
GENI	Ex/Em (nm)	<b>Responses (maximum</b> $\Delta F/F_0$ )	Affinity (EC <sub>50</sub> )	In vivo application	Refs				
Glutamate sensors									
iGluSnFR	490/510	2.0–4.0 <sup>a</sup> 1.03 <sup>b</sup>	4 μΜª 4.9 μΜ <sup>ь</sup>	Caenorhabditis elegans, zebrafish, mouse	65				
SF-iGluSnFR. A184S	490/510	3.1 <sup>a</sup> 0.69 <sup>b</sup>	0.6 µM⁵	Mouse, ferret	66				
R-iGluSnFR	562/588	Approximately –0.35ª	18 µMª	-	67				
iGlu <sub>u</sub>	-	1.7ª	53 μMª	-	175				
GABA sensors									
iGABASnFR	485/510	~0.75 <sup>b</sup>	30 μM <sup>ь</sup>	Mouse	68				
iGABASnFR.F102G	485/510	~1.7 <sup>b</sup>	42 μM <sup>ь</sup>	Mouse	68				
iGABASnFR.F102Y.Y137L	485/510	~0.45 <sup>b</sup>	$106\mu M^{\scriptscriptstyle b}$	Zebrafish	68				
Acetylcholine sensors									
GRAB <sub>ACh2.0</sub> (GACh2.0)	490/510	0.76ª 0.9 <sup>b</sup>	2 μMª 0.7 μM <sup>ь</sup>	Fly, mouse	76				
GRAB <sub>ACh3.0</sub>	-	2.8ª	2 μMª	Fly, mouse	77				
iAChSnFR	485/510	10ª 4.5 <sup>b</sup>	2 μMª 0.4 μM <sup>ь</sup>	C. elegans, fly, zebrafish, mouse	70				
Dopamine sensors									
GRAB <sub>DA1m</sub>	490/510	0.9 <sup>a,b</sup>	$130nM^{a,b}$	Fly, zebrafish, mouse	78				
GRAB <sub>DA1h</sub>	490/510	<b>0.9</b> <sup>a,b</sup>	$10nM^{a,b}$	Fly, zebrafish, mouse	78				
GRAB <sub>DA2m</sub>	-	3.4 <sup>a,b</sup>	$80nM^{\scriptscriptstyle a,b}$	Fly, mouse	79				
GRAB <sub>DA2h</sub>	500/520	2.8 <sup>a,b</sup>	7 nM <sup>a,b</sup>	Fly, mouse	79				
rGRAB <sub>DA1m</sub>	565/595	1.5 <sup>a,b</sup>	$100nM^{\text{a,b}}$	Fly, mouse	79				
rGRAB <sub>DA1h</sub>	565/595	1.0 <sup>a,b</sup>	4 nM <sup>a,b</sup>	Fly, mouse	79				
dLight1.1	490/516	2.3ª 1.8 <sup>b</sup>	330 nMª 311 nM⁵	Mouse	92				
dLight1.2	490/516	3.4ª	770 nM <sup>a</sup>	Mouse	92				
dLight1.2	490/910	3.0 <sup>b</sup>	1,157 nM⁵	mouse					
dLight1.3b	490/516	9.3ª	1,600 nMª	Mouse, rat	92				
dLight1.4	490/516	1.7ª	4.1 nMª	Mouse, rat	92				
dLight1.5	490/516	1.8ª	110 nMª	-	92				
RdLight1	-/588	2.5ª	859 nMª	Mouse	91				
		2.3 <sup>b</sup>	229 nM⁵						
YdLight1	-/525	3.06 <sup>a</sup>	1,630 nMª	-	91				
Noradrenaline sensors									
GRAB <sub>NE1m</sub>	490/510	2.3 <sup>a,b</sup>	930 nMª 1,900 nM⁵	Zebrafish, mouse	80				
$GRAB_{NE1h}$	490/510	1.3 <sup>a,b</sup>	83 nMª 93 nM <sup>b</sup>	Zebrafish, mouse	80				
nLight1.3	490/516	2.1ª	764 nMª	Mouse	150				
Sovetonin company		1.5 <sup>b</sup>	919 nM⁵						
Serotonin sensors		2 Ea	14 - 14	Elumours	87				
GRAB <sub>5-HT1.0</sub>	_	2.5ª 2.8 <sup>b</sup>	14 nMª, 22 nM <sup>6</sup>	Fly, mouse	07				
iSeroSnFR	490/512	17 <sup>a</sup>	390 µMª	Mouse	71				
PsychLight	-	0.8 <sup>b</sup>	26 nM⁵	Mouse	168				

Table 1 | Genetically encoded single-wavelength indicators for neurotransmitters and neuromodulators

GENI	Ex/Em (nm)	<b>Responses (maximum</b> $\Delta F/F_0$ )	Affinity (EC <sub>50</sub> )	In vivo application	Refs
Endocannabinoid sensors					
GRAB <sub>eCB2.0</sub>	500/520	9.5 <sup>ь</sup> (2-AG) 5 <sup>ь</sup> (AEA)	9.0 μM⁵ (2-AG)	Mouse	88
			0.8 μM <sup>ь</sup> (AEA)		
Adenosine sensors					
GRAB <sub>Ado1.0</sub>	-	1.2ª	60 nM⁵	Mouse	89,176
		~2.0 <sup>b</sup>			
GRAB <sub>Ado1.0m</sub>	-	~3.4 <sup>b</sup>	3.6 µМ⁵	Mouse	176
ATP sensors					
GRAB <sub>ATP1.0</sub>	500/520	5.0ª	~6.7 µMª	Zebrafish, mouse	90
		7.8 <sup>b</sup>	80 nM⁵		
GRAB <sub>ATP1.0-L</sub>	_	~10 <sup>b</sup>	32 μM <sup>ь</sup>	Zebrafish	90
iATPSnFR1.0	473/525	1.0 <sup>a</sup>	350 μMª	Mouse	69
		1.5 <sup>b</sup>	630 μM <sup>ь</sup>		
ATPOS	550/570	1.8°	150 nM°	Mouse	177
Opioid sensors					
kLight1.2a	-	0.6ª	-	Mouse	92,178
GrpLight1.3ER	-	~8.0 <sup>b</sup>	$198\mathrm{nM^{b}}$	Mouse	179
M-SPOTIT	-	12.5ª	15 nM⁵	-	98
		4.2 <sup>b</sup>			

Table 1 (cont.) | Genetically encoded single-wavelength indicators for neurotransmitters and neuromodulators

For more details, see Supplementary Table 1. –, not analysed; 2-AG, 2-arachidonoylglycerol; ACh, acetylcholine; Ado, adenosine; AEA, anandamide; ATP, adenosine 5'-triphosphate; DA, dopamine;  $EC_{so}$ , half-maximal effective concentration; eCB, endocannabinoid; Ex/Em, peak excitation/emission wavelengths; GENI, genetically encoded NT/NM indicator; Glu, glutamate; GRAB, GPCR activation-based; GRP, gastrin-releasing peptide; h, high affinity; 5-HT, serotonin; iGluSnFR, intensity-based glutamate sensitive fluorescent reporter; k, k-opioid; l, intensity-based; m, median affinity; NE, norepinephrine (noradrenaline); NM, neuromodulator; NT, neurotransmitter; OS, optical sensor; r, red-shifted; SF, superfolder GFP; SnFR, sensitive fluorescent reporter; u, ultrafast; Y, yellow-shifted. "Measured in cell lines. bMeasured in cultured neurons. CMeasured using purified proteins.

In fact, the GRAB strategy has been used to develop many other NM sensors, including the serotonin 2C receptor (5-HT<sub>2C</sub>R)-based GRAB<sub>5-HT</sub> for 5-HT (REF.<sup>87</sup>), the cannabinoid receptor type 1 (CB1R)-based GRAB<sub>eCB</sub> for endocannabinoids (eCBs)<sup>88</sup>, the adenosine 2A receptor (A2AR)-based GRAB<sub>Ado</sub> for adenosine<sup>89</sup> and the P2Y<sub>1</sub> receptor (P2Y<sub>1</sub>R)-based GRAB<sub>ATP</sub> for ATP<sup>90</sup>. Furthermore, red-shifted versions of GRAB sensors<sup>79</sup>, which contain circularly permuted mApple as the fluorescent protein, have been developed for multicolour imaging in vivo together with GFP-based sensors (such as GCaMPs and GFP-based GRAB sensors) and blue light-excited actuators (such as channelrhodopsin 2).

Using the similar strategy above, one group developed the dLight family of DA sensors<sup>91,92</sup>. A side by side comparison<sup>78</sup> of dLight and GRAB sensors expressed in cultured cells revealed that the GRAB<sub>DA2m</sub> sensor has a higher apparent affinity for DA, basal brightness and maximal brightness than do the dLight 1.1, 1.2 and 1.3b sensors; in addition, GRAB<sub>DA2m</sub> has a larger  $\Delta F/F_0$  than all dLight sensors except dLight1.3b. Furthermore, two-photon imaging in transgenic *Drosophila* brains showed that GRAB<sub>DA2m</sub> was about 3-fold brighter than dLight1.3b (REE.<sup>79</sup>). The GRAB<sub>DA1h</sub> sensor is sensitive enough to detect DA release induced by minimal electrical stimulation of a single dopaminergic fibre<sup>78</sup>. However, dLight family sensors have a faster off-rate than

 $GRAB_{DA2m}$  and are selective to NA<sup>79,91</sup>. As such, the right sensor to use will depend on the research question<sup>93–96</sup>.

In native GPCRs, the conformational change induced by ligand binding creates a binding pocket for the Ga subunit of the heterotrimeric G protein. Thus, if a G protein is fused to the carboxyl terminus of the GPCR, it would interact with the activated GPCR upon ligand binding. Accordingly, several GENIs - including neuropeptide sensors - have been generated by inserting cpEGFP between the GPCR and a non-signalling Ga subunit or G protein mimic, including short C-terminal peptides derived from Ga proteins, mini-G proteins and Ga-mimic nanobodies<sup>97,98</sup> (TABLE 1; see Supplementary Table 1). The resulting intramolecular engagement of the non-signalling G protein or G protein mimic is believed to compete with endogenous G proteins owing to the former's relatively high effective local concentration, thus preventing downstream G protein signalling through activated GPCR-based GENIs97. However, these sensors have a relatively limited response and slow kinetics. Importantly, the ability of the GENIs discussed above to detect the dynamics of endogenous NTs or NMs in vivo has not been tested.

Tango GPCR assays<sup>99</sup> measure downstream gene expression induced by GPCR activation and usually have good sensitivity. Tango assays detect biased β-arrestin recruitment to GPCRs by ligand binding,

enabling comparisons of GPCR activation across whole brain<sup>100</sup>, as well as the putative detection of NMs if they are released at a relatively constant rate over longer timescales. An improved version called iTango2 (REF.<sup>101</sup>), as well as SPARK<sup>102</sup>, can also report NM signalling at a single time point in vivo; however, these methods show relatively slow kinetics (minutes) compared with GRAB sensors (milliseconds to sub-seconds).

In the future, to optimize NT and NM sensors with a wider dynamic range, suitable molecular specificity, desired pharmacological properties and minimal effects on cellular physiology, efforts should be focused on re-engineering domains in existing sensors, including the ligand-binding pocket and linker regions. Moreover, other naturally occurring NT-binding or NM-binding proteins could be used. For example, to develop a specific glycine sensor, a soil phytopathogen-expressed solute-binding protein that displays promiscuous binding activity for glycine, L-serine and GABA was computationally redesigned<sup>103</sup>. The glycine-selective protein was linked to FRET pairs and underwent linker optimization to generate a sensor called GlyFS. GlyFS has high selectivity for glycine and can detect endogenous glycine release<sup>103</sup>.

Similar to sensors containing fluorescent proteins, luciferase-based bioluminescent sensors are also genetically encodable and are widely used to measure both intracellular and extracellular molecules, with an extremely low background signal<sup>104</sup>. For example, Petersen et al. recently developed BLING (bioluminescent indicator of the neurotransmitter glutamate), which was designed with a split luciferase and a glutamate-sensing domain<sup>105</sup>. The authors showed that BLING reported changes in extracellular glutamate through a change in its luminescence intensity in cultured cells, thus expanding the toolbox of GENIs. However, luciferase-based bioluminescent sensors emit very low numbers of photons, limiting their potential use in imaging NTs or NMs at the cellular scale, particularly in vivo.

### **Considerations when using GENIs**

With the fast expansion of the GENI toolbox, the optical imaging equipment and methods developed for visualizing Ca<sup>2+</sup> indicators can be readily used for visualizing NT and NM signals. Numerous GENIs have been developed, each with its own combination of brightness, dynamic range, affinity, selectivity and kinetics (TABLE 1; see Supplementary Table 1). However, as mentioned by other reviews, there is not a 'one-size-fits-all' sensor<sup>94,96</sup>. When designing an experiment using a GENI, it is important to select the appropriate sensor for addressing the specific biological questions of interest (FIG. 3a).

First, the sensitivity of the GENI should be considered. GENI sensitivity is mainly determined by their dynamic range, affinity and brightness. In principle, if two GENIs show comparable brightness and maximum responses, the GENIs with higher affinity will be more sensitive for detecting NTs or NMs under physiological conditions (FIG. 3a). The sensor's SNR is an important criterion for evaluating the performance of various GENIs, with the goal of achieving the highest SNR possible. Importantly, however, a sensor's SNR is not determined solely by the sensor's response; it is also determined by its basal brightness. For example, although the maximum response of dLight1.3b is higher than that of  $\text{GRAB}_{\text{DA2m}}$ ,  $\text{GRAB}_{\text{DA2m}}$  actually has a higher SNR owing to higher basal brightness<sup>79</sup>.

The second consideration is whether the sensor is selective enough. For example, although current GENIs for DA have better selectivity for DA over NA than FSCV does, GENIs still respond to NA. If researchers want to detect DA dynamics, a DA sensor that could better discriminate DA from NA should be chosen (FIG. 3a).

Third, the kinetics of the GENI should be considered in the context of the research question. Generally, GENIs with fast on-kinetics will have greater responses to brief release events, whereas GENIs with fast off-kinetics are preferable for tracking the dynamics of NTs or NMs associated with closely related events or rapid changes in behaviour (FIG. 3a). In addition, faster off-kinetics may decrease analyte buffering<sup>96</sup>.

Fourth, GENIs, especially GPCR-based indicators, may also respond to agonists or antagonists that normally bind the corresponding parent GPCR, providing a method for validating the signals recorded using GPCR-based GENIs. For example, a GPCR antagonist should compete and block the signal induced by the corresponding NT or NM. However, this may prevent the use of some GPCR-based indicators in combination with certain pharmacological manipulations (FIG. 3a). This issue can be solved, in part, by using different GPCR subtypes as scaffolds for engineering GENIs. In addition, the availability of the structure of most GPCRs provides important information regarding which residues are crucial for agonist or antagonist binding, thus making it possible to engineer GENIs with different pharmacological selectivity. Alternatively, PBP-based indicators, microdialysis or FSCV can be used, although some PBP-based GENIs also respond to certain pharmacological compounds (for example, the iAChSnFR sensor responds to some acetylcholinesterase inhibitors<sup>70</sup>).

The biophysical properties of GENIS — including their dynamic range, brightness, kinetics, ligand affinity, chemical specificity, pharmacological properties and photostability — are relatively easy to characterize in vitro. However, given the complexity of in vivo systems, the performance of a candidate GENI should also be validated in vivo using multiple imaging methods for example, the response of a GENI to optogenetic or chemogenetic stimuli or certain behaviours<sup>94</sup>.

Another issue when designing an experiment using GENIs is their potential effects on cellular physiology. For example, the GRAB<sub>ACh20</sub> sensor, which is based on the M3R, does not completely lack  $G_q$  protein coupling, and so expression of this sensor may affect downstream signalling<sup>76</sup>. Fortunately, optimizing the interface between the M3R and the cpEGFP module led to the next generation of ACh sensor, GRAB<sub>ACh30</sub>, which has an approximately 3.7-fold larger response than GRAB<sub>ACh2.0</sub>, yet negligible coupling with  $G_q$  signalling<sup>77</sup>, thus providing a superior sensor for measuring ACh in vivo with minimal effect on cellular physiology. In fact, most of the GPCR-based GENIs (including GRABs and dLights) show negligible coupling with major GPCR downstream

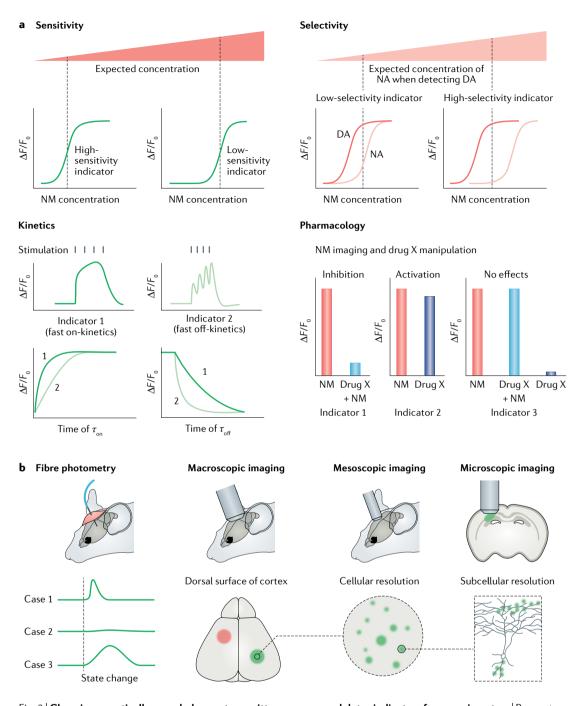


Fig. 3 | Choosing genetically encoded neurotransmitter or neuromodulator indicators for experiments. a | Parameters for choosing a genetically encoded neurotransmitter or neuromodulator (NT/NM) indicator (GENI). First, is the GENI sensitive enough for measuring NTs or NMs of interest? Generally, if two sensors showed comparable maximum responses  $(\Delta F/F_{o})$ , the sensor with higher affinity should be used to detect NT or NM at low concentration. Second, is the sensor selective enough? For example, if users want to detect dopamine (DA) levels, a DA sensor that could better separate DA and noradrenaline (NA) should be chosen. Third, is the sensor fast enough to capture NT or NM dynamics? GENIs with fast on-kinetics ( $\tau_{co}$ ) will have relatively large sensor responses to brief release events. GENIs with fast off-kinetics ( $\tau_{cff}$ ) are preferred to track the dynamics of NTs and NMs in response to closely related events or rapid changes in behaviour. Fourth, is the GENI compatible with any pharmacological manipulations used? GENIs, especially G protein-coupled receptor (GPCR)-based indicators, are engineered using NT or NM receptors and thus inherit their parental GPCRs' pharmacological properties. Therefore, GPCR-based indicators are incompatible with certain pharmacological manipulations. **b** | Imaging modalities and data interpretations. Fibre photometry recording is the method of choice for detecting GENI signals in the brain region of interest, in freely moving animals. When used with GENIs with fast kinetics, fibre photometry recording can report NT or NM dynamics during animal state changes (such as during sleep-wake transitions and learning). Fibre photometry measures bulk fluorescence emitted from a radius of several hundred microns and therefore has relatively poor spatial resolution. One advantage of GENIs is that they can be imaged at multiple spatial scales, ranging from the whole brain to subcellular levels, when combined with different imaging modalities.

pathways (such as G protein pathways,  $\beta$ -arrestin pathways) that might lead to disrupted cell function, presumably due to the steric hindrance imposed by the bulky cpFP moiety that replaces parts of the third intracellular loop, which is where G proteins and arrestin interact with GPCRs<sup>106,107</sup>. Importantly, GRAB sensor expression does not seem to perturb animal behaviours<sup>88</sup>.

Finally, although the GPCR-based indicators sensors are engineered NT or NM receptors, their expression pattern may not mimic that of endogenous receptors, and hence the signal reports NT or NM release but is not suited to infer the spatial organization of NT or NM sensing on target cells<sup>108</sup>. To more faithfully infer the spatial organization of NT or NM sensing on target cells, GENIs can be selectively expressed in targeted cells with endogenous receptor expression.

### **Applications for GENIs**

Because all GENI sensors convert a neurochemical signal to a change in fluorescence, any techniques that report a change in fluorescence intensity are suitable for measuring the signals generated by GENI sensors. Currently available methods for recording GENI signals include fibre photometry, wide-field epifluorescence imaging, lightsheet fluorescence imaging, multiphoton imaging and the recently developed super-resolution imaging (FIG. 3b). These imaging methods provide different levels of spatial and/or temporal resolution and require instruments that vary widely in both complexity and cost. It is therefore important to find the optimum set of tools to answer the specific research question at hand. Below, we discuss the various imaging methods available for detecting GENIs, and their recent applications.

Detecting GENI signals in freely moving animals. Fibre photometry has become the method of choice for detecting GENI fluorescent signals in freely moving animals - particularly rodents - owing to its compact size and the relatively simple instruments needed to detect the signal<sup>109</sup>. Fibre photometry measures bulk fluorescence emitted from a radius of several hundred microns and therefore has relatively poor spatial resolution. The sampling rate of fibre photometry ranges from tens to thousands of hertz and, therefore, is generally not a limiting factor for temporal resolution. However, the level of synchronization among the cells emitting the fluorescent signals does affect temporal resolution. If the changes in fluorescence within a region of interest are highly heterogeneous (for example, in the case of Ca<sup>2+</sup> transients of the neurons in the prefrontal cortex), the sum of the fluorescent signal will be difficult to interpret. By contrast, if the changes in fluorescence are relatively well synchronized within the region of interest across the recording area, the bulk change in fluorescence provides an excellent estimate of the underlying unitary responses. Because volume transmission is a major mode of action of many NMs, changes in the amount of NM in a small region are often highly correlated, thus providing a meaningful readout (FIG. 4). Nevertheless, finer details involving spatial and temporal heterogeneity at NM-releasing sites will be inevitably missed by this method<sup>108</sup>.

To date, fibre photometry has been used to detect the release of a wide range of NMs (including ACh, DA, NA, 5-HT, adenosine and eCB) under various conditions, including during the switch between sleep and wake states<sup>77,87,89,110</sup>, natural behaviours<sup>78,79,92,111-114</sup>, aversive and positive learning<sup>92,115-123</sup> and stress<sup>77,80,88</sup>. For example, although adenosine is believed to have a prominent role in sleep homeostasis, how neural activity underlying the sleep-wake cycle controls adenosine release in the brain remains unclear. To address this question, fibre photometry was combined with the GRAB<sub>Ado</sub> sensor in the mouse basal forebrain. This approach revealed that adenosine levels are relatively high during wakefulness and rapid eye movement (REM) sleep, but low during non-REM sleep<sup>89</sup> (FIG. 4b). To study the relationship between adenosine dynamics and neuronal activities, the authors performed simultaneous recordings of adenosine levels and Ca2+ signals of different BF neurons, and found that the activity of both cholinergic and glutamatergic neurons correlated highly with adenosine levels. Furthermore, activation of glutamatergic neurons induced an increase in extracellular adenosine, whereas selectively ablating BF glutamatergic neurons decreased extracellular adenosine levels and impaired sleep homeostasis<sup>89</sup>. More recently, another study used the GRAB<sub>5-HT</sub> sensor and found that 5-HT levels in the basal forebrain are also high during wakefulness and low during non-REM sleep. Interestingly, in contrast to the increased levels of adenosine during REM sleep<sup>89</sup>, this study found that 5-HT levels are actually reduced during REM sleep87. Using similar recording strategies, other groups found distinct sleep-wake state-dependent changes in both NA and ACh levels77,110, suggesting that many NMs probably work together to mediate the switch between sleep and wake states.

DA has been implicated in motivation and rewardrelated behaviours. Soon after the development of the genetically encoded DA sensors, several studies used fibre photometry to monitor fluorescent signals of DA sensors as a real-time readout of DA release under both physiological and pathological conditions. In particular, several studies focused on understanding the dynamics of dopaminergic activity in drug addiction, finding that the administration of morphine, heroin, cocaine, alcohol or nicotine to rodents increased DA levels in the nucleus accumbens<sup>124–127</sup>. In a separate study, DA release in the nucleus accumbens was found to be greater in mice fed a high-fat diet than in those fed a standard chow diet; moreover, following repeated exposure to the high-fat diet, DA release became diminished when fasted animals consumed the standard diet128. Thus, drugs of addiction and a high-fat diet seem to have similar effects on DA signalling, in that both overstimulate the dopaminergic system and lead to diminished DA responses to typical stimuli.

The increasing variety of GENIs for detecting neurochemicals should rapidly advance our understanding of the neural mechanisms that underlie various diseases, particularly mental illness. Indeed, nearly all drugs developed to treat psychiatric disorders target a neuromodulatory system<sup>129</sup>. In a recent study, hallucination-like perceptions in mice were assessed using a behavioural

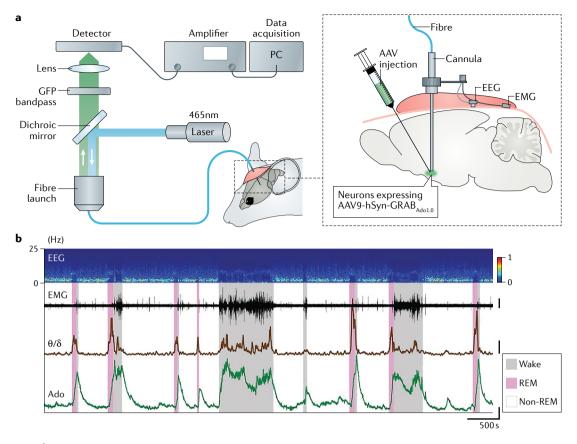


Fig. 4 | Fibre photometry recording of neurotransmitter or neuromodulator dynamics in freely moving mice. **a** | G protein-coupled receptor (GPCR) activation-based sensor for adenosine (GRAB<sub>Ado10</sub>) expressed in the basal forebrain (under control of the human synapsin (hSyn) promoter encoded by an adeno-associated virus (AAV)) of fibre-attached mice and used to monitor adenosine dynamics. **b** | Electroencephalogram (EEG), including ratio between EEG theta power ( $\theta$ ) and delta power ( $\delta$ ), and electromyogram (EMG) also recorded to identify specific brain states, namely wake, rapid eye movement (REM) sleep and non-REM sleep. GFP, green fluorescent protein; PC, personal computer. Panel **b** adapted with permission from REF.<sup>89</sup>.

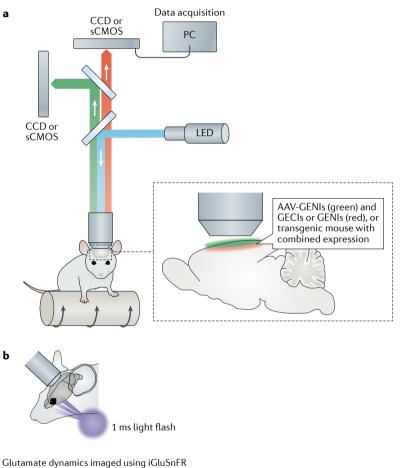
task, and a DA sensor revealed a correlation between excessive levels of DA in the tail of the striatum before the presentation of sensory cues and hallucination-like perception<sup>130</sup>. Moreover, this study suggests that excessive DA in the tail of the striatum encodes perceptual expectation, and its increase leads to 'overconfidence' of a false perception (that is, the hallucination-like percept)<sup>130</sup>.

Developments in fibre photometry, such as multifibre photometry with high-density arrays of optical fibres<sup>131</sup>, wireless fibre photometry<sup>132</sup> and depth-resolved fibre photometry with tapered optical fibres<sup>133</sup>, will provide further flexibility for experimental design and expand our understanding of how NTs or NMs contribute to different behavioural states or dysfunction in animal models, with high spatial selectivity.

Another popular imaging tool used in freely moving animals is the miniaturized epifluorescence microscope (miniscope)<sup>134</sup>, which can — at least in principle provide cellular resolution if the sensors are expressed primarily in the cell body. However, as GPCRs are expressed in the cell membrane, it is difficult to discern individual cells expressing current NM sensors owing to the high level of fluorescence signals from axons and dendrites. Nevertheless, inspired by the design of soma-targeted and axon-targeted Ca<sup>2+</sup> sensors<sup>135-137</sup>, as well as soma-targeted voltage sensors<sup>138-141</sup>, the future development of compartment-specific NM sensors may present opportunities for using miniscopes to monitor NM signals with subcellular resolution in freely moving animals. On the hardware side, miniaturized two-photon microscopes can provide high spatial resolution and reduce the out-of-plane background signal, and thus have the potential to discern GENI signals emitted from individual somas and processes in freely moving animals<sup>77,142,143</sup>.

Detecting GENI signals in head-fixed animals. More sophisticated microscopy tools and methods can be used when the imaged sample is stationary or fixed than when imaging in freely moving animals. Thus, current methods focus on either detecting GENIs over a large surface area or with high spatial resolution. For example, mesoscopic imaging (an imaging technique that provides details regarding biological systems in the context of an organ, body part or entire organism) collects the fluorescence signal from the brain surface via a microscope-coupled camera (FIG. 5a). Using this approach, a typical field of view can cover 100 mm<sup>2</sup> with about 512 × 512 pixels, yielding spatial resolution in the

order of a few tens of microns per pixel. Moreover, the images are acquired at 10–50 frames per second, which is sufficient for detecting changes in fluorescence based on the kinetics of most GENIs. Although this method cannot be used to resolve single-cell activity, it can be used to monitor activity across a large area, such as the entire dorsal surface of the cerebral cortex<sup>144</sup>. For example, intensity-based glutamate sensitive fluorescent reporter (iGluSnFR) has been used to produce low-resolution maps of extracellular glutamate concentration across the



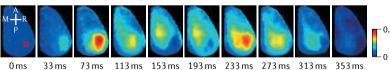


Fig. 5 | Wide-field mesoscopic imaging of neurotransmitter or neuromodulator dynamics across the neocortex in awake mice. a | Dual-wavelength, wide-field imaging set-up, with mouse on a moving platform. Genetically encoded neurotransmitter or neuromodulator (NT/NM) indicators (GENIs) and genetically encoded Ca<sup>2+</sup> indicators (GECIs) with separated spectra can be used to monitor NT or NM and Ca<sup>2+</sup> dynamics, respectively; GENIs with separated spectra could be used to monitor dynamics of different NTs or NMs simultaneously. **b** | Imaging glutamate dynamics with intensitybased glutamate sensitive fluorescent reporter (iGluSnFR) across cortical surface. Top: experimental set-up of visual stimulation in awake mouse. Bottom: representative montage of cortical iGluSnFR responses after visual stimulation with 1 ms flash of light; this induces an initial rapid response, followed by a clearly separated, delayed secondary response in awake mouse. Scale bar, 2 mm. Panel **b** adapted with permission from Xie et al.<sup>145</sup>. A, anterior; AAV, adeno-associated virus; CCD, charge-coupled device camera; sCMOS, scientific complementary metal–oxide–semiconductor camera; LED, light-emitting diode; M, medial; P, posterior; PC, personal computer; R, right. surface of the entire mouse cortex<sup>145</sup> (FIG. 5b). In another study, Ca<sup>2+</sup> signalling and ACh levels were measured across the dorsal surface of the cortex in mice expressing jRCaMP1b and GRAB<sub>ACh3,0</sub>, respectively. This approach revealed that both the ACh and Ca<sup>2+</sup> signals exhibit behavioural state-dependent and spatially heterogeneous fluctuations across the surface of the cortex<sup>146</sup>.

Multiphoton imaging — in this context, primarily two-photon imaging - excites the GENI using focused, high-intensity light at infrared wavelengths, resulting in the absorption of two or more photons and the emission of photons at a visible wavelength. Because this method requires point by point scanning, it has a relatively limited field of view (generally less than 1 mm<sup>2</sup>) and temporal resolution (with sampling typically in the range of 1-30 Hz); however, it provides excellent spatial resolution (under 1 µm). Thus, two-photon microscopy has been used to measure the spatial patterns of NM release in high detail68,77,78,147-152. For example, it was recently used to track the fluorescence of GRAB<sub>ACh30</sub> in direction-selective retinal ganglion cells, which receive input from cholinergic starburst cells<sup>147</sup>. Increases of extracellular ACh at ganglion cell dendrites were observed to be tuned to light direction at the local level (within about 1 µm) but heterogeneous across the dendritic tree, with no relationship to the ganglion cell's preferred direction (FIG. 6A), suggesting that cholinergic input has a minor role in determining the ganglion cell's direction selectivity147. As another example, extracellular glutamate and Ca2+ signals of mitral cells in the mouse main olfactory bulb were simultaneously recorded using iGluSnFR and GCaMP6f, respectively. This approach revealed that the temporal dynamics of extracellular glutamate in the olfactory bulb is highly diverse and can account — to a large extent — for the heterogeneity of mitral cell responses, suggesting a faithful and linear input-output transformation of mitral cell activity<sup>152</sup>.

Compared with classical water-soluble NTs and NMs, the understanding of signalling through neurolipids (such as eCBs) in vivo is limited by the inability to measure their changes at timescales commensurate with the high lability of lipid signals. A genetically encoded GRAB sensor was recently developed for directly detecting eCB dynamics. Researchers selectively expressed the GRAB<sub>eCB</sub> sensor in CB1R<sup>+</sup> neurons and observed eCB transients from single axonal boutons in acute brain slices, suggesting constrained and localized eCB signalling<sup>88</sup> (FIG. 6Ba). GRAB<sub>eCB</sub> could also resolve the molecular identity and spatiotemporal dynamics of hippocampal eCB signalling in living mice at the timescale of physiological and pathological neural activity<sup>153</sup> (FIG. 6Bb).

Although two-photon calcium imaging has become a standard tool for functional studying of neuronal populations in awake behaving animals, most two-photon imaging protocols measure calcium and NT or NM dynamics in single areas, limiting the ability to link the function of local circuits to global cortical dynamics. However, a relatively new method for performing both two-photon imaging and mesoscopic wide-field imaging simultaneously provides a powerful strategy for linking the function of a local circuit to the global cortical state, defined by the dynamics of various neurochemicals<sup>154</sup>.

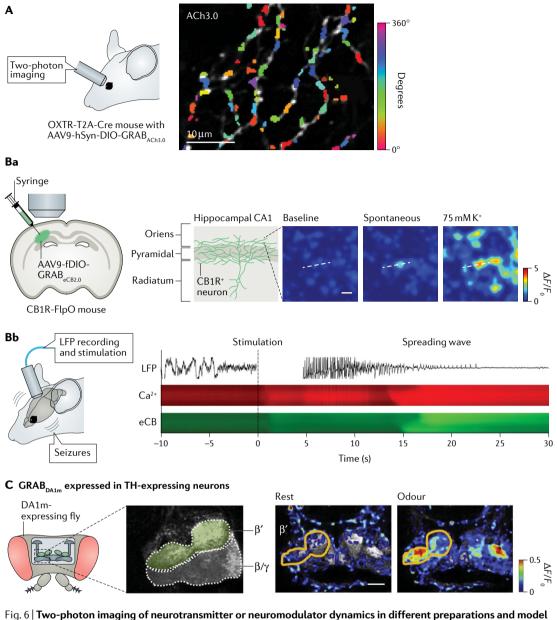


Fig. 6 | **Iwo-photon imaging of neurotransmitter or neuromodulator dynamics in different preparations and model organisms. A** | Two-photon imaging of acetylcholine (ACh) dynamics at subcellular level. Direction-selective ganglion cells of mouse retina were selectively labelled with G protein-coupled receptor (GPCR)-activation-based sensor for acetylcholine (GRAB<sub>ACh30</sub>; ACh3.0), using intravitreal injection of adeno-associated virus 9 (AAV9) expressing the sensor under control of the human synapsin promoter (hSyn) into Oxtr-T2A-Cre transgenic mice. Colours indicate preferred direction for each site on dendrites, quantified from responses to spots of light moving in eight directions. **B** | Imaging of endocannabinoid (eCB) dynamics with good spatiotemporal resolution. Fluorescence images of local eCB dynamics at single axonal boutons by expressing GRAB<sub>eCB20</sub> (eCB2.0) in cannabinoid receptor type 1-expressing (CB1R<sup>+</sup>) neurons in CA1 region of hippocampus. Scale bar, 5 µm (part **Ba**). Example local field potential (LFP) trace (top), Ca<sup>2+</sup> dynamics (assessed using genetically encoded calcium indicator jRGECO1a; middle) and eCB dynamics imaged using eCB2.0 (bottom) of imaged mediolateral projections during stimulus-induced non-convulsive seizures and subsequent spreading wave. Dashed vertical line at time 0 indicates stimulus onset (part **Bb**). **C** | Imaging of dorant-evoked dopamine (DA) release in olfactory mushroom body in a live fly measured using two-photon microscopy. To express GRAB<sub>DA1m</sub> (DA1m) in dopaminergic neurons, transgenic UAS-DA1m flies were crossed with tyrosine hydroxylase (TH)-GAL4 flies. The odorant elicited fluorescence increases prominently in the  $\beta'$  lobes, not the  $\beta/\gamma$  lobes. Scale bar, 20 µm. Panel **A** adapted with permission from REF.<sup>18</sup>.

Two-photon microscopy is also well suited for imaging animals with a relatively small brains, such as *Drosophila* and zebrafish. For example, transgenic flies expressing the DA sensor GRAB<sub>DAIm</sub> selectively in dopaminergic cells were used to record the odorant-evoked DA release in the olfactory mushroom body using two-photon imaging<sup>78</sup> (FIG. 6C). Further studies using this transgenic *Drosophila* line revealed that, on odorant-induced activation, dopaminergic cells suppress a pair of GABAergic cells that normally negatively

### Ring neurons

Named for their circumferential ring-like axonal arborization patterns that form several circular laminae in the anterior shell of the ellipsoid body in *Drosophila* brain. regulate aversive olfactory learning, thereby allowing efficient learning<sup>155</sup>. A separate study investigated the DA-mediated plasticity that underlies the temporal sensitivity of associative learning using a DA sensor<sup>151</sup>. Together, these studies provide mechanistic and circuit insights through the use of GENI sensors.

Light-sheet fluorescence microscopy (LSFM) illuminates the plane of interest with a thin sheet of light while the camera is focused onto the plane<sup>156</sup>. A 3D volumetric image can be formed by moving the co-aligned excitation and detection planes. This approach allows researchers to rapidly image a large volume at cellular resolution. Furthermore, owing to the focused illumination at the plane of interest, LSFM causes minimal light-induced toxicity and makes it possible to measure fluorescence for long periods of time. Recently, Liang et al. measured DA signalling in ring neurons in the Drosophila ellipsoid body over 24 h using LSFM and the  $\text{GRAB}_{\text{DA2m}}$ sensor; they observed a daily oscillation in the DA signal and found that the peak in dopaminergic activity coincided with the daily increase in locomotor activity, suggesting that dopaminergic neurons have a role in controlling daily rhythmic activity<sup>157</sup>.

Because LSFM uses single-photon illumination, the light does not penetrate far into non-transparent tissue (but see two-photon LSFM<sup>158,159</sup>). Thus, LSFM has been used primarily to record GENIs in relatively transparent organisms such as Drosophila larvae, zebrafish larvae and C. elegans<sup>160</sup>. Several groups have used 'closed-loop' behavioural paradigms in which behavioural responses such as tail movement are used to update sensory inputs, thus providing a realistic experience in head-fixed animals<sup>161,162</sup>. These innovative behavioural paradigms have enabled researchers to monitor whole-brain neural responses in head-fixed zebrafish larvae during 'naturalistic' behaviours. Additionally, two groups developed LSFM methods to image freely swimming zebrafish larvae while performing volumetric imaging at near-cellular resolution<sup>163,164</sup>. To date, whole-brain LSFM has been used primarily to measure Ca<sup>2+</sup> signals; however, the generation of transgenic zebrafish lines that express various GENIs has opened the door to examining the dynamics of various neurochemicals<sup>65,78,80</sup>.

Additional applications for GENIs. GENIs have also been used to address fundamental questions regarding NM release. For example, two studies used high-resolution imaging to measure the release and diffusion of ACh and monoamines in mouse brain slices. High-resolution imaging achieves sub-diffraction-limit resolution (below 200 nm) on the basis of cooperative capture of many photons<sup>165</sup>. By combining such imaging with ACh, NA, 5-HT and DA sensors, ACh and monoamines were found to diffuse from their respective releasing sites over a distance of approximately 0.75 µm; however, when release sites are packed closely and activate simultaneously, the NMs can diffuse over a larger space, giving rise to volume transmission, suggesting that non-volume transmission may be an important mode of action for NMs166. Similar results were reported by a separate group<sup>70</sup>.

Besides understanding physiological roles of NTs and NMs, GENIs also present potential for facilitating drug

discovery. For example, one group developed iNicSnFRs, a series of genetically encoded fluorescent sensors for detecting nicotine, and used these sensors to examine the pharmacokinetics of nicotinic drugs in the endoplasmic reticulum of multiple mammalian cell lines derived from human or mouse<sup>167</sup>. Combined with pharmacokinetic and pharmacodynamic simulations of human smoking, these experiments suggest that, in typical smokers, nicotinic ACh receptors in the endoplasmic reticulum are probably continuously activated at a level of more than 75%, leading to an upregulation of these receptors in the plasma membrane<sup>167</sup>. Another example is PsychLight, a recently developed fluorescent sensor based on the serotonin 2A receptor, a major target for classic hallucinogens, atypical antipsychotics and psychoplastogens (a relatively new class of compounds that rapidly promote structural and functional neural plasticity)<sup>168</sup>. The researchers predicted the hallucinogenic effects of different compounds, on the basis of their activation of PsychLight, and identified a non-hallucinogenic psychedelic analogue with both short-term and long-term antidepressant effects<sup>168</sup>. These examples illustrate the promise of GENI application in advancing our understanding of drug actions at the subcellular level, thereby facilitating drug discovery.

Lastly, it is worth noting that GENIs can also be used to study neuromodulation in non-traditional model organisms or non-human primates, as they can be delivered into the brain of virtually any species using viral infection. Indeed, GENIs have been used to study DA release in the high vocal centre (the song generation centre) of zebra finches during song learning<sup>148</sup>. Also, the GRAB<sub>DA</sub> sensor was used to examine dopaminergic activity in the nucleus accumbens during motivated behaviours in monogamous prairie voles<sup>169</sup>. In addition, glutamate sensors have been used in macaque monkeys to examine the organization of the excitatory synaptic inputs that project different visual features onto the dendrites of neurons in the primary visual cortex<sup>170</sup>. Given their wide range of applications, GENIs provide a highly versatile toolkit that can be used to study both microscopic and macroscopic neuromodulation during various behaviours under physiological and pathological conditions, in various species.

### **Finishing remarks**

Although the field of biosensors for measuring NTs and NMs is rapidly developing, there is still room to improve sensors' sensitivities, selectivities, kinetics and pharmacological properties, as well as the techniques used to image the sensors and process the resulting data. To reach these goals, further efforts are needed from tool developers and end users.

### Limitations and further improvement of GENIs

Further innovations by tool developers are needed to improve current methods for measuring NTs and NMs. First, although current GENIs provide high spatiotemporal resolution, overexpression of GENIs may cause buffering effects and interfere with endogenous signals. To minimize this effect, the expression level of GENIs should be controlled, although not so much that the SNR falls to suboptimal levels. Existing methods must be optimized to achieve even higher sensitivity. Second, relative to the vast number of extracellular signalling molecules identified to date (for example, the mammalian brain expresses hundreds of different neuropeptides), the number of existing biosensors is not nearly sufficient. Therefore, the repertoire of biosensors for measuring various chemicals (including neurolipids and neuropeptides) or other neuronal signals (such as mechanical tension) must be expanded.

Third, although microdialysis-based methods and electrochemical methods can measure small changes in NT or NM concentrations — even under basal conditions — most imaging probes rely on intensity and can therefore only qualitatively monitor relative changes in NT or NM levels. Therefore, a new class of sensors (such as ratiometric sensors) are needed to quantitatively measure NTs and NMs. Fourth, similar to most non-genetically encoded methods, GENIs only measure the presence of the NTs or NMs in the extracellular space, but not their downstream effects. Therefore, GENIs could be combined with electrophysiological recordings or Ca<sup>2+</sup> imaging to study NT or NM release as well as their downstream signals.

Fifth, simultaneous measurements of multiple NTs and/or NMs will provide comprehensive information regarding communication in the brain. Indeed, NMs and NTs probably form parallel communication channels, and their temporal relationships could carry important information and only be revealed with simultaneous recordings; as such, sensors with high molecular specificity and non-overlapping spectra could be combined for use under the same conditions. Currently, the only red-shifted GENIs that have been developed for potential combination with green GENIs for dual-colour imaging are for glutamate<sup>67</sup> and DA<sup>79,91</sup>. We anticipate that the colour spectrum of GENIs can be expanded even further, particularly into the near-infrared region<sup>171-173</sup>, for measuring multiple NTs and NMs simultaneously. Finally, given the nearly unlimited potential for sensor

development, structure-guided high-throughput screening will probably increase the success rate. For example, obtaining an atomic-resolution structure of GENIs particularly GPCR-based sensors — will help accelerate sensor development.

### Future directions using GENIs

Having these new GENIs in hand will allow researchers to study the dynamic properties of NTs and NMs in unprecedented detail in cultured cells, tissues and living organisms. These experiments will provide important new insights, including different spatial and temporal information regarding NTs and NMs in health and disease; the mechanisms that underlie the release and modulation of non-classical NTs and NMs such as lipids, nucleotides and neuropeptides; and the communication between neurons, as well as communication between neurons and non-neuronal cell types such as glial cells, immune cells, endothelial cells and muscle cells. Furthermore, given that GPCRs are the most extensively studied family of drug targets, GRAB sensors may provide tools for screening drugs and for providing in vivo validation.

Building on the highly fruitful collaborations between sensor developers and end users will be essential for driving the development and optimization of new sensors. Nevertheless, it is also important to note that GENIs are just one of many groundbreaking tools and techniques developed in recent years. Other notable techniques, reviewed recently elsewhere<sup>174</sup>, include other optical sensors (such as voltage sensors, pH sensors, Ca<sup>2+</sup> sensors, cAMP sensors and protein kinase A activation sensors), imaging set-ups, optogenetic and chemogenetic tools, CRISPR–Cas9-mediated gene editing, genetic models and pharmacological methods. These robust tools can be combined to interpret the data obtained using GENIs and to dissect chemical signalling in complex systems in health and disease.

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#### Author contributions

All authors contributed equally to all aspects of the manuscript.

#### Competing interests

Y.L. is listed as an inventor on a pending patent application filed by Peking University (international patent no. PCT/ CN2018/107533), the value of which might be affected by this publication. The remaining authors declare no competing interests.

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