1	Thal	amus drives two complementary input strata of the neocortex in parallel			
2					
3	R. Egger ¹ †‡, R.T. Narayanan ¹ †, D. Udvary ¹ , A. Bast ¹ , J.M. Guest ¹ , S. Das ² , C.P.J. de Kock ² , M.				
4	Oberl	aender ¹ *			
5					
6	¹ Max	Planck Group: In Silico Brain Sciences, Center of Advanced European Studies and Research,			
7	Bonn,	Germany; ² Department of Integrative Neurophysiology, Center for Neurogenomics and Cognitive			
8	Resea	arch, VU Amsterdam, The Netherlands.			
9					
10	Short	title: The deep input stratum of the neocortex			
11	Key v	vords: barrel cortex, pyramidal tract neurons, corticocortical neurons, whisker touch, in silico			
12					
13	†	these authors contributed equally (in alphabetical order)			
14	‡	current address: Neuroscience Institute, NYU School of Medicine, New York, USA.			
15					
16	*	Editorial correspondence:			
17		Max Planck Group: In Silico Brain Sciences			
18		Center of Advanced European Studies and Research (caesar)			
19		Ludwig-Erhard-Allee 2, Bonn, 53175 Germany			
20		marcel.oberlaender@caesar.de			
21					
22	Sens	ory information enters the neocortex via thalamocortical axons that define the major 'input'			
23	layer	4. The same thalamocortical axons, however, additionally innervate the deep 'output' layers			
24	5/6. How such bistratification impacts cortical processing remains unknown. Here, we find a class				
25	of neurons that cluster specifically around thalamocortical axons at the layer 5/6 border. We show				
26	that these border stratum cells are characterized by extensive horizontal axons, that they receive				
27	strong convergent input from the thalamus, and that this input is sufficient to drive reliable				
28	sensory-evoked responses, which precede those in layer 4. These cells are hence strategically				
29	placed to amplify and relay thalamocortical inputs across the cortical area, for example to drive				
30	the fa	ast onsets of cortical output patterns. Layer 4 is therefore not the sole starting point of			
31	cortic	al processing. Instead, parallel activation of layer 4 and the border stratum is necessary to			
32	broad	lcast information out of the neocortex.			

33 Introduction

The mammalian neocortex is required for higher-order brain functions, such as sensory perception and 34 cognition, and hence for the transformation of information from the environment into behavior. Such 35 information, for example as evoked by photo- or mechanoreceptor cells at the periphery of the visual or 36 somatosensory system, enters the neocortex in form of a synchronous volley of excitation, which is 37 provided by relay cells that are located in sensory system-specific primary nuclei of the thalamus ¹. 38 Despite several species- and sensory system-specific differences, thalamocortical axons of relay cells 39 terminate in general most densely in layer 4 of the respective primary sensory areas of the neocortex². 40 41 For decades, concepts about the neocortex thus focused on layer 4 as its main input site, and starting point of sensory information processing ³. However, anatomical studies in macagues ⁴, cats ⁵, and rodents 42 43 ⁶ indicate that the very same thalamocortical axons give rise to a second innervation peak at specific depth locations in the deeper layers 5 and/or 6. These layers represent the main output site of the 44 neocortex, as they comprise long-range projection neurons that innervate subcortical brain structures ². 45 46

47 The relevance of bistratified thalamocortical input for cortical information processing – and in particular of the deep input stratum within the output layers – remains poorly understood ⁷. However, this knowledge 48 is fundamental for deducing the logic of intracortical signal flow, for revealing the origin of cell type- and 49 50 layer-specific neuronal activity patterns, and for constraining hypotheses of cortical circuit organization. 51 So far, to our knowledge, no study has yet systematically investigated the principles by which a deep 52 thalamocortical input stratum contributes to the overall sensory-evoked cortical excitation. It remains 53 therefore unknown whether and how different types of neurons in the output layers can be driven directly by thalamocortical input, and if that would be the case, how responses in the deep input stratum affect 54 those in the upper layers and vice versa. 55

56

Here, we address these questions in the whisker somatosensory system of the rat⁸. Tactile information 57 from whisker touch enters the neocortex via relay cells from the ventral posterior medial nucleus (VPM) 58 of the thalamus². Axons from these relay cells delineate layer 4 of the whisker-related part of the primary 59 60 somatosensory cortex (wS1). Within layer 4, excitatory spiny neurons cluster around the dense terminal 61 fields of the VPM axons. Upon sensory stimulation, this major thalamorecipient population gives rise to 62 recurrent excitation within layer 4 and feed-forward excitation to the superficial layers 2/3 – a canonical organizational principle of all sensory cortices ³. VPM axons show a second, less dense innervation peak 63 in the deeper layers ⁶. The VPM-to-wS1 pathway in rodents hence represents an ideal model system to 64 elucidate the relevance of bistratified thalamocortical input for cortical sensory information processing. 65

67 Combining in vivo recordings with morphological reconstructions, optogenetic input mappings, 68 pharmacological manipulations, and simulations of cortical signal flow, we reveal that – similar to the 69 organization of layer 4 – thalamocortical inputs converge strongly onto a population of corticocortical cells that is strategically placed around the terminal fields of VPM axons at the layer 5/6 border. Upon sensory 70 71 stimulation, this deep thalamorecipient pathway is activated first, evoking a stream of excitation that spreads horizontally across the deep layers, and which thereby precedes the vertical stream of signal 72 73 flow through the canonical layer 4 to layers 2/3 pathway. Neuronal responses in primary sensory cortices 74 may thus be regarded as a superposition of inputs from two simultaneously active primary thalamocortical pathways, which likely complement each other to ensure that intracortical computations are reliably 75 transformed into cortical output patterns. 76

77

78 **Results**

79 Corticocortical cells cluster around deep layer thalamocortical axons

80 We compared the soma, dendrite, and axon distributions of all major excitatory cortical cell types ² with the distributions of thalamocortical axons, and precise measurements of the cytoarchitectonic layer 81 82 borders (Fig. S1) - anatomical data that we had systematically collected for one set of experimental conditions over the past decade in rat VPM and wS1^{6,9,10,11,12,13,14}. The comparison revealed that the 83 peak density of VPM axons in the deep layers coincides with the cytoarchitectonic border between layers 84 5 and 6 (Fig. 1A). Moreover, the soma depth distribution of layer 6 corticocortical (i.e., intratelencephalic) 85 86 neurons matches the vertical extent of the deep layer VPM axon density peak (Fig. 1B). Neurons of this class are hence not restricted to layer 6, but equally abundant in lower layer 5 and upper layer 6. 87

88

These layer 5/6 corticocortical neurons can be easily distinguished from the subcortically projecting 89 cortical output neurons that are found at the same depth: layer 5 pyramidal tract and layer 6 90 91 corticothalamic neurons. First, by the characteristic morphology of their apical dendrites (Fig. 1C), which terminate in layer 4 without forming a tuft. This property also distinguishes them from polymorphic 92 93 corticocortical neurons in deeper regions of layer 6¹². Second, by their extensive horizontally projecting 94 axons (Fig. 1D), which can span across the deep layers of the entire cortical area (Fig. 1E). Our data 95 reveal that analogously to the organization of excitatory populations in the major thalamorecipient layer, 96 neurons with dendrite morphologies similar to those in layer 4, but with complementary intracortical axon projection patterns, cluster around thalamocortical axons in the deep layers. Together, VPM axons and 97 layer 5/6 corticocortical neurons thus provide the structural basis of a deep thalamorecipient pathway for 98 sensory-evoked signal flow, which we subsequently refer to as the 'layer 5/6 border stratum' ⁴. 99

101 Thalamocortical inputs converge strongly onto border stratum cells

Functional and anatomical studies in the rodent somatosensory ^{7, 15} and visual systems ¹⁶ suggest that 102 103 neurons of all excitatory cell types that are located at the depth of the border stratum can receive direct 104 input from the respective primary thalamic nuclei. We therefore quantified the degree to which border 105 stratum cells (i.e., layer 5/6 corticocortical) in rat wS1 form monosynaptic connections with VPM axons, and investigated whether these synapses are functional under in vivo conditions. We expressed light-106 107 gated ion channels and a fluorescent marker within the thalamocortical synapses by injecting an adeno-108 associated virus into the VPM (Fig. 2A). Light-evoked and sensory-evoked action potential (AP) 109 responses of individual wS1 neurons were obtained via cell-attached recordings in anesthetized rats (Fig. **2B).** Following the recordings, neurons were filled *in vivo* with biocytin, which allowed for post-hoc 110 reconstruction and classification of the neurons' morphology (Fig. 2C), and detection of the putative 111 112 thalamocortical synapses along the dendrites of the recorded neurons (Fig. 2D).

113

114 The experiments revealed that 7±2% of the spines along the dendrites of a border stratum cell receive 115 input from the VPM (Fig. 2E). Similar fractions (10±4%) and dendritic distributions of VPM synapses have been reported previously for spiny neurons in layer 4 of rat wS1¹⁷. Thus, the excitatory populations that 116 117 define the respective postsynaptic parts of the two thalamocortical input strata – layer 4 spiny neurons 118 and layer 5/6 border stratum cells - receive similar relative amounts of VPM input. Supporting these 119 anatomical observations, light stimulation of VPM synapses elicited APs in the morphologically identified 120 border stratum cells. The responses were equally reliable and as fast as those in layer 4 spiny neurons 121 (Fig. 2F). The same border stratum cells also responded to sensory stimuli, as evoked by a low pressure 122 airpuff that deflects all whiskers caudally. Under these conditions, sensory responses in border stratum 123 cells were more reliable compared to those of spiny neurons in layer 4, and even rivaled the reliability of relay cells in the VPM (Fig. 2G). Our data reveal that analogously to layer 4 (Fig. S2), the strategic 124 125 location of border stratum cells results in strong convergent input from primary thalamocortical axons, which provides the synaptic basis of a deep thalamorecipient pathway for sensory-evoked signal flow. 126

127

128 Border stratum cells respond first to sensory stimuli

Whole-cell recordings in rodent wS1 ¹⁸ and V1 ¹⁶ indicate that deep layer corticocortical neurons have intrinsic physiological properties that render them as highly excitable when compared to corticothalamic neurons that are found at the same depth. Together with our observation of strong convergence of thalamocortical axons, this suggests that synaptic input from these fibers may be sufficient to drive reliable sensory-evoked responses in border stratum cells (e.g. those shown in **Fig. 2G**). This hypothesis is supported by several studies which showed that response onsets (i.e., latency to first AP) of deep layer

neurons can rival, and even precede those in layer 4 ^{7, 10, 19}. To quantitatively test this hypothesis, we
 measured the additional path length between the border stratum and layer 4 that APs need to travel along
 VPM axons. Combined with conduction velocity measurements ²⁰, the analysis predicted that sensory evoked excitation reaches the border stratum 2 to 5 ms (3.0±1.7 ms) earlier than layer 4 (Fig. 3A).

139

140 To test the prediction, we recorded and labeled excitatory neurons across all layers of wS1 in 141 anesthetized rats. These experiments allowed to precisely control the stimulus onset by deflecting individual whiskers with a piezoelectric bimorph ¹⁰, and to recover the morphological cell type of the 142 143 recorded neurons (Fig. 3B). We found that responses in the deep layers to deflections of the whisker that was somatotopically aligned with the recording site – the principal whisker – were largely restricted 144 to the populations of border stratum and pyramidal tract neurons (Fig. S3). Similar to the multi-whisker 145 stimulations by airpuff, single whisker deflections evoked AP responses that were more reliable in border 146 147 stratum cells when compared to layer 4 neurons (Fig. 3C). Response onsets of border stratum cells (median/25th/75th percentile: 11.2/10.3/12.4 ms) preceded those in all other excitatory cell types -148 including layer 4 – matching the path length-based delay predictions (14.3/13.3/18.4 ms; two-sided Mann-149 Whitney U-test: difference: -3.3, 95% CI [-4.0, -2.6], U = 1096, p < 10⁻¹⁰). 150

151

152 We further tested the delay predictions by simultaneously recording AP responses in layer 4 and upper 153 layer 6 of head-fixed, behaving rats. We implanted linear silicon probes with equally-spaced electrodes 154 that spanned across the depth of wS1. This allowed to record the AP activity of several single units during 155 awake conditions, and to determine the units' respective depth locations with ±50 µm precision. When 156 animals explored their environment by rhythmically moving the principal whisker – all other whiskers were 157 trimmed – sensory input was provided by whisker contact with a pole that was placed within range. AP responses in upper layer 6 preceded those in layer 4 of the same animal (Fig. 3D). Across animals, the 158 159 average AP onset in layer 4 was hence significantly delayed compared to layer 6 (Kolmogorov-Smirnov two-sample test: $D_{60,40} = 0.425$, p < 0.01), on average by 4 ms (Fig. 3E). Our data reveal that inputs from 160 primary thalamic axons can reliably drive fast APs in border stratum cells, providing the functional basis 161 162 of a deep thalamorecipient pathway for sensory-evoked signal flow.

163

164 Manipulating border stratum cells affects broad tuning of cortical output

For the present conditions of single whisker deflections in anesthetized rats, AP responses of pyramidal tract neurons occurred near simultaneous with those in layer 4, and hence consistently later than in border stratum cells – approximately 3-4 ms (14.3/13.6/16.2 ms). One of the functions of the border stratum pathway could thus be that it is involved in driving cortical output patterns, whose onsets thereby

169 rival those in layer 4. In further supported of this hypothesis is the characteristic property of pyramidal 170 tract neurons to respond to a broader range of stimuli compared to their thalamocortical input neurons ²¹. 171 In case of wS1, pyramidal tract neurons can respond similarly fast to stimulations of several whiskers ²², 172 even if their dendrites are located hundreds of micrometers away from the terminal fields of those VPM 173 axons that provide the respective thalamocortical input ²³. The extensive horizontally projecting axons in the deep layers, in combination with the earliest and reliable AP responses, hence render border stratum 174 175 cells as ideal candidates that could contribute to the fast onsets and broadly tuned characteristics of 176 cortical output patterns.

177

To test this hypothesis, we combined pharmacological injections of the $GABA_A$ agonist muscimol with 178 179 cell-attached recordings in anesthetized rats (Fig. 4A). Injection pipettes were positioned at the layer 5/6 180 border of wS1 by quantifying local field potentials (LFPs) at different cortical depths (Fig. S4). The LFP 181 recordings allowed mapping of the principal whisker that corresponded to the location of the injection site ²⁴ – here referred to as the 'manipulated whisker'. Cell-attached recordings were performed in layer 5, 182 approximately 1 millimeter away from the injection site. This distance assured that axons from border 183 184 stratum cells, but not from other cell types that are affected by the pharmacology, overlap with the recording site (Fig. 4B). Pyramidal tract neurons were identified as those that responded to deflections 185 of several individual whiskers ²² – including the manipulated whisker (Fig. 4C). After muscimol injections, 186 187 fast responses evoked by the manipulated whisker were abolished in any of the recorded neurons (Fig. 188 **4D**). In contrast, whiskers that were not somatotopically aligned with the injection site (e.g. the principal 189 whisker at the recording site) maintained their ability to evoke reliable and fast AP responses (Fig. 4E).

190

191 Border stratum cells provide an on-switch for cortical output

The pharmacological manipulations suggest that border stratum cells are necessary to drive the fast 192 193 component of broadly tuned responses in pyramidal tract neurons. However, the high degree of recurrence in cortical networks, as well as non-linear mechanisms of synaptic and/or dendritic integration, 194 195 pose a general challenge to infer causality between manipulations and the resultant alterations of 196 neuronal AP responses. To address these issues, we developed a model that allows performing 197 simulations that mimic the specific conditions of our *in vivo* pharmacology experiments at synaptic, cellular, and network levels, in the following referred to as in silico experiments. A link to download the 198 199 model and simulation routines, and a detailed description and validation of all parameters, is provided in 200 the SI. In brief, we embedded the morphology of an *in vivo* labeled pyramidal tract neuron into a previously reported anatomically realistic network model of rat wS1²⁵. The embedding provided structural 201 202 constraints about which neurons, depending on their respective cell type and location within VPM and

wS1 (i.e., neurons represent in vivo labeled morphologies), can in principle form synaptic connections 203 204 with the pyramidal tract neuron (Fig. 5A), and where along its dendrites (Fig. 5B). Combining the network 205 model with cell type-specific AP measurements – acquired during conditions that were consistent with those of our pharmacology experiments ^{10, 23, 26} – provided functional constraints about which of the 206 207 structurally possible connections can in principle provide input to the pyramidal tract neuron, depending 208 on the identity of the stimulated whisker. We generated 1,800 of such structurally and functionally 209 plausible synaptic input patterns for each of the 24 major facial whiskers, including those that correspond 210 to the manipulated and principal whisker of our *in vivo* experiments (Fig. 5C). Finally, we converted the pyramidal tract neuron into a multi-compartmental model (Fig. S5), equipped with biophysical properties 211 212 at the soma, dendrites, axon initial segment, and synapses that capture the characteristic intrinsic physiology of this cell type ²⁷. 213

214

215 This multi-scale model allowed simulating how the dendrites of pyramidal tract neurons integrate and 216 transform whisker-specific synaptic input patterns into AP output at the soma (Movie S1). The simulations predicted responses that were indistinguishable from those recorded in pyramidal tract neurons in vivo 217 218 (Fig. 5D). In particular, AP probabilities and onsets in response to both, the principal and manipulated 219 whisker, were in line with the respective *in vivo* data (Fig. 5E). We hence performed pharmacology 220 experiments in silico, at a level of spatial and cell type specificity that cannot be achieved in vivo. 221 Deactivating only the border stratum cells within a volume that corresponds approximately to the spread 222 of muscimol⁷ abolished *in silico* responses to the manipulated whisker, but not to any other whisker (Fig. 223 **5F)**. Deactivating all neurons that may be affected by the muscimol, except for the border stratum cells. 224 had in contrast no impact on the fast component of the simulated activity patterns. Deactivating all border stratum cells throughout wS1 predicted that pyramidal tract neurons lose their broadly tuned onset 225 226 responses. However, the remaining direct input from the VPM is predicted to be still sufficient to evoke 227 principal whisker responses, but with substantially reduced AP probabilities and later onsets. Our in vivo and in silico manipulations reveal that border stratum cells amplify the direct thalamocortical input of 228 229 pyramidal tract neurons (Fig. 5G), and relay sensory-evoked excitation from the local thalamorecipient 230 volume to neurons across wS1, thereby driving the fast onsets of broadly tuned cortical output patterns.

231

We investigated which of the synaptic input parameters, or parameter combinations, of the multi-scale model could in general account for the fast onsets of sensory-evoked AP responses in pyramidal tract neurons. For each simulation trial we quantified the number of synapses that were active during the 25 ms following the stimulus onset, their respective path length distances to the soma, and times of activation at 1 ms resolution. A principal component analysis of these synaptic input statistics revealed that

237 simulation trials with and without fast AP responses formed systematically different distributions with 238 respect to PC_1 (Fig. 6A). 92% of the separation along the dimension of PC_1 could be attributed to a single quantity (Fig. 6B), in the following referred to as synchronous proximal drive (SPD). SPD represents two 239 240 effective parameters: the number and synchrony of active excitatory synapses that impinge onto the 241 proximal dendrites (i.e., path length distance to the soma $< 500 \,\mu$ m). SPD was an almost perfect predictor (Fig. 6C) for AP responses (i.e., area under the receiver operating curve (AUROC) equals 1) during 242 243 simulations of passive whisker deflections (AUROC = 0.83 ± 0.03). Simulations in which we systematically varied these two parameters hence provided general relationships between the number of proximal 244 245 inputs that are active within a certain time window and the resultant probability of AP responses in pyramidal tract neurons (Fig. 6D). Supporting the manipulation results, these simulations predicted that 246 - for the present experimental conditions - only combined input from the VPM and border stratum cells 247 would be sufficiently numerous and synchronous to drive the fast APs at response probabilities which 248 249 match with those observed for PW, SW and MW deflections in vivo.

250

251 **Discussion**

252 We provide several lines of structural, functional, and computational evidence, which reveal the logic of 253 bistratified thalamocortical input to rat wS1: preceding the vertical stream of sensory-evoked signal flow 254 from layer 4 to layers 2/3, the strategically placed border stratum cells give rise to a second stream of 255 excitation that spreads horizontally across layers 5/6. Parallel activation of layer 4 and a deep input 256 stratum is likely to generalize to other sensory systems and species. For example in macaque V1, 257 neurons – sometimes referred to as Meynert cells – have been described whose features are reminiscent 258 of those that characterize the border stratum cells: they cluster around the layer 5/6 border and have 259 extensive horizontal axons that span across the deep layers ⁴. The function of Meynert cells remains 260 unknown²⁸. However, because of strong similarities in receptive field shapes between neurons in layers 261 4 and 6, it was suggested that these cells might be strategically placed to receive thalamocortical input from the deep layer terminal fields of lateral geniculate nucleus (LGN) axons ⁴. It was even speculated 262 263 that strong thalamocortical input to horizontally projecting neurons in the deep layers represents an 264 organizational principle that is unique to primates, and which may underlie their superior cognitive 265 capabilities²⁸. However, bistratified LGN axons, as well as horizontally projecting thalamorecipient 266 corticocortical neurons in the deep layers were also reported for V1 in cats ^{5, 29} and rodents ¹⁶.

267

We showed that the horizontal stream of excitation is necessary – and can even be sufficient – to drive fast sensory-evoked APs in pyramidal tract neurons. Bypassing the intracortical circuitry of the upper layers, the deep input stratum hence allows pyramidal tract neurons to integrate and transform sensory

271 inputs from differently tuned thalamocortical populations into cortical output, which can thereby contain 272 the entire stimulus information that was simultaneously provided by the thalamus (e.g. multi-whisker ³⁰ or 273 binocular ³¹ stimuli in wS1 or V1). In addition to providing subcortical circuits with such an integrated 274 efference copy of the sensory input ³², the fast activation of pyramidal tract neurons will also be critical 275 for intracortical computations. Somatic APs back-propagate into the apical dendrites, triggering the activation of calcium channels ³³ that widen the pyramidal tract neurons' time window for synaptic 276 integration ³⁴. The fast back-propagating APs that are driven by the border stratum cells will therefore 277 278 switch the dendrites of pyramidal tract neurons into an active state, which occurs near simultaneous with 279 responses in layer 4 that are driven directly by the thalamus. The two input strata could hence complement each other, ensuring that pyramidal tract neurons are able to reliably transform inputs from 280 recurrent intracortical circuits – e.g. those from layers 2/3 that are driven by layer 4 – into cortical output 281 282 ³⁵. This theory is not only in line with the recent observation that sensory-evoked calcium transients in 283 apical dendrites of pyramidal tract neurons correlate with perceptual thresholds during whisker-based behaviors ³⁶. It further provides a potential explanation for the origin of sustained AP responses in 284 pyramidal tract neurons ¹⁴ that persist for the duration of the stimulus (Fig. S6). 285

286

287 The deep input stratum will be involved in other functions, beyond regulating cortical output patterns. 288 Axons of border stratum cells innervate all layers of wS1, but in particular layer 4. The fast and reliable 289 activation of these neurons may therefore contribute to the substantial intracortical component of sensory-290 evoked post-synaptic potentials in the major thalamorecipient layer ³⁷. Moreover, at least a subset of the 291 border stratum cells display long-range intrinsic axons that innervate higher-order cortices ³⁸, a property 292 that they share also with the Meynert cells ³⁹. Revealing how activity patterns can be coordinated across 293 intracortical and subcortical circuits, the parallel strata principle provides insight that will be essential for understanding how the neocortex orchestrates sensory-guided behaviors. 294

295

296 Acknowledgements

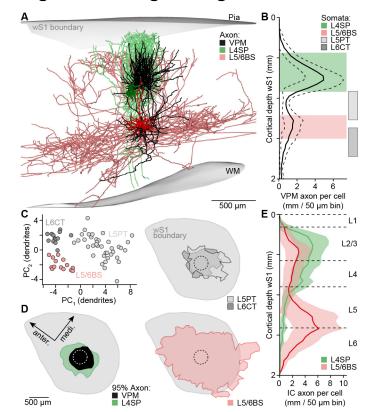
We thank Bert Sakmann for discussions; Etay Hay and Idan Segev for providing biophysical models and optimization routines; Martin Schwarz for providing the AAV; Idan Segev, David Fitzpatrick and Kevan Martin for comments on the manuscript. Funding was provided by the European Research Council under the European Union's Horizon 2020 research and innovation program (No 633428), and in part by the German Federal Ministry of Education and Research Grants BMBF/FKZ 01GQ1002 and 01IS18052, and the Deutsche Forschungsgemeinschaft (SFB 1089). We declare that we have no conflicting interests.

304 Author contributions

M.O. conceived and designed the study. R.E. developed the model and performed simulations. R.N. performed cell-attached recordings, pharmacology experiments, and morphological reconstructions. D.U. developed analysis and data acquisition routines. A.B. performed simulations. J.G. performed virus injections and cell-attached recordings. S.D. performed extracellular recordings. C.K. performed cellattached and extracellular recordings. All authors analyzed data. M.O. wrote the paper.

310

312

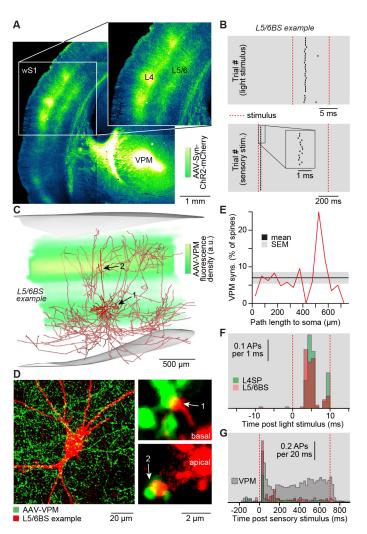


311 Figures and Figure Legends

313 Figure 1: Structural basis of two thalamocortical input strata. A) Examples of *in vivo* labeled neurons 314 in the whisker-related part of rat primary somatosensory cortex (wS1): layer 4 spiny neuron (L4SP). corticocortical neuron at the L5/6 border stratum (L5/6BS), and the intracortical (IC) part of the axon from 315 a relay cell in the ventral posterior medial nucleus of the thalamus (VPM). B) Soma, dendrite and axon 316 distributions of induvial neurons (n=191) were compared with 50 µm precision ⁹. Somata of L4SP (n=37) 317 and L5/6BS cells (n=14) cluster around the two innervation peaks of VPM axons (n=14, mean ± STD). 318 Somata of L5/6BS cells intermingle with those of the subcortically projecting pyramidal tract (L5PT, n=38) 319 320 and corticothalamic (L6CT, n=13) neurons. C) Principal components ($PC_{1/2}$) of dendritic features that discriminate between excitatory cell types in the deep layers ^{12, 13} (representing the cells in panel B). **D**) 321

- Horizontal axon extent (95% iso-contours) of VPM (n=14), L4SP (n=14), L5PT (n=7), L6CT (n=11) and L5/6BS (n=9) neurons. Top views onto wS1. **E)** Vertical distributions of L4SP and L5/6BS axons (same
- 324 cells as in panel D) vs. cytoarchitectonic layer borders ¹¹.
- 325

326



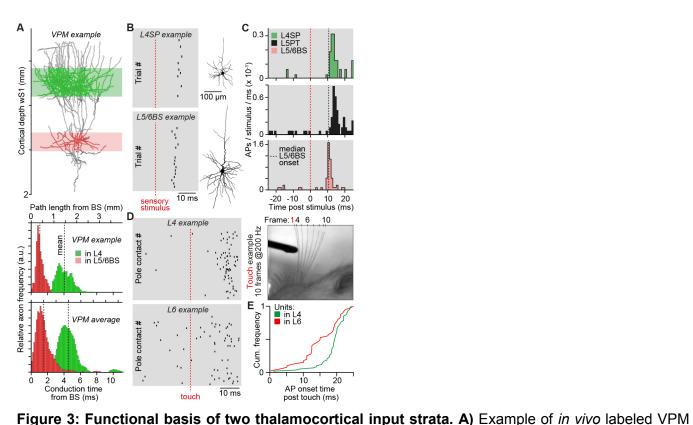
327 Figure 2: Synaptic basis of two thalamocortical input strata. A) Coronal brain section (50 µm) after injection of an adeno-associated virus (AAV) into the VPM, which expresses channel rhodopsin (ChR2) 328 and a fluorescent marker (mCherry) in thalamocortical (TC) synapses. B) Example of cell-attached in 329 330 vivo recording in wS1 of AAV-injected brain. Ticks represent APs in response to a 10 ms flash of green light onto the cortical surface (upper panel), and a 700 ms airpuff onto the whiskers (lower panel). C) 331 Reconstruction of the L5/6BS cell shown in panel B, superimposed with quantification of AAV labeling. 332 D) Confocal images of the L5/6BS cell shown in panel C. Putative TC synapses were identified as 333 contacts between VPM boutons and dendritic spines. E) Fraction of spines (n=4789) along the dendrites 334 335 of the L5/6BS cell shown in panel B-D that are contacted by VPM boutons. F) Post-stimulus-timehistograms (PSTHs) of light-evoked APs in L4SP and L5/6BS cells (mean ± STD of AP onset: 4.6±0.7 336

ms, n=4 vs. 4.4±0.8 ms, n=4). G) PSTHs of airpuff-evoked APs in L4SP, L5/6BS (same cells as in panel 337

338 F) and VPM cells (n=7).

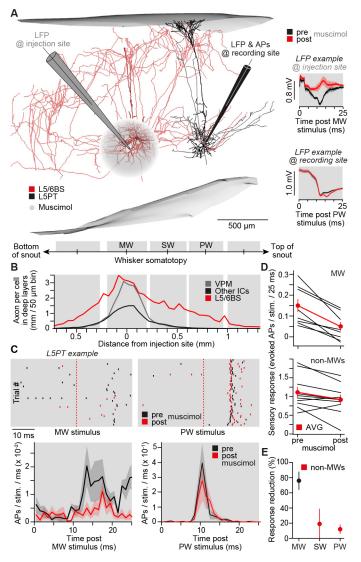
339

340



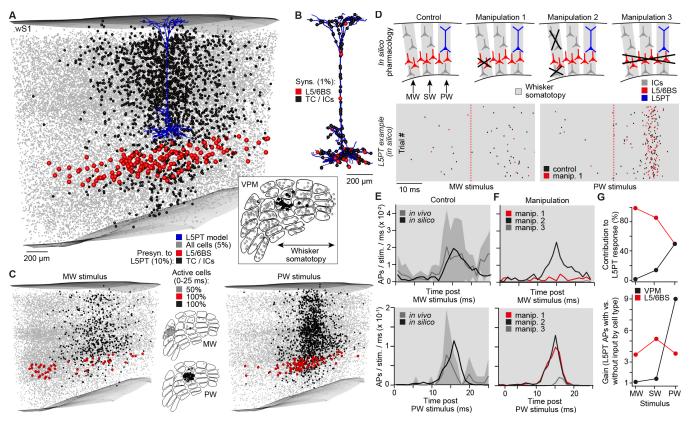
341 342 axon (upper panel), whose path length distribution was quantified with respect to the deepest location of 343 344 345 346

the border stratum (L5/6BS), and multiplied with the IC conduction velocity (0.33 m/s²⁰) of TC axons (center panel). Average conduction time of VPM axons (n=14) to the border stratum and layer 4 (lower panel). B) AP responses evoked by principal whisker (PW) deflections in exemplary L4SP and L5/6BS cells. C) PSTHs of PW-evoked APs in morphologically identified L4SP (n=8), L5PT (n=9) and L5/6BS (n=6) cells. D) Example of simultaneously recorded single units in layer 4 and upper layer 6 (~1.6 mm 347 recording depth), which show reliable AP responses after PW contact with a pole during exploratory 348 349 whisking (right panel: whisker positions after exemplary touch). E) Distribution of touch-evoked AP onsets across animals (n=3) in layer 4 and upper layer 6. 350

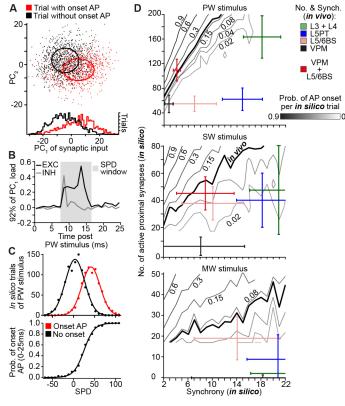


351

352 Figure 4: Onsets of broadly tuned cortical output patterns are driven by L5/6BS cells. A) The somatotopy of rat wS1⁹ in combination with whisker-evoked local field potential (LFP) measurements ²⁴, 353 354 allowed placing of muscimol injection and recording pipettes such that the respective PWs were 355 separated by one whisker. Here the PW at the recording site is B2, the manipulated whisker (MW) is D2, 356 and the separating whisker (SW) is C2. Left panel: L5/6BS and L5PT cells labeled in the same animal illustrate pharmacology experiments. Right panels: example LFPs before and after muscimol injections. 357 358 B) Axonal extent in the deep layers from neurons located in the barrel column that represents the MW. C) Exemplary AP responses evoked by MW and PW deflections and PSTHs across cells (mean ± SEM; 359 360 MW: n=8, PW: n=5). D) Response per cell to deflections of the MW (n=8, Wilcoxon rank-sum test: median = 0.095, 95% CI [0.05, 0.16], W=36, p=0.008) and non-MWs (PW & SW, n=5 & 5, Wilcoxon rank-sum 361 test: median = 0.18, 95% CI [6x10⁻⁵, 0.38], W=47.5, p=0.05) before and after muscimol injections. Mean 362 ± SEM. E) Effect of muscimol on L5PT responses to deflections of the MW and non-MWs. 363



365 Figure 5: L5/6BS cells amplify and horizontally relay TC inputs to drive L5PT neurons. A) Example distribution of TC (i.e., inset represents model of VPM with barreloids) and IC neurons that provide 366 367 synaptic input to a multi-compartmental L5PT model, embedded into an anatomically realistic model of rat wS1²⁵. B) Synapse locations along the dendrites of the L5PT model corresponding to the distribution 368 of input neurons in panel A. C) Example distributions of VPM and IC neurons that provide synaptic input 369 to the L5PT model during simulations of MW or PW deflections. D) Dendritic integration of such generated 370 371 synaptic input patterns (i.e., for deflections of the MW, SW and PW, respectively) and transformation into somatic APs were simulated for four different (pharmacology) scenarios. Raster plots represent APs of 372 the L5PT model for 200 of these input patterns, respectively. E) PSTHs predicted by the L5PT model 373 (control scenario) and as measured in vivo for deflections of the PW (n=9) and MW (n=8). F) PSTHs 374 predicted by the L5PT model for the three different manipulation scenarios. G) Relative fractions of VPM 375 376 and L5/6BS synapses that provided input to the L5PT model during simulations of MW, SW and PW deflections (upper panel), and the respective amplifications of L5PT AP responses (lower panel). 377



378

Figure 6: L5/6BS cells provide synchronous drive to proximal dendrites of L5PT neurons. 379 380 A. PC analysis of spatiotemporal synaptic inputs that impinge onto the L5PT model during simulations of PW deflections. **B.** 92% of the separation between simulation trials with and without fast AP responses 381 382 are reflected by PC₁, which represents the net excitatory input to proximal dendrites within a time window of 8-16 ms. These two parameters are combined into a single quantity: synchronous proximal drive 383 384 (SPD). C. SPD is an almost perfect predictor for AP responses during simulations of the L5PT model. D. Probabilities of fast AP responses after simulations of PW. SW and MW deflections as predicted for 385 386 different combinations of the number and synchrony of proximal inputs vs. cell type-specific data derived from empirical constraints of the model. Bold lines represent our in vivo measurements. 387 388

389 **References**

- Bruno RM, Sakmann B. Cortex is driven by weak but synchronously active thalamocortical synapses. *Science* **312**, 1622-1627 (2006).
- Harris KD, Shepherd GM. The neocortical circuit: themes and variations. *Nat Neurosci* 18, 170 181 (2015).
- Bouglas RJ, Martin KA. Neuronal circuits of the neocortex. *Annu Rev Neurosci* 27, 419-451 (2004).
- Lund JS. Anatomical organization of macaque monkey striate visual cortex. *Annu Rev Neurosci* 11, 253-288 (1988).
- Antonini A, Stryker MP. Rapid remodeling of axonal arbors in the visual cortex. *Science* 260, 1819-1821 (1993).

- 400 6. Oberlaender M, Ramirez A, Bruno RM. Sensory experience restructures thalamocortical axons
 401 during adulthood. *Neuron* 74, 648-655 (2012).
- 402 7. Constantinople CM, Bruno RM. Deep cortical layers are activated directly by thalamus. *Science*403 340, 1591-1594 (2013).
- 404 8. Feldmeyer D, et al. Barrel cortex function. Prog Neurobiol **103**, 3-27 (2013).
- 405 9. Egger R, Narayanan RT, Helmstaedter M, de Kock CP, Oberlaender M. 3D reconstruction and standardization of the rat vibrissal cortex for precise registration of single neuron morphology.
 407 PLoS Comput Biol 8, e1002837 (2012).
- 408 10. de Kock CP, Bruno RM, Spors H, Sakmann B. Layer- and cell-type-specific suprathreshold 409 stimulus representation in rat primary somatosensory cortex. *J Physiol* **581**, 139-154 (2007).
- Meyer HS, Egger R, Guest JM, Foerster R, Reissl S, Oberlaender M. Cellular organization of
 cortical barrel columns is whisker-specific. *Proc Natl Acad Sci U S A* **110**, 19113-19118 (2013).
- 12. Narayanan RT, *et al.* Beyond Columnar Organization: Cell Type- and Target Layer-Specific
 Principles of Horizontal Axon Projection Patterns in Rat Vibrissal Cortex. *Cereb Cortex* 25, 4450 4468 (2015).
- 415 13. Oberlaender M, *et al.* Cell type-specific three-dimensional structure of thalamocortical circuits in
 416 a column of rat vibrissal cortex. *Cereb Cortex* 22, 2375-2391 (2012).
- Rojas-Piloni G, Guest JM, Egger R, Johnson AS, Sakmann B, Oberlaender M. Relationships
 between structure, in vivo function and long-range axonal target of cortical pyramidal tract
 neurons. *Nat Commun* 8, 870 (2017).
- 420 15. Crandall SR, Patrick SL, Cruikshank SJ, Connors BW. Infrabarrels Are Layer 6 Circuit Modules
 421 in the Barrel Cortex that Link Long-Range Inputs and Outputs. *Cell Rep* 21, 3065-3078 (2017).
- Velez-Fort M, *et al.* The stimulus selectivity and connectivity of layer six principal cells reveals
 cortical microcircuits underlying visual processing. *Neuron* 83, 1431-1443 (2014).
- Schoonover CE, *et al.* Comparative strength and dendritic organization of thalamocortical and corticocortical synapses onto excitatory layer 4 neurons. *J Neurosci* 34, 6746-6758 (2014).
- 426
 427
 428
 429
 429
 429
 420
 420
 420
 420
 420
 420
 420
 421
 421
 421
 421
 422
 422
 422
 423
 423
 424
 424
 425
 425
 426
 426
 427
 427
 428
 428
 428
 428
 428
 429
 429
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
 420
- 428 19. O'Connor DH, Peron SP, Huber D, Svoboda K. Neural activity in barrel cortex underlying vibrissa 429 based object localization in mice. *Neuron* 67, 1048-1061 (2010).
- Salami M, Itami C, Tsumoto T, Kimura F. Change of conduction velocity by regional myelination
 yields constant latency irrespective of distance between thalamus and cortex. *Proc Natl Acad Sci U S A* 100, 6174-6179 (2003).
- Wright N, Fox K. Origins of cortical layer V surround receptive fields in the rat barrel cortex. J
 Neurophysiol **103**, 709-724 (2010).
- 435 22. Manns ID, Sakmann B, Brecht M. Sub- and suprathreshold receptive field properties of pyramidal
 436 neurones in layers 5A and 5B of rat somatosensory barrel cortex. *J Physiol* 556, 601-622 (2004).
- Brecht M, Sakmann B. Whisker maps of neuronal subclasses of the rat ventral posterior medial
 thalamus, identified by whole-cell voltage recording and morphological reconstruction. *J Physiol* **538**, 495-515 (2002).
- 440 24. Lee JH, Shin HS, Lee KH, Chung S. LFP-guided targeting of a cortical barrel column for in vivo 441 two-photon calcium imaging. *Sci Rep* **5**, 15905 (2015).
- 442 25. Egger R, Dercksen VJ, Udvary D, Hege HC, Oberlaender M. Generation of dense statistical connectomes from sparse morphological data. *Front Neuroanat* **8**, 129 (2014).
- 444 26. Bruno RM, Simons DJ. Feedforward mechanisms of excitatory and inhibitory cortical receptive 445 fields. *J Neurosci* **22**, 10966-10975 (2002).
- Hay E, Hill S, Schurmann F, Markram H, Segev I. Models of neocortical layer 5b pyramidal cells
 capturing a wide range of dendritic and perisomatic active properties. *PLoS Comput Biol* 7, e1002107 (2011).
- 449 28. Briggs F. Organizing principles of cortical layer 6. Front Neural Circuits 4, 3 (2010).

- 450 29. Karube F, Sari K, Kisvarday ZF. Axon topography of layer 6 spiny cells to orientation map in the 451 primary visual cortex of the cat (area 18). *Brain Struct Funct* **222**, 1401-1426 (2017).
- 452 30. Ramirez A, Pnevmatikakis EA, Merel J, Paninski L, Miller KD, Bruno RM. Spatiotemporal 453 receptive fields of barrel cortex revealed by reverse correlation of synaptic input. *Nat Neurosci* **17**, 454 866-875 (2014).
- 455 31. Li H, Fukuda M, Tanifuji M, Rockland KS. Intrinsic collaterals of layer 6 Meynert cells and 456 functional columns in primate V1. *Neuroscience* **120**, 1061-1069 (2003).
- 457 32. Sherman SM. Thalamus plays a central role in ongoing cortical functioning. *Nat Neurosci* 19, 533458 541 (2016).
- 459 33. Markram H, Helm PJ, Sakmann B. Dendritic calcium transients evoked by single back460 propagating action potentials in rat neocortical pyramidal neurons. *J Physiol* 485 (Pt 1), 1-20 (1995).
- 46234.Larkum ME, Zhu JJ, Sakmann B. A new cellular mechanism for coupling inputs arriving at different463cortical layers. Nature **398**, 338-341 (1999).
- 464 35. Hay E, Segev I. Dendritic Excitability and Gain Control in Recurrent Cortical Microcircuits. *Cereb* 465 *Cortex* 25, 3561-3571 (2015).
- 46636.Takahashi N, Oertner TG, Hegemann P, Larkum ME. Active cortical dendrites modulate467perception. Science 354, 1587-1590 (2016).
- 46837.Cohen-Kashi Malina K, Mohar B, Rappaport AN, Lampl I. Local and thalamic origins of correlated469ongoing and sensory-evoked cortical activities. Nat Commun 7, 12740 (2016).
- 47038.Zhang ZW, Deschenes M. Intracortical axonal projections of lamina VI cells of the primary471somatosensory cortex in the rat: a single-cell labeling study. J Neurosci 17, 6365-6379 (1997).
- 472 39. Fries W, Keizer K, Kuypers HG. Large layer VI cells in macaque striate cortex (Meynert cells)
 473 project to both superior colliculus and prestriate visual area V5. *Exp Brain Res* 58, 613-616 (1985).

475 Methods and Supplement only

- 476 40. Narayanan RT, Mohan H, Broersen R, de Haan R, Pieneman AW, de Kock CP. Juxtasomal
 477 biocytin labeling to study the structure-function relationship of individual cortical neurons. *J Vis*478 *Exp*, e51359 (2014).
- 479 41. Boudewijns ZS, *et al.* Layer-specific high-frequency action potential spiking in the prefrontal cortex
 480 of awake rats. *Front Cell Neurosci* 7, 99 (2013).
- 481 42. Clack NG, *et al.* Automated tracking of whiskers in videos of head fixed rodents. *PLoS Comput* 482 *Biol* **8**, e1002591 (2012).
- 483 43. Siegle JH, Lopez AC, Patel YA, Abramov K, Ohayon S, Voigts J. Open Ephys: an open-source, 484 plugin-based platform for multichannel electrophysiology. *J Neural Eng* **14**, 045003 (2017).
- 485 44. Rossant C, et al. Spike sorting for large, dense electrode arrays. Nat Neurosci **19**, 634-641 (2016).
- 486
 45. Bartho P, Hirase H, Monconduit L, Zugaro M, Harris KD, Buzsaki G. Characterization of neocortical principal cells and interneurons by network interactions and extracellular features. J Neurophysiol 92, 600-608 (2004).
- 489 46. Wong-Riley M. Changes in the visual system of monocularly sutured or enucleated cats 490 demonstrable with cytochrome oxidase histochemistry. *Brain Res* **171**, 11-28 (1979).
- 491 47. Horikawa K, Armstrong WE. A versatile means of intracellular labeling: injection of biocytin and
 492 its detection with avidin conjugates. *J Neurosci Methods* 25, 1-11 (1988).
- 493 48. Oberlaender M, Bruno RM, Sakmann B, Broser PJ. Transmitted light brightfield mosaic 494 microscopy for three-dimensional tracing of single neuron morphology. *J Biomed Opt* **12**, 064029 495 (2007).
- 496
 49. Dercksen VJ, Hege HC, Oberlaender M. The Filament Editor: an interactive software environment for visualization, proof-editing and analysis of 3D neuron morphology. *Neuroinformatics* 12, 325-339 (2014).

- Mainen ZF, Carnevale NT, Zador AM, Claiborne BJ, Brown TH. Electrotonic architecture of
 hippocampal CA1 pyramidal neurons based on three-dimensional reconstructions. J
 Neurophysiol **76**, 1904-1923 (1996).
- 502 51. Druckmann S, Banitt Y, Gidon A, Schurmann F, Markram H, Segev I. A novel multiple objective 503 optimization framework for constraining conductance-based neuron models by experimental data. 504 *Front Neurosci* **1**, 7-18 (2007).
- 505 52. Hines ML, Carnevale NT. The NEURON simulation environment. *Neural Comput* **9**, 1179-1209 (1997).
- 507 53. Årzt M, Sakmann B, Meyer HS. Anatomical Correlates of Local, Translaminar, and Transcolumnar
 508 Inhibition by Layer 6 GABAergic Interneurons in Somatosensory Cortex. *Cereb Cortex*, 1-12
 509 (2017).
- 510 54. Helmstaedter M, Sakmann B, Feldmeyer D. L2/3 interneuron groups defined by multiparameter 511 analysis of axonal projection, dendritic geometry, and electrical excitability. *Cereb Cortex* **19**, 951-512 962 (2009).
- 513 55. Koelbl C, Helmstaedter M, Lubke J, Feldmeyer D. A barrel-related interneuron in layer 4 of rat 514 somatosensory cortex with a high intrabarrel connectivity. *Cereb Cortex* **25**, 713-725 (2015).
- 515 56. Egger R, Schmitt AC, Wallace DJ, Sakmann B, Oberlaender M, Kerr JN. Robustness of sensory-516 evoked excitation is increased by inhibitory inputs to distal apical tuft dendrites. *Proc Natl Acad* 517 *Sci U S A* **112**, 14072-14077 (2015).
- 518 57. Feldmeyer D, Lubke J, Silver RA, Sakmann B. Synaptic connections between layer 4 spiny 519 neurone-layer 2/3 pyramidal cell pairs in juvenile rat barrel cortex: physiology and anatomy of 520 interlaminar signalling within a cortical column. *J Physiol* **538**, 803-822 (2002).
- 521 58. Wozny C, Williams SR. Specificity of synaptic connectivity between layer 1 inhibitory interneurons 522 and layer 2/3 pyramidal neurons in the rat neocortex. *Cereb Cortex* **21**, 1818-1826 (2011).
- 523 59. Jahr CE, Stevens CF. A quantitative description of NMDA receptor-channel kinetic behavior. *J* 524 *Neurosci* **10**, 1830-1837 (1990).
- 525 60. Larkum ME, Nevian T, Sandler M, Polsky A, Schiller J. Synaptic integration in tuft dendrites of 526 layer 5 pyramidal neurons: a new unifying principle. *Science* **325**, 756-760 (2009).
- 527 61. Schnepel P, Kumar A, Zohar M, Aertsen A, Boucsein C. Physiology and Impact of Horizontal 528 Connections in Rat Neocortex. *Cereb Cortex* **25**, 3818-3835 (2015).
- 529 62. Gupta A, Wang Y, Markram H. Organizing principles for a diversity of GABAergic interneurons 530 and synapses in the neocortex. *Science* **287**, 273-278 (2000).
- 63. Petersen CC, Hahn TT, Mehta M, Grinvald A, Sakmann B. Interaction of sensory responses with
 spontaneous depolarization in layer 2/3 barrel cortex. *Proc Natl Acad Sci U S A* **100**, 13638-13643
 (2003).
- 64. Reyes-Puerta V, Sun JJ, Kim S, Kilb W, Luhmann HJ. Laminar and Columnar Structure of
 Sensory-Evoked Multineuronal Spike Sequences in Adult Rat Barrel Cortex In Vivo. Cereb Cortex
 25, 2001-2021 (2015).
- 537 65. Lefort S, Tomm C, Floyd Sarria JC, Petersen CC. The excitatory neuronal network of the C2 538 barrel column in mouse primary somatosensory cortex. *Neuron* **61**, 301-316 (2009).
- Thomson AM, West DC, Wang Y, Bannister AP. Synaptic connections and small circuits involving
 excitatory and inhibitory neurons in layers 2-5 of adult rat and cat neocortex: triple intracellular
 recordings and biocytin labelling in vitro. *Cereb Cortex* 12, 936-953 (2002).
- 542 67. Brown SP, Hestrin S. Intracortical circuits of pyramidal neurons reflect their long-range axonal targets. *Nature* **457**, 1133-1136 (2009).
- 68. Perin R, Berger TK, Markram H. A synaptic organizing principle for cortical neuronal groups. *Proc Natl Acad Sci U S A* **108**, 5419-5424 (2011).
- 546 69. Song S, Sjostrom PJ, Reigl M, Nelson S, Chklovskii DB. Highly nonrandom features of synaptic 547 connectivity in local cortical circuits. *PLoS Biol* **3**, e68 (2005).
- Thomson AM, West DC, Hahn J, Deuchars J. Single axon IPSPs elicited in pyramidal cells by
 three classes of interneurones in slices of rat neocortex. *J Physiol* 496 (Pt 1), 81-102 (1996).

19

550 Methods

551 **Animal preparation:** All experiments were carried out after evaluation by the local German authorities, 552 in accordance with the animal welfare guidelines of the Max Planck Society, or with the Dutch law after 553 evaluation by a local ethical committee at the VU University Amsterdam, The Netherlands.

554

Virus injection: Male Wistar rats aged 22-25 days (P22-25, m, Charles River) were anesthetized with 555 isoflurane supplemented by rimadyl (Caprofen, 5mg/ kg) as analgesia, then placed into a stereotaxic 556 557 frame (Kopf Instruments, model 1900), and provided with a continuous flow of isoflurane/O₂ gas. Body 558 temperature was maintained at 37°C by a heating pad. A small craniotomy was made above the left 559 hemisphere 2.85 mm posterior to bregma and 3.2 mm lateral from the midline. The head of the rat was 560 leveled with a precision of 1 µm in both the medial-lateral and anterior-posterior planes using an eLeVeLeR electronic leveling device (Sigmann Electronics, Hüffenhardt, Germany) mounted to an 561 562 adapter of the stereotaxic frame. An injecting pipette containing an adeno-associated virus (AAV) was 563 lowered into the VPM thalamus (5.05 mm from the pia). The virus - rAAV2/1-CAG-hChR2(H134R)-Syn-564 mCherry (titer: 1x1012 gc ml⁻¹) – was provided by Martin Schwarz (University of Bonn, Germany). 50-70 565 nL of the virus were injected using a 30cc syringe coupled to a calibrated glass injection capillary.

566

567 Cell-attached recording/labeling in virus injected animals: After a 16-21 day incubation period, AAV injected rats were anesthetized with urethane (1.8 g/kg body weight) by intraperitoneal injection. The 568 569 depth of anesthesia was assessed by monitoring pinch withdrawal, eyelid reflexes, and vibrissae movements. Body temperature was maintained at 37.5 ± 0.5 °C by a heating pad. Cell-attached recording 570 and labeling was performed as described in detail previously ⁴⁰. Briefly, APs were recorded using an 571 572 extracellular loose patch amplifier (ELC-01X, npi electronic GmbH), and digitized using a CED power1401 573 data acquisition board (CED, Cambridge Electronic Design, Cambridge, UK). APs were recorded before and during 20-30 trials of caudal multi-whisker deflections by a 700 ms airpuff (10 PSI), delivered through 574 a 1 mm plastic tube from a distance of 8-10 cm from the whisker pad ¹⁴. Stimulation was repeated at 575 576 constant intervals (0.3 Hz). Optical stimulation of ChR2-expressing thalamocortical terminals was provided by a 200 µm diameter optical fiber (ThorLabs #RJPSF2) coupled to a 470 nm wavelength LED 577 578 (ThorLabs M470F3), resulting in an output power of 1 mW. The fiber was positioned approximately 2 mm 579 above the cortical surface, resulting in a 1-2 mm disc of light above wS1. APs were recorded during 20-580 30 trials of 10 ms light pulses, at an inter-stimulus interval of 2.5 s. Following the electrophysiological 581 measurements, neurons were filled with biocytin. Filling sessions were repeated several times. After 1-2 hours for tracer diffusion, animals were transcardially perfused with 0.9% saline followed by 4% 582

paraformaldehyde (PFA). Brains were removed and post-fixed with 4% PFA for 24 hours, transferred to
0.05 M phosphate buffer (PB) and stored at 4°C.

585

586 Pharmacological manipulation: Wistar rats (P28-P35, m, Charles River) were anesthetized with 587 urethane (1.6-1.7 g/kg body weight) by intraperitoneal injection. As described above, the depth of anesthesia was monitored, and the animal's body temperature was maintained. An 'L' shaped craniotomy 588 589 centered on the coordinate of the barrel column representing the D2 whisker (2.5 mm posterior and 5.5 590 mm lateral to the bregma) was made without cutting the dura, and extended along the rostro-medial (i.e., 591 along the E-row) and caudal axes (i.e., arc 2) for ~1-2 mm, respectively. Locations for muscimol injections 592 and recordings were determined with long-tapered 'search pipettes' (tip diameter <3 µm and insertion 593 diameter <50µm). The search pipette was inserted rostral to wS1 and lowered parallel to the midline 594 while measuring LFPs at different cortical depths, and in response to deflections of different individual whiskers using a piezoelectric bimorph ²⁴. Recordings were made using an Axoclamp 2B amplifier (Axon 595 596 instruments, Union City, CA, USA), low pass filtered (300 Hz), and digitized using a CED power1401 data acquisition board (CED, Cambridge Electronic Design, Cambridge, UK). Using the LFP data, we identified 597 598 the depth of the L5/6 border and the principal whisker (e.g. E2), and marked this location on the dura with 599 a surgical pen. Repeating the LFP-quided whisker mapping with a second search pipette that was 600 inserted approximately parallel to the vertical axis of wS1, we identified layer 5 of the hence appropriate 601 recording site (i.e., C2 if the injection pipette was located at E2). This location was also marked on the 602 dura. Pipettes for muscimol injections were prepared with a tip diameter of 8-12 µm. The taper diameter 603 at the insertion point into the brain was ~125-150 µm. The tip of the pipette was filled with normal rat 604 ringer (NRR) to avoid muscimol spill upon pipette insertion. The rest of the pipette was filled with 10 mM 605 muscimol supplemented with 2% biocytin. The injection pipette was positioned at the previously determined location, the dura was cut open (~500 µm), and the injection pipette was inserted with positive 606 607 pressure of 5-10 mbar. Allowing the tissue to adjust for 10-15 minutes, we inserted a recording pipette (i.e., 1 µm tip diameter, filled with NRR supplemented with 2% biocytin) at the second previously 608 609 determined location. Both locations were confirmed by measuring whisker-evoked LFPs. Pyramidal tract neurons were identified as follows ^{10, 13, 22}: (1) recording depth between 1000-1600 µm; (2) ongoing AP 610 611 rates between ~1-5 Hz; (3) reliable and fast APs (i.e., between 10-20 ms) in response to principal whisker 612 deflections; (4) reliable and fast APs after deflection of the manipulated whisker. We identified eight neurons that matched these criteria (recording / injection location: 1x B1/D1, 4x C1/E1, 3x C2/E2). 613 Whisker deflections of the PW (e.g. C2), one SW (e.g. D2) and the MW (e.g. E2) were performed (i.e., 614 50 trials of 200 ms ramp-and-hold stimulus with an amplitude of \sim 5°, 2 s inter-stimulus interval), and APs 615 616 were recorded, while simultaneously measuring the LFP via the injection pipette. Following these

21

617 measurements (i.e., control data), muscimol was injected by slowly increasing the pressure onto the 618 injection pipette (80-300 mbar), while monitoring the LFP in response to MW deflections. Once MW-619 evoked LFPs were abolished, and the AP activity remained unaffected, the measurements of whisker-620 evoked responses were repeated (i.e., at least 50 trials of PW, SW and MW deflections, respectively).

621

622 Extracellular recordings: Wistar rats (P33-P70, m) were anesthetized using 1.6 % isoflurane in 0.4 l/h 623 $O_2 + 0.7$ l/h NO₂, supplemented by rimadyl (Caprofen, 5mg/kg) as analgesia. A craniotomy of 0.5 mm x 624 0.5 mm was made above wS1 on the left hemisphere, and a head post for fixation was implanted on the 625 skull. After recovery from surgery, rats were head-fixed two times per day for 2-3 days. Rats quickly 626 adjusted to the head-fixation, allowing stable recording conditions without the need of body restraint. Rats 627 were anaesthetized with isoflurane (1.25% in 0.4 l/h O_2 + 0.7 l/h NO_2), and a 32-channel linear silicon probe (E32+R-50-S1-L10(NT), Atlas Neuroengineering, Belgium) was inserted into wS1 for extracellular 628 629 multi-unit recordings. Prior to recordings, silicon probes were labeled with Dil (Thermo Fisher Scientific, 630 Waltham, MA, USA). The probe was connected to a unity-gain headstage (Neuralynx, USA), in series with the Open Ephys data acquisition board equipped with a RHD2132 digital interface chip (Intan 631 632 Technologies, Los Angeles, CA, USA). Using the LFP strategy described above, the PW at the recording 633 site was identified, all other whiskers were trimmed to 5 mm, and the anesthesia was terminated. 634 Recordings were performed once the animals were fully awake (~25 minutes after the anesthesia was 635 terminated ⁴¹). Rats were not trained to perform tactile behavior, and behavior was not rewarded. Sensory 636 input resulted from whisker touch with a pole that was placed within range during periods of exploratory 637 whisker self-motion. The touch onset was determined by high-speed videography at 200 frames/s (MotionScope M3 camera, IDT Europe, Belgium). Whisker angle was tracked offline ⁴², and episodes of 638 639 whisker movements were classified by thresholding average power in whisker angle versus time (1-20 Hz bandpass) using the Matlab spectrogram function. Touch events were detected manually in each 640 frame. Signals were acquired at a sampling rate of 30 kHz/channel using Open Ephys GUI ⁴³. To identify 641 single units, the data were high-pass filtered, and automatically sorted into clusters using Klustakwik⁴⁴. 642 The clusters were manually post-processed, and only stable and well-isolated single units were 643 644 considered for analysis. The average waveforms of all well-isolated single units were used to sub-classify 645 units ⁴⁵ as regular spiking vs. fast spiking units (FSUs). FSUs (AP peak-to-trough time <0.5 ms and AP half-peak time <0.25 ms) were excluded from the analyses. After recordings, rats were anaesthetized 646 647 with urethane (>2.0 g/kg) and perfused with 0.9% NaCl followed by 4% paraformaldehyde (PFA).

648

Histology: For morphological reconstructions, 100 μm thick vibratome sections were cut tangentially to
 wS1 (45° angle) ranging from the pial surface to the white matter (WM). Sections were processed for

cytochrome-C oxidase staining to visualize barrel contours in layer 4⁴⁶. All sections were treated with 651 652 avidin-biotin (ABC) solution, and subsequently neurons were identified using the chromogen 3,3'-653 diaminobenzidine tetrahydrochloride (DAB)⁴⁷. All sections were mounted on glass slides, embedded with 654 Mowiol, and enclosed with a cover slip. In experiments where AAV injections were combined with biocytin 655 filling, cortex was cut into 45-48 consecutive 50 µm thick tangential sections. Sections were treated with Streptavidin Alexa-488 conjugate (5mg/ml Molecular Probes #S11223) to stain biocytin labeled 656 657 morphologies ¹⁴. To enhance the virus labeling, sections were immunolabeled with anti-mCherry 658 antibody. Sections were permeabilized and blocked in 0.5% Triton x-100 (TX) (Sigma Aldrich #9002-93-659 1) in 100 mM PB containing 4% normal goat serum (NGS) (Jackson ImmunoResearch Laboratories #005-000-121) for 2 hours at room temperature. The primary antibody was diluted 1:500 (Rabbit anti-660 mCherry, Invitrogen #PA5-34974) in PB containing 1% NGS for 24 hours at 4°C. The secondary antibody 661 662 was diluted (1:500 goat anti-Rabbit IgG Alexa-647 H+L Invitrogen #A21245) and was incubated for 2-3 663 hours at room temperature in PB containing 3% NGS and 0.3% TX. All sections were mounted on glass 664 slides, embedded with SlowFade Gold (Invitrogen #S36936) and enclosed with a cover slip. For extracellular recording experiments, brains were post-fixed in 4% PFA, and tangential vibratome sections 665 666 (100 µm) were cut and stained for cytochrome-C. An X-Cite 120 Q light-source (Excelitas Technologies 667 Corp., Waltham, MA, USA) was used to visualize the Dil electrode tract, and only electrode tracks within 668 the barrel column that represents the PW were selected for analyses. The histology allowed assigning 669 the recording depth to each electrode (i.e., and hence to each unit) with approximately 100 µm precision. 670

671 Morphological reconstruction: Neuronal structures were extracted from image stacks using a previously reported automated tracing software 48 . 3D image stacks of up to 5 mm × 5 mm × 0.1 mm 672 673 were acquired using an automated brightfield microscope system (BX-51, Olympus, Japan) at a resolution of 0.092 × 0.092 × 0.5 µm per voxel (100× magnification, NA 1.4). For reconstruction of 674 675 fluorescently labeled neurons, images were acquired using a confocal laser scanning system (Leica Application Suite Advanced Fluorescence SP5; Leica Microsystems). 3D image stacks of up to 2.5 mm 676 × 2.5 mm × 0.05 mm were acquired at a resolution of 0.092 × 0.092 × 0.5 µm per voxel (63× magnification, 677 678 NA 1.3). Manual proof-editing of individual sections, and automated alignment across sections were 679 performed using custom-designed software ⁴⁹. Pia, barrel and WM outlines were manually drawn on low resolution images (4×). Using these anatomical reference structures, all reconstructed dendrite and axon 680 morphologies were registered to the D2 barrel column of a standardized 3D reference frame of rat wS1 681 682 ⁹. The shortest distance from the pial surface to the soma, and 20 morphological features that have previously been shown to separate between excitatory cell types in rat wS1⁹ were calculated for each 683 reconstructed and registered dendrite morphology. For identification of putative thalamocortical 684

685 synapses, biocytin labeled morphologies and AAV labeled VPM terminals were imaged simultaneously 686 using the confocal laser scanning system as described above: biocytin Alexa-488 (excited at 488 nm, 687 emission detection range 495-550 nm), AAV Alexa-647 (excited at 633 nm, emission detection range 688 650-785 nm). These dual-channel 3D image stacks were loaded into Amira visualization software (FEI). 689 All reconstructed dendrites were manually inspected, and landmarks were placed onto each spine head. If a spine head was overlapping with a VPM bouton, an additional landmark was placed to mark a putative 690 691 synapse. The shortest distance of each landmark to the dendrite reconstruction was determined, and the 692 path length distance was calculated from that location along the reconstructed L5/6BS cell to the soma.

693

694 Cell type-specific analysis: In total, n=177 in vivo labeled morphologies of excitatory neurons in wS1 695 (i.e., from urethane anesthetized Wistar rats; P25-P45, m/f, Charles River) were used in this study to 696 determine cell type-specific whisker receptive fields (wRFs), and to provide structural/functional constrains for simulation experiments. All morphologies ^{12, 14} - except for five L5/6BS and one L5PT 697 neurons – and classification approaches ^{12, 13}, as well as the corresponding whisker-evoked physiology 698 data ^{10, 13} have been reported previously, but in different context. Analysis of wRFs for objectively 699 classified morphological cell types were not performed for any of the previously reported neurons. Here, 700 each neuron was objectively assigned to one of the 10 major excitatory cell types of the neocortex ^{2, 12} 701 based on the 21 soma-dendritic features described above: three types of pyramids in layers 2-4 (L2PY, 702 703 L3PY, L4PY), spiny-stellates (L4ss) and star-pyramids in layer 4 (L4sp), slender-tufted intratelencephalic 704 (L5IT) and thick-tufted pyramidal tract neurons in layer 5 (L5PTs), polymorphic corticocortical (L6CC) and 705 corticothalamic neurons in layer 6 (L6CT), and the L5/6 border stratum cells (L5/6BS). In the present study, we grouped L4ss and L4sp as layer 4 spiny neurons (L4SP). The physiology data (i.e., AP 706 707 responses to passive deflections of the principal and its eight adjacent whiskers ¹⁰) were grouped by the 708 hence determined morphological cell types, resulting cell type-specific wRFs.

709

710 Multi-compartmental model: We generated a biophysically-detailed multi-compartmental neuron 711 model, which captures the stereotypic morphological and intrinsic physiological properties of L5PTs. The 712 L5PT model is based on the 3D soma-dendrite reconstruction of a L5PT neuron, whose morphological 713 and topological features – which allow discriminating L5PTs from other excitatory cell types in the deep layers (see above) – represent approximately the respective averages across a population of 37 L5PTs 714 715 ^{12, 14} that were labeled *in vivo* via cell-attached recordings in layer 5 of rat wS1. A simplified axon morphology was attached to the reconstructed soma based on ⁵⁰. The axon consisted of an axon hillock 716 with a diameter tapering from 3.5 µm to 1 µm over a length of 10 µm, an axon initial segment (AIS) of 10 717 718 μm length and 1 μm diameter, and 1 mm of myelinated axon (diameter of 1 μm). The diameter of the

reconstruction of the apical trunk and oblique dendrites was scaled by a factor of 2.5 to allow for 719 720 backpropagation of action potentials (bAP), and bAP-triggered calcium spike (BAC) firing to occur (i.e., 721 after scaling the diameter of the apical trunk was 4.5 µm at the soma, and 1.5 µm at the main bifurcation 722 located at a distance of ~900 µm from the soma). Spatial discretization of the dendrite morphology (i.e., 723 compartmentalization) was performed by computing the electrotonic length constant of each dendrite 724 branch at a frequency of 100 Hz and setting the length of individual compartments in this branch to 10% 725 of this length constant. The length of axonal compartments was set to 10 µm. After spatial discretization, 726 the L5PT morphology consisted of 1033 compartments with an average length of ~15 µm, but no longer 727 than 42 µm. The resultant L5PT model was then combined with previously reported biophysical models 728 of a variety of Hodgkin-Huxley (HH)-type ion channels (Table S1) that are expressed at different densities 729 within the soma, basal and/or apical dendrites, and axon initial segment ²⁷. Using an evolutionary multi-730 objective optimization algorithm ⁵¹, we tuned the parameters of the biophysical models until numerical simulations of the L5PT model (using NEURON 7.2⁵²) reproduced current injection-evoked somatic 731 732 and/or dendritic sub- and suprathreshold responses that are characteristic for L5PTs, as measured previously via whole-cell recordings in acute brain slices of rat wS1 in vitro ²⁷. Fixed membrane 733 734 parameters were the axial resistance (100 Ωcm in all compartments), the membrane capacitance (1 μ F/cm² at the soma and axon, 2 μ F/cm² in the apical and basal dendrites to account for increased surface 735 736 area due to spines, and 0.04 µF/cm² along the myelinated part of the model axon), and the passive membrane conductance along the myelinated part of the axon ($g_{pas} = 0.4 \text{ pS}/\mu m^2$, i.e., equivalent to a 737 specific membrane resistance of 25,000 Ω cm²). The reversal potential of the passive membrane 738 739 conductance was set to -90 mV. Conductance densities of the non-specific cation current I_h were fixed at 0.8 pS/ μ m² in the soma and axon, and 2 pS/ μ m² in the basal dendrites. In the apical dendrite, the 740 conductance density of I_{h} increased exponentially with the distance to the soma. The biophysical model 741 parameters to be optimized were the peak conductance per unit membrane area for various voltage-742 743 dependent ion channels, and the parameters of a phenomenological model of the calcium dynamics in different parts of the morphology (i.e., axon, soma, basal and apical dendrites; **Table S1**). The targets of 744 745 the optimization were different features of the membrane potential in response to two stimuli, as measured previously ²⁷: (1) a brief current injection into the soma should trigger an AP at the soma and 746 747 a bAP, and (2) a brief current injection into the soma, followed by current injection into a Ca²⁺ channel dense region around the first bifurcation point of the apical tuft, should trigger somatic bursts (i.e., BAC 748 749 firing). The specific features, as listed in **Table S2**, were combined into five objectives, which were then optimized simultaneously by using the evolutionary algorithm ⁵¹. A set of 1,000 models was generated 750 with parameters drawn randomly from a physiologically plausible range. In every iteration, each model 751 752 was then evaluated by simulating the response to the two stimuli, calculating the features and determining

753 the error by calculating the difference between each simulated and measured feature in units of standard deviations of the experimental feature ²⁷. After each model had been evaluated, a new set of 1,000 754 755 models was generated from the previous set by stochastically transferring parameter values from "good" 756 models (i.e., lower errors) to "worse" models (i.e., higher errors). Additionally, parameter values of all 757 models were updated stochastically to avoid converging to local minima. This procedure was repeated 758 500 times. From the final iteration, the set of biophysical models used here was selected based on three 759 criteria: (1) it had the lowest sum across all objective errors, (2) similar deviations in all objective errors 760 (i.e., models where only a subset of objectives matched the experimental data were not considered), and 761 (3) it supported regular spiking of increasing frequencies in response to sustained current injections of 762 increasing amplitude.

763

764 **Connectivity model:** The structurally plausible constraints for the numbers and dendritic distributions of cell type-specific synaptic input patterns that impinge onto the L5PT model are based on an anatomically 765 realistic network model of rat wS1, as described in detail previously ²⁵. Briefly, we generated a 3D model 766 of the average geometry of rat wS1 (i.e., 3D location, orientation and diameter of all barrel columns; 3D 767 768 pial and white matter (WM) surfaces), and determined the variability (~50 µm) of these anatomical landmarks across twelve animals⁹. Next, we measured the number and 3D distribution of all excitatory 769 770 and inhibitory neuron somata in rat wS1 (~530,000 neurons) and the ventral posterior medial nucleus 771 (VPM) of the thalamus (~6.000 neurons) in four different animals ¹¹, and generated an average excitatory 772 and inhibitory 3D neuron somata distribution at a resolution of $50x50x50 \ \mu m^3$, reflecting the variability of 773 the cortex geometry across animals. We then registered a sample of 177 excitatory intracortical (IC) 774 neuron morphologies (i.e., grouped into ten cell types (see above) ^{10, 12}, 14 excitatory thalamocortical 775 (TC) axon morphologies labeled in VPM *in vivo* ⁶, and the soma-dendrites of 213 inhibitory neuron (IN) morphologies (203 labeled in L2-6 in vitro ^{53, 54, 55}, 10 labeled in L1 in vivo ⁵⁶) to the geometric model of 776 wS1. Combining these data by using a previously reported network building approach ²⁵, we generated 777 778 a structurally dense model of wS1, which comprised soma, dendrite and axon morphologies that 779 represent all of the excitatory (here: 462,402) and inhibitory neurons (here: 67,535) that are located in rat 780 wS1, as well as axon morphologies that represent the IC part of all VPM neurons (here: 6.225). To 781 estimate synaptic connectivity within this structurally dense wS1 model, we calculated the overlap at 50 µm³ resolution between the putative postsynaptic target structures (PSTs; i.e., soma/dendrite surface for 782 inhibitory connections; dendritic spines for excitatory connections) and putative presynaptic sites (i.e., 783 784 axonal boutons) for all pairs of neurons, and normalized this quantity by the respective total amount of 785 locally available PSTs (i.e., total somatic/dendritic surface and number of spines within each 50 µm voxel). Neglecting wiring specificity at subcellular scales ²⁵, we converted these overlap measurements 786

787 into connection probabilities, which predict the respective distributions of the numbers and most likely 788 dendritic locations of synaptic contacts. To compare the predicted connection probabilities between 789 excitatory IC cell types and L5PTs with previously reported paired-recording results that were obtained 790 from acute brain slices in vitro, we cropped out ten 300 µm wide thalamocortical/semi-coronal slices from 791 the network model, which comprised at least half of the C2 barrel column volume. Connection 792 probabilities that were predicted for truncated morphologies in slices are denoted by asterisks in **Table** 793 **S3**. To compare the predicted connection probabilities between TC neurons and L5PTs with previously 794 reported paired-recording results that were obtained in vivo, we used L5PTs whose somata were closest 795 to the C2 barrel column (i.e., including septal neurons) and TC neurons located in the C2 VPM-barreloid 796 of the uncropped network model. To compare the predicted connection probabilities between INs and 797 L5PTs with previously reported paired-recording results we grouped all excitatory neurons in layer 5 (i.e., 798 L5PTs and L5ITs) whose somata were closest to the C2 barrel column (i.e., including septal neurons) 799 and INs whose axons remained largely confined to layer 5. Finally, we embedded the L5PT model into the network model of wS1 by using a previously reported registration approach ⁹. Here, we placed the 800 L5PT model at nine different locations within the barrel column representing the C2 whisker (i.e., 801 802 approximately in the center of wS1), while preserving its (in vivo) soma depth location. For each of the 803 nine locations (i.e., one in the column center, and eight at equally spaced angular intervals with a distance of ~100 µm to the column center) we used the connectivity mapping procedures as described above to 804 805 estimate the numbers and dendritic locations of cell type-specific synaptic inputs that impinge onto the 806 dendrites of the L5PT model. Specifically, by sampling from the overlap distributions 50 times, calculating 807 the mean of the number of synaptic inputs from each cell type, and choosing the sample that was closest to this mean, we estimated that the L5PT model receives a total of 24,161 ± 785 synaptic inputs. Of 808 809 those, ~90% are predicted to originate from excitatory IC and TC neurons, which corresponds to an average density of 1.4 glutamatergic and 0.14 GABAergic synapses per um dendrite, respectively (i.e., 810 811 148 ± 18 GABAergic synapses are located on the soma).

812

813 Synapse models: Conductance-based synapses were modeled with a double-exponential time course. 814 Excitatory synapses contained both AMPA receptors (AMPARs) and NMDARs. Inhibitory synapses 815 contained GABA_ARs. The reversal potential of AMPARs and NMDARs was set to 0 mV, that of GABA_ARs to -75 mV. Rise and decay time constants of AMPARs were set to 0.1 ms and 2 ms, respectively ⁵⁷; those 816 of NMDARs to 2 ms and 26 ms, respectively ⁵⁷; and those of GABA_ARs to 1 ms and 20 ms, respectively 817 ⁵⁸. The Mg-block of NMDARs was modeled by multiplying the conductance value with an additional 818 voltage-dependent factor $1/(1 + \eta \cdot exp(-\gamma \cdot V))^{59}$, where $\eta = 0.25$, $\gamma = 0.08/mV$, and V is the membrane 819 potential in mV⁶⁰. The peak conductance at excitatory synapses from different presynaptic cell types was 820

821 determined by assigning the same peak conductance to all synapses of the same cell type, activating all 822 connections of the same cell type (i.e., all synapses originating from the same presynaptic neurons) one 823 at a time, and comparing parameters of the resulting unitary postsynaptic potential (uPSP) amplitude 824 distribution (mean, median and maximum) for a fixed peak conductance with experimental 825 measurements *in vitro* (input from L2-6⁶¹) or *in vivo* (TC input ⁷). The peak conductance for synaptic 826 inputs from each cell type was systematically varied until the squared differences between the parameters 827 of the *in silico* and *in vitro/in vivo* uPSP amplitude distributions were minimized (**Table S4**). The peak conductance at inhibitory synapses was fixed at 1 nS³⁵. Release probability at excitatory and inhibitory 828 829 synapses was fixed at 0.6 and 0.25, respectively ^{35, 62}.

830

Synaptic input patterns: Synaptic input patterns to the L5PT model were estimated as follows: All 831 832 presynaptic neurons determined during the network-embedding procedure were converted into point 833 neurons that could emit APs. During periods of ongoing activity, APs in presynaptic neurons were modeled as Poisson trains with cell type-specific mean firing rates as measured *in vivo*¹³. The mean 834 firing rate of INs was set to 7 Hz³⁵ (except for L1 INs⁵⁶). Each AP in a presynaptic neuron is registered 835 836 at all synapses between the presynaptic neuron and the L5PT model without delay and may cause a 837 conductance change, depending on the release probability of the synapse. After a stimulus (i.e., 838 deflection of the PW, SW or MW), each presynaptic neuron can emit additional spikes. The location of 839 the deflected whisker in the wRF of the presynaptic neuron is determined based on the barrel column 840 where the soma of the presynaptic neuron is located in (i.e., a convolution operation), and the 841 corresponding whisker-specific post-stimulus time histogram (PSTH) is used to stochastically generate additional sensory-evoked APs. Whisker-specific PSTHs of excitatory cell types were generated based 842 on *in vivo* wRF measurements (Fig. S3). The amplitude of the PSTH of excitatory IC cell types is further 843 scaled by a factor of 0.4571 to reflect lower response probabilities of cortical neurons in the up-state ⁶³. 844 845 The whisker-specific PSTHs of TC neurons in VPM were constructed based on previously published in vivo measurements, where single- and multi-whisker responsive neurons were described for the same 846 847 experimental conditions used in this study ²³. Single- and multi-whisker responsive VPM neurons were grouped into a single TC PSTH. The whisker-specific PSTHs of INs in wS1 were constructed based on 848 849 previously published in vivo measurements, which were acquired under the same experimental conditions that were used here ^{26, 64}, and which can be summarized as follows: (1) the onset times of 850 851 whisker-evoked APs in INs across all layers should be similar to those of the excitatory cell types; (2) in 852 case of PW touch, AP onset times in INs should precede those of the excitatory IC, but not TC cell types: 853 (3) INs have broad wRFs. To capture these empirical constraints, the PW/SW-evoked PSTHs of INs were 854 set to the respective maximum values across all excitatory cell types in each 1 ms time bin; the resultant

PW-evoked PSTH was shifted by -1 ms (but no spiking before TC neurons; i.e., > 8 ms); and the ratio 855 856 between the integrals of the PW- and SW-evoked PSTHs during 0-50 ms was set to a fixed ratio of 2:1. 857 These constraints leave one free parameter for constructing the PSTHs of INs: the total number of PW-858 evoked APs during 0-50 ms post stimulus. We simulated the response of the L5PT model after PW 859 deflections while systematically varying this parameter, and computed the resulting number of APs during 0-25 ms, until the L5PT model exhibited simulation trials with and without AP responses as measured in 860 vivo. This yielded a value for INs of 1.0 APs per PW deflection per 50 ms. In silico pharmacology 861 862 experiments were performed by removing all synaptic inputs from specific presynaptic populations from 863 the model as shown in Fig. 5D.

864

865 Simulations: We generated 200 samples of structurally- and functionally-plausible cellular stimulus 866 representations for each of the nine L5PT model locations (i.e., 1,800 samples per whisker), and for each simulated whisker deflection in the control condition (i.e., the complete network model), and for three 867 868 different in silico pharmacology experiments. Since the L5PT model was located in the C2 column, simulated C2 deflections were assigned as PW deflections, those of the eight adjacent whiskers as SW 869 870 deflections, and simulated E2 deflections as MW deflections. The three different in silico pharmacology 871 conditions were as follows: (1) synapses from border stratum (L5/6BS) cells whose somata were located 872 within the E2 column or the surrounding septum were removed from the L5PT model; (2) synapses from 873 neurons of all excitatory cell types whose somata where located within the E2 column. except for L5/6BS 874 cells, were removed; (3) synapses from all L5/6BS cells throughout wS1 were removed. All combinations 875 of L5PT model location, identity of the deflected whisker, and pharmacology condition resulted in 72,000 876 spatiotemporal synaptic input patterns, which we associate with different trials. For each trial, we 877 numerically simulated the integration of the respective conductance changes within all dendritic compartments (and the soma and axon) of the HH-type L5PT model. Each simulation trial consisted of 878 879 245 ms ongoing activity, followed by 50 ms of sensory-evoked activity. The first 100 ms and the last 25 ms of simulated activity were discarded. AP times were determined from zero-crossings of the simulated 880 881 membrane potential at the soma. For each of the simulation trials (control condition) we created a 100-882 dimensional vector, which quantified the spatiotemporal features of the respective synaptic input patterns 883 that impinge onto the L5PT model. Entries of the vector represented all active synapses during the period of 0-25 ms post stimulus, their respective path length distances to the soma, times of activation with 1 884 ms resolution, and whether the synapses originated from excitatory or inhibitory neurons. The input 885 886 vectors were sorted into two groups, representing simulations in which onset APs (i.e., during the period 887 of 8-25 ms post stimulus) did or did not occur. A principal component analysis (PCA) of these 888 spatiotemporal input vectors revealed that trials with vs. without onset APs formed overlapping, but

systematically different distributions. PC1 discriminated between these distributions. 92% of PC1 could be 889 890 accounted for by the difference between excitatory and inhibitory inputs that are active during a period of 891 8-16 ms post stimulus, and that are located within less than 500 µm path length distance to the soma 892 (here referred to as proximal inputs). We defined a single quantity that represents PC_1 – synchronous 893 proximal drive (SPD) – i.e., it reflects the net input (i.e., number of active excitatory minus active inhibitory synapses) along the proximal dendritic compartments of the L5PT model (i.e., path length distance <500 894 895 µm) within 8-16 ms. We then calculated the probability of observing a whisker-evoked AP response in 896 the L5PT model as a function of SPD, and fitted a sigmoidal curve to this distribution. The inverse width 897 (or slope) of the fitted sigmoidal curve can be interpreted as a measure for the predictive power of SPD 898 for AP responses. We systematically varied the end time point of the integration time window to determine 899 the SPD window with highest predictive power, which matched closely with the SPD window determined 900 for PW deflections by the PCA. These SPD windows were then used to compute the AUROC values for 901 PW and SW deflections reported in the main text. Breaking down SPD into its two parameter, (1) the 902 number of active excitatory synapses along the proximal dendrites, and (2) their respective synchrony (i.e., time window in which they are active), we performed additional simulations of the L5PT model. To 903 904 do so, the structurally and functionally constrained PW/SW-evoked spatiotemporal synaptic input 905 patterns were replaced as follows. All other model parameters (i.e., biophysical and synapse models), as 906 well as synaptic input patterns preceding the stimulus remained unchanged. First, the distribution of 907 stimulus evoked synaptic inputs along the dendrites of L5PT model was determined by calculating the 908 average distribution of active synapses during 50 ms following PW and SW simulation trials (i.e., from 909 the structurally and functional constrained trails). Second, the resultant 3D distributions of active 910 excitatory and inhibitory synapses were converted into distance-dependent probability distributions (i.e., 1D) with 50 µm (i.e., path length) resolution. Third, the subcellular distributions, temporal activation 911 patterns and numbers of active synapses (i.e., excitatory/inhibitory during periods of ongoing activity; 912 913 inhibitory during periods of whisker-evoked activity) were then determined by calculating the respective averages across PW and SW simulation trials (i.e., from the structurally and functional constrained trails), 914 915 respectively. Fourth, the temporal distribution of active excitatory synapses was modeled as a log-normal 916 distribution ¹⁰ with a fixed offset of 8 ms post-stimulus (i.e., corresponding to the onset latency of VPM 917 input) and a fixed peak time of 9 ms post-stimulus. Fifth, the only remaining parameter was the median timing of the log-normal distribution. Varying this parameter in 1 ms steps resulted in excitatory synaptic 918 919 input distributions that ranged from highly synchronous (2 ms; i.e., median timing at 10 ms post stimulus) 920 toward asynchronous (i.e., median timing much later than 10 ms post stimulus). Sixth, at the same time, 921 the total number of active excitatory synaptic inputs was systematically varied. Seventh, for each 922 combination of the number and synchrony of stimulus evoked excitatory inputs, 200 samples of 923 spatiotemporal synaptic input patterns were generated and simulated as described above. Then, the 924 probability of an onset AP (i.e., between 8-16 ms) was calculated for each combination of the number 925 and synchrony of stimulus evoked excitatory inputs. Iso-AP probability contour plots were calculated by 926 arranging all synaptic input number and synchrony combinations in a 2D grid, and linear interpolation 927 between the grid points. The corresponding in vivo data of cell type-specific numbers and synchronies of 928 active proximal inputs were derived from the structural and functional simulation constraints of PW, SW 929 and MW deflections (i.e., representing our in vivo measurements (Fig. S3) and reconstructions of the 930 network model (Fig. S5)).

931

Statistical analysis: All data are reported as mean ± standard deviation unless mentioned otherwise.
 Normality was not assumed when performing statistical testing. All tests were performed using the R
 software package (version 3.4.3) and the scipy python package (version 1.0.1).

935

Data availability: All relevant data are available from the authors. The model and simulation routines,
including a detailed documentation of all parameters and the analysis routines can be obtained from
ModelDB (<u>http://senselab.med.yale.edu/ModelDB/</u>; accession number: 239145; password: Horizontal).

31

939 Supplementary Materials for:

- 940 Thalamus drives two complementary input strata of the neocortex in parallel
- 941
- 942 R. Egger¹†‡, R.T. Narayanan¹†, D. Udvary¹, A. Bast¹, J.M. Guest¹, S. Das², C.P.J. de Kock², M.
- 943 Oberlaender^{1*}
- 944

¹Max Planck Group: In Silico Brain Sciences, Center of Advanced European Studies and Research,
 Bonn, Germany; ²Department of Integrative Neurophysiology, Center for Neurogenomics and Cognitive

- 947 Research, VU Amsterdam, The Netherlands.
- 948
- 949 *Correspondence to: <u>marcel.oberlaender@caesar.de;</u>
- 950 †These authors contributed equally.
- 951 ‡Current address: Neuroscience Institute, NYU School of Medicine, New York, USA.
- 952

953	The Supplement includes:	Figures S1 to S6
954		Tables S1 to S4
955		Movie S1

32

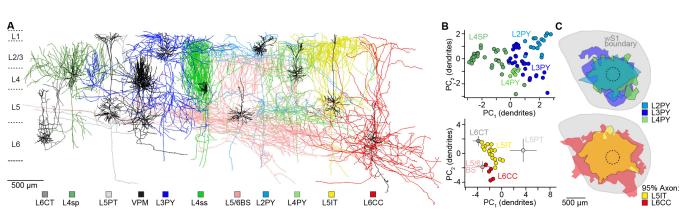
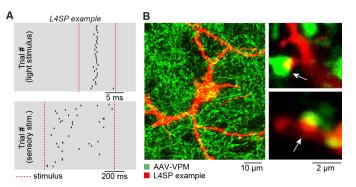


Figure S1: Cell type-specific structural constrains for in silico experiments. A) Gallery of exemplary 957 in vivo labeled neuron morphologies for each of the 10 major excitatory cell types of the neocortex, whose 958 959 soma, dendrite and axon distributions (ICs, n=177) were compared with the laminar distribution of thalamocortical axons from the ventral posterior medial nucleus (VPM, n=14). Neurons were classified 960 961 as reported previously ¹² into pyramidal neurons in layer 2 (L2PY, n=16), layer 3 (L3PY, n=30) and layer 962 4 (L4PY, n=7), spiny stellates (L4ss, n=22) and star-pyramids in layer 4 (L4sp, n=15), slender-tufted intratelencephalic (L5IT, n=18) and thick-tufted pyramidal tract neurons in layer 5 (L5PT, n=37), 963 964 corticothalamic (L6CT, n=13) and polymorphic corticocortical neurons in layer 6 (L6CC, n=5), and corticocortical neurons at the layer 5/6 border (L5/6BS, n= 14). L4ss and L4sp neurons were grouped as 965 966 layer 4 spiny neurons (L4SP). B) Principal components ($PC_{1/2}$) of dendritic features that discriminate 967 between excitatory cell types in the upper and deep layers, respectively. The means and STDs of L5/6BS, L5PT and L6CT neurons from Fig. 1C are shown for comparison. D) Horizontal axon extent of L2PY 968 (n=9), L3PY (n=15), L4PY (n=4), L5IT (n=5) and L6CC (n=4) neurons. 969

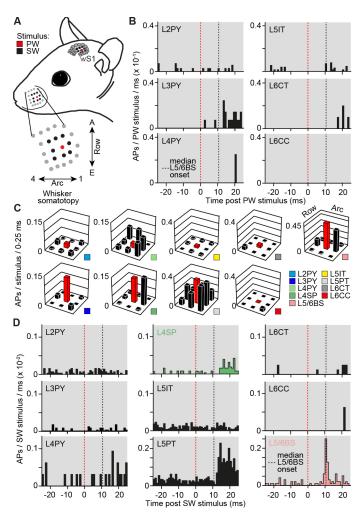
970

956



971

Figure S2: Thalamocortical input to L4SP cells. A) Example of cell-attached *in vivo* recording in layer 4 of wS1 of AAV-injected brain. Ticks represent APs in response to a 10 ms flash of green light onto the cortical surface (top), and a 700 ms airpuff onto the whiskers (bottom). B) Confocal images of the neuron shown in panel A. The neuron was morphologically identified as L4SP. Putative thalamocortical synapses were identified as contacts between VPM boutons and dendritic spines.



977

Figure S3: Cell type-specific functional constrains for in silico experiments. A) Illustration of cell 978 type-specific mapping of whisker receptive fields (wRFs) as reported previously ¹⁰ (i.e., under conditions 979 that were consistent with those of the pharmacological manipulations). Action potentials (APs) were 980 981 recorded in responses to deflections of the principal whisker (PW), and of the eight whiskers that are 982 adjacent to the PW (here referred to as SWs). B) PSTHs of PW-evoked APs for morphologically classified 983 L2PY (n=7), L3PY (n=7), L4PY (n=2), L5IT (n=13), L6CT (n=5) and L6CC (n=1) neurons, analogous to 984 those shown in Fig. 3C for L4SP, L5PT and L5/6BS neurons. C) Cell type-specific wRFs representing the cells in panels B and D. D) PSTHs of SW-evoked APs for all cell types (i.e., averaged across the 985 986 adjacent whiskers), representing the cells shown in panels B and C, and Fig. 3C.

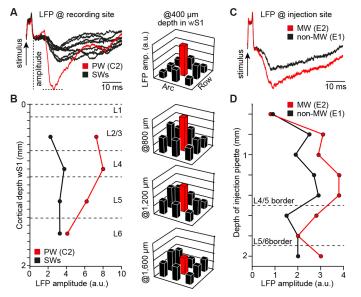
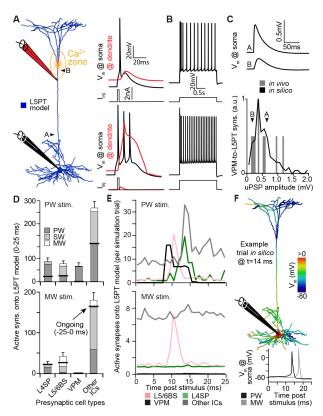


Figure S4: LFP guided in vivo pharmacology. A) Left panel: LFP recordings via search pipette at 400 988 um depth in wS1. LFP amplitudes in response to deflections of the PW and its eight SWs were quantified. 989 Right panel: LFP wRF reveals the PW at the recording site ²⁴ (here: C2). **B.** LFP wRF measurements 990 were repeated at different cortical depths of wS1. Using the depth of layer borders ¹¹, the characteristic 991 992 laminar profiles of LFP responses to PW (and SW) stimuli were used to identify the border between layer 993 4 and 5 (i.e., ~100 µm below the LFP maximum). The target location at the L5/6 border was hence approximately 400-500 µm below the LFP maximum. C-D). Example experiment that illustrates how the 994 995 LFP depth profile was used to locate the L5/6 border of the barrel column representing the MW whisker (i.e., E2). The muscimol injection pipette was inserted rostral to wS1 at an angle that was approximately 996 997 parallel to the midline (i.e., oblique to the vertical axis of wS1). E2 was identified as the MW based on the larger LFP amplitudes across the cortical depth when compared to those evoked by SW stimuli (shown 998 here: E1). The target location (i.e., L5/6 border) was then determined by identifying the depth of maximal 999 LFP amplitude and adding 500 µm (i.e., here injection at ~1850 µm depth). 1000



1001

Figure S5: Intrinsic physiological and synaptic constrains for in silico experiments. A) Left panel: 1002 1003 L5PT neuron model, consisting of 1033 dendritic compartments with previously reported biophysical models ²⁷. The parameters of the biophysical models were tuned until numerical simulations reproduced 1004 current injection-evoked responses that are characteristic for L5PT neurons (right panels): (1) a brief 1005 current injection into the soma triggers an AP that back-propagates into the apical dendrite (bAP), and 1006 (2) a brief current injection into the soma, followed by current injection into a Ca²⁺ channel dense region 1007 around the first bifurcation point of the apical tuft, triggers somatic bursts (i.e., BAC firing). B) The model 1008 supported regular AP firing of increasing frequencies in response to sustained current injections of 1009 increasing amplitude. C) The peak conductance at excitatory synapses from different presynaptic cell 1010 1011 types was optimized to match empirical unitary post-synaptic-potential (uPSP) amplitude distributions (here exemplified for VPM-to-L5PT synapses 7). D) The neuron model was embedded into an 1012 1013 anatomically realistic network model of rat wS1 and VPM. Based on cell type-specific axo-dendritic overlap (using the morphologies shown in Fig. 1 and Fig. S1) and wRF measurements (Fig 3 and Fig. 1014 1015 **S3**), plausible synaptic input patterns to the L5PT neuron model were generate for deflections of different 1016 whiskers. The number (mean ± STD across simulation trials) of active synapses that impinge onto the 1017 neuron model during the first 25 ms after simulations of PW and MW deflections are shown. Horizontal 1018 black lines denote the number of active synapses that each cell type contributes also to 25 ms of ongoing 1019 activity (i.e., before the stimulus). Different grey shadings denote the location of the presynaptic neurons

(i.e., somatotopically aligned with the PW, SW or MW). E) The number (mean across simulation trials) of
 active synapses that impinge onto the neuron model during each millisecond of the first 25 ms after
 simulations of PW and MW deflections, respectively. Other ICs represent inputs from all excitatory
 intracortical cell types, except for the border stratum cells. F) Exemplary simulation trial for synaptic input
 patterns as shown in panels D and E, which are integrated by the dendrites of the L5PT neuron model
 (upper panel) and transformed into somatic APs (lower panel).

1026

1027

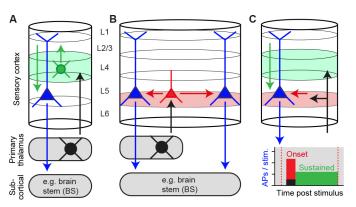


Figure S6: Suggested concept of primary sensory cortex. Sensory-evoked thalamocortical input is 1028 relayed in parallel by two orthogonally organized thalamorecipient populations which give rise to 1029 complementary canonical pathways: vertical to layers 2/3 by L4SP neurons (A), and horizontally to layers 1030 1031 5/6 by L5/6BS cells (B). The deep thalamorecipient pathway activates pyramidal tract neurons, whereas signal flow in the upper layers terminates in layer 5. The complementary pathway theory hence provides 1032 1033 a potential explanation for sustained AP responses in pyramidal tract neurons that persist for the duration of the stimulus. We showed that one way to drive cortical output is by providing sufficiently strong and 1034 1035 synchronous synaptic input to the proximal dendrites. However, synchrony decreases during recurrent 1036 excitation within local and long-range cortical circuits. Moreover, a substantial fraction of these recurrent and top-down inputs will impinge onto distal dendrites (e.g. within L1). It is hence unlikely that sustained 1037 responses in pyramidal tract neurons originate from the same mechanism as the onset responses (see 1038 also ¹⁴). We thus hypothesize that the L5/6BS cell-driven onset responses are required to switch the 1039 1040 apical dendrites into an active state, which allows pyramidal tract neurons to transform temporally less synchronous and spatially more distributed synaptic inputs (e.g. from layers 2/3) into sustained patterns. 1041

1042

Parameter	Soma	AIS / Myelin	Apical dendrite	Basal dendrites
C _m (µF/cm ²)	1.0	1.0 / 0.04	2.0	2.0
r _a (Ωcm)	100	100 / 100	100	100
g _{pas} (1/r _m)	0.326	0.256 / 0.4	0.882	0.631
Nat	24300	880 /	252	-
Na _p	49.9	14.6 / —	-	-

Kt	471	841 /	-	_	
K _p	0	7730 /	_	_	
SKv3.1	9830	9580 /	112	_	
SK E2	492	0.577 /	34	_	
Ca _{LVA}	46.2	85.8 /	1040*	_	
Саниа	6.42	6.92 /	45.2*	· 	
т _{Ca} (ms)	770	507 /	133	_	
γ _{Ca} (1)	0.000616	0.0175 /	0.0005	-	
Im	-	_/_	1.79	_	
l _h	0.8	0.8 /	A+B·exp(C·d/d _{max}) **	2	
					1064

Table S1. Biophysical parameters of the L5PT model. These parameters were obtained using the multi-1065 objective optimization algorithm described previously ^{27, 51}. Units for different ion channel densities are 1066 $pS/\mu m^2$. τ_{Ca} (ms) is the time constant of the calcium buffering model, and γ_{Ca} is a dimensionless parameter 1067 describing the calcium buffer affinity. gpas: passive membrane conductance; Nat: fast inactivating sodium 1068 current; Nap: persistent sodium current; Kt: fast inactivating potassium current; Kp: slow inactivating 1069 potassium current; SKv3.1: fast non-inactivating potassium current; SK E2: calcium-activated potassium 1070 current; Ca_{LVA}: low voltage-activated calcium current; Ca_{HVA}: high voltage-activated calcium current; I_m: 1071 muscarinic potassium current; In: non-specific cation current. * Density in the calcium "hot zone" between 1072 900-1100 µm from the soma. The density of low- and high-voltage activated calcium channels in the 1073 apical dendrite was set to 1% and 10% of that value, respectively, outside of the "hot zone". ** The density 1074 of I_h in the apical dendrite increases exponentially with distance d to the soma, with parameters A = -1075

1076 $0.8696 \text{ pS/}\mu\text{m}^2$, B = 2.087pS/ μm^2 , C=3.6161, and d_{max} the distance of the apical dendrite top located the 1077 furthest from the soma. Voltage- and time-dependence of ion channels was modeled using the HH 1078 formalism. All corresponding parameters were taken from the literature and have been described in detail 1079 previously ²⁷.

Feature	Mean ± STD	Model	Difference (STD)
Ca ²⁺ AP peak	6.73 ± 2.54mV	10.8mV	1.6
Ca ²⁺ AP width	37.43 ± 1.27ms	36.5ms	0.7
BAC AP count	3 ± 0	3	0
Mean somatic AP ISI	9.9 ± 0.85ms	9.4ms	0.6
Somatic AHP depth	−65 ± 4mV	-66mV	0.3
Somatic AP peak	25 ± 5mV	34mV	1.8
Somatic AP half-width	2 ± 0.5ms	1.6ms	0.8
AP count (somatic current injection only)	1 ± 0	1	0
bAP amplitude at 835µm from the soma	45 ± 10mV	14mV	3.1
bAP amplitude at 1015µm from the soma	36 ± 9.33mV	9mV	2.9

Table S2. Features of membrane potential used to constrain the intrinsic physiology of the L5PT model.
Empirical features were adapted as reported previously ²⁷. ISI: inter-spike interval; AHP: afterhyperpolarization. Model features based on optimized parameters (see **Table S1**). Difference between
model features and average experimental features given in units of STD of the experimental features.
The recording locations for the bAP amplitude were adjusted to account for a longer apical trunk of the
present L5PT morphology.

Presynaptic cell type	Measurement (Reference)	Network model (L5PT population)	Network model (L5PT model)
L2PY	0.08 65	0.06 ± 0.09*	0.13 ± 0.02
L3PY	0.12/0.55 65, 66	0.14 ± 0.16*	0.34 ± 0.02
L4 (SP, PY)	0.08 65	0.14 ± 0.16*	0.33 ± 0.04
L5IT	0.19 ⁶⁷	0.18 ± 0.13*	0.19 ± 0.05
L5PT	0.05-0.2 67, 68, 69	0.23 ± 0.18*	0.24 ± 0.06
L6 (BS, CT)	0.02 65	0.14 ± 0.15*	0.15 ± 0.02
VPM	0.44 ± 0.17 ⁷	0.40 ± 0.12	0.39 ± 0.05
IN	0.22 70	0.41 ± 0.14	0.26 ± 0.02

Table S3. Comparison between predicted connection probabilities in wS1 network model and previously reported measurements from paired-recordings *in vitro* or *in vivo*. The * denotes predicted connection probabilities between truncated morphologies in 300 µm wide thalamocortical/semi-coronal slices of network model.

41

Cell type	uPSP Mean (mV)	uPSP Median	(mV) uPSP Max.	(mV) Conductance per
	(exp. / fit)	(exp. / fit)	(exp. / fit)	synapse (nS)
L2PY	0.49 / 0.43	0.35 / 0.37	1.90 / 2.50	1.47
L3PY	0.49 / 0.44	0.35 / 0.39	1.90 / 1.98	1.68
L4 (SP, PY)	0.35 / 0.35	0.33 / 0.30	1.00 / 1.41	1.14
L5IT	0.47 / 0.40	0.33 / 0.35	1.25 / 1.70	1.38
L5PT	0.46 / 0.43	0.36 / 0.39	1.50 / 1.46	1.59
L6 (BS, CC)	0.44 / 0.42	0.31 / 0.40	1.80 / 1.26	1.63
L6CT	0.44 / 0.39	0.31 / 0.36	1.80 / 1.73	1.80
VPM	0.571 / 0.51	0.463 / 0.44	1.18 / 1.80	1.78

1121 **Table S4.** Features of uPSP distributions of L5PTs for synaptic input from each presynaptic excitatory

1122 cell type, and the respectively fitted synaptic conductance values. Empirical values for uPSP amplitude

- distributions of synapses from IC cell types ⁶¹ and VPM thalamus ⁷ were adapted as reported previously.
- 1124

1125 https://www.dropbox.com/s/tg2kl837homq4dp/V11.mp4?dl=0

1126 **Movie S1:** Examples of *in silico* pharmacology experiments.