# An uncertainty principle underlying the pinwheel structure in the primary visual cortex

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## 1 Introduction

The visual information in V1 is processed by an array of modules called orientation preference columns [1]. In some species including humans, orientation columns are radially arranged around singular points like the spokes of a wheel, that are called pinwheels. The pinwheel structure has been observed first with optical imaging techniques [2] and more recently by in vivo two-photon imaging proving their organization with single cell precision [3]. Many hypotheses of morphogenesis of pinwheels during visual development have been proposed e.g. [4][5] and many reviewed in [6][7], but at the present the problem is still open [8]. In this research we do not intend to propose another model of pinwheel formation, but instead provide evidence that pinwheels are de facto optimal distributions for coding at the best angular position and momentum. In the last years many authors have recognized that the functional architecture of V1 is locally invariant with respect to the symmetry group of rotations and translations SE(2) [9][10][11][12][13][14][15]. In the present study we show that the orientation cortical maps measured in [2] to construct pinwheels, can be modeled as coherent states, i.e. the geometric configurations best localized both in angular position and momentum. The theory we adopt is based on the well known uncertainty principle, first proved by Heisenberg in quantum mechanics [16], and later extended to many other groups of invariance [17][18][19]. This classical principle states an uncertainty between the two noncommutative quantities of linear position and linear momentum and it has been adopted in [20] to model receptive profiles of simple cells as minimizers defined on the retinal plane. Here we state a corresponding principle in the cortical geometry with SE(2) symmetry based on the uncertainty between the two noncommutative quantities of angular position and angular momentum. By computing its minimizers we obtain a model of orientation activity maps in the cortex. As it is well known the pinwheels configuration is directly constructed from these activity maps [2], and we will be able to formally reproduce and justify their structure, starting from the group symmetries of the functional architecture of the visual cortex. The primary visual cortex is then modeled as an integrated system in which the set of simple cells implements the SE(2) group, the horizontal connectivity implements its Lie algebra and the pinwheels implement its minimal uncertainty states.

## 2 The functional architecture of V1

### 2.1 Simple cells as elements of a phase space

Receptive fields of simple cells of the area V1 are classically represented as Gabor-like filters able to accomplish an analysis both in space and frequency [20][21][22]. Each filter is identified by four parameters

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 $(q_1, q_2, |p|, \theta)$  where  $q = (q_1, q_2)$  are coordinates in the 2D cortical layer C, |p| and  $\theta$  are the engrafted variables in the sense of Hubel [23]. The coordinate |p| codes the modulus of frequency and  $\theta$  the orientation preference, so that they can be interpreted as a choice of polar coordinates in the frequency variables. Since the variables of position and frequency are constitutive of the phase space, the set of simple cells is classically labeled by parameters of a 4D phase space which represents the cotangent space  $T^*(C)$  of the 2D cortical layer. We also explicitly note that Gabor filters are complex valued, so that the cortical signals related to this cells are also complex.

#### **2.2** Horizontal connectivity and integral curves in SE(2)

Simple cells are connected by means of the horizontal connectivity with its typical anisotropic pattern described in detail in a number of experiments (e.g. [25]). It has been shown that the functional architecture of cortico-cortical connections among simple cells strongly depends on position and orientation preference, while it presents a weaker dependence on the frequency. Indeed, while studying the connectivity, very often in literature only the three parameters  $(q_1, q_2, \theta)$  are considered, while the modulus of frequency |p| is discarded [9][12][10][15]. Moreover, the functional architecture is invariant for change of polarity of simple cells so that the variable  $\theta$  is defined on  $[0, \pi) = P^1$ , instead of  $[0, 2\pi)$ . Hence the polar coordinates will be expressed as  $(p_1, p_2) = |p|(-\sin(2\theta), \cos(2\theta))$ . These parameters are the coordinates of the reduced cotangent space  $T_R^*(C)$  which can be identified with the elements of the group SE(2) of translations and rotations of  $\mathbb{R}^2$ , representing the group of symmetries of the functional architecture of V1.

The group acts on a vector  $(x_1, x_2, \varphi)$  applied in the origin by rotating it of an angle  $\theta$  and by translating its application point of  $(q_1, q_2)$ :

$$(x_1, x_2) \longmapsto L_{(q_1, q_2, \theta)}(x_1, x_2) = r_{2\theta} \binom{x_1}{x_2} + \binom{q_1}{q_2} \text{ and } \varphi \longmapsto (\varphi - \theta)$$
(1)

where

$$r_{2\theta} = \begin{pmatrix} \cos(2\theta) & -\sin(2\theta) \\ \sin(2\theta) & \cos(2\theta) \end{pmatrix}.$$

In particular  $L_{(q_1,q_2,\theta)}$  is the 2D projection of the group action.

The tangent space of SE(2) has dimension three and it is generated by the infinitesimal transformations along two orthogonal translations and the rotation of the group. However, in order to take into account the anisotropy of the connectivity, in [12] and [26] just two generators instead of three were considered. In particular in [12] it was proposed to choose as generators the differential operators  $X_1$  and  $X_2$  representing only one infinitesimal translation and the infinitesimal rotation. Projecting them on the 2D cortical layer through the local action L defined in (1) we obtain

$$X_1 f(x_1, x_2) = \left. \frac{d}{dq_1} \right|_0 f(L_{(q_1, 0, 0)}(x_1, x_2)) = \partial_{x_1} f(x_1, x_2)$$

and

$$X_2 f(x_1, x_2) = \left. \frac{d}{d\theta} \right|_0 f(L_{(0,0,\theta)}(x_1, x_2)) = (x_1 \partial_{x_2} - x_2 \partial_{x_1}) f(x_1, x_2).$$

These derivations are left invariant with respect to the action L and are simply the directional derivatives in the direction respectively  $\vec{X}_1 = (1,0)^T$  and  $\vec{X}_2 = (x_2, -x_1)^T$ . The horizontal connectivity is then modeled as the set of integral curves  $\gamma(s) = (x_1(s), x_2(s))$  of the vector fields  $\vec{X}_1 + k\vec{X}_2$  having starting point at the origin of the local coordinates and varying the parameter k in  $\mathbb{R}$  (see Fig. 1(b)):

$$\gamma'(s) = (\vec{X}_1 + k\vec{X}_2)(\gamma(s)), \ \gamma(0) = 0.$$

Computing the left invariant derivatives at the point 0 amounts to choose local coordinates around a fixed point. This is why the fan is centered in the origin and oriented along the  $x_1$ -axis in local coordinates.



Figure 1: Functional architecture of V1. (a) Set of receptive profiles of simple cells with constant frequency modulus |p| as elements of the rotation translation group indexed by the triple  $g = (q_1, q_2, \theta)$ . The parameters  $(q_1, q_2)$  code the cell position in the cortical layer and  $\theta$  is the engrafted variable of orientation preference. The entire set of  $(q_1, q_2, \theta)$  constitutes the reduced phase space where the frequency modulus |p|is missed. (b) A fan of integral curves of the vector fields  $X_1 + kX_2$  by varying the parameter k (left). The curves model the connectivity between cells on the cortical plane and are implemented by neural horizontal connectivity. The model is in good agreement with the association fields of Field, Hayes and Hess [24] (right). (c) The entire set of fan modeling the functional architecture is obtained by applying the group action to the fan (b).

However this choice is not restrictive, since we can always apply the action  $L_{(q_1,q_2,\theta)}(x_1(s), x_2(s))$ , and recover global coordinates, in which the fan has an arbitrary origin q and direction  $\theta$ . Hence, in the sequel, we will always make this choice of local coordinates.

The cortical activity  $f = f(x_1, x_2)$  defined on the 2D cortical layer is propagated along the horizontal long range connectivity, modeled by the  $\gamma$ -curves so that the gradient of the cortical activity will be computed as

directional derivative of f along the vector fields  $\vec{X}_1$  and  $\vec{X}_2$ .

#### 2.3 The operators in the reduced Fourier domain

The reduced phase space  $T_R^*(C)$  contains all the position variables  $(x_1, x_2)$ , but only the angular component  $\varphi \in P^1$  of the frequency variable. Hence in the Fourier space it supports only functions defined on a semicircle of radius  $\Omega$  fixed, and periodical of period  $\pi$  as depicted in Fig 2(a). The operators acting on these functions are the Fourier transforms of  $X_1$  and  $X_2$ :

$$\hat{X}_1 = -\Omega \sin(2\varphi), \quad \hat{X}_2 = i\partial_{\varphi}.$$
(2)

Let us note that the fields  $\hat{X}_1$  and  $\hat{X}_2$  correspond respectively to angular position and angular momentum of the  $\pi$  periodic quantum pendulum [16]. The parameter  $\Omega$  is specified by the physics of the problem and in our case it will express the reciprocal of the correlation length of pinwheels in accordance with [27].



Figure 2: (a)A general function  $\hat{u}(\varphi)$  in the reduced Fourier plane, where only a circle of radius  $\Omega$  is considered parametrized by the angular variable  $\varphi$ . The circle is a doubling of the vertical  $[0, \pi]$  segments in fig.1(a).  $\hat{u}(\varphi)$  is defined on this circle with period  $\pi$  and then its graph is repeated twice. The height of the graph represents  $|\hat{u}(\varphi)|$  and the color  $\arg(\hat{u}(\varphi))$ . (b) The noncommutativity of the group is visualized observing that the final point achieved by a translation  $X_1$  followed by a rotation  $X_2$  is different from the one constructed by a rotation followed by a translation.

### 3 An uncertainty principle on the functional geometry

#### 3.1 The noncommutativity of vector fields

While studying the relation between angular position and momentum, both in the real and Fourier plane, we have to take into account that the composition of a translation and a rotation is not commutative:

$$r_{2\theta} \begin{pmatrix} x_1 \\ x_2 \end{pmatrix} + \begin{pmatrix} q_1 \\ q_2 \end{pmatrix} \neq r_{2\theta} \left( \begin{pmatrix} x_1 \\ x_2 \end{pmatrix} + \begin{pmatrix} q_1 \\ q_2 \end{pmatrix} \right).$$

The difference for  $\theta$  sufficiently small is an increment in the direction orthogonal to q (see Fig. 2(b)). This property implies the non commutativity of left invariant derivatives  $X_1$  and  $X_2$ . In particular if we compute second mixed derivatives we have that  $X_2X_1f(x_1, x_2) \neq X_1X_2f(x_1, x_2)$ . We will call commutator of  $X_1$  and  $X_2$  the difference  $X_3f = X_2X_1f - X_1X_2f$ , which is a measure of the non commutativity of the space. The same property can be transferred in the transformed fields  $\hat{X}_1$  and  $\hat{X}_2$  whose commutator is

$$\hat{X}_3 = \frac{i}{2} \left( \hat{X}_2 \hat{X}_1 - \hat{X}_1 \hat{X}_2 \right) = \Omega \cos(2\varphi).$$

#### 3.2 The uncertainty principle

This noncommutative framework has important analogies with the canonical quantum mechanical case, in which the two non commuting operators are position and momentum. In that specific situation the variance of the position and momentum operators on functions have a lower bound that has been formalized in the well known Heisenberg uncertainty principle. This principle has been formally extended (see [17] and references therein) to general non commuting vector fields. Hence we can express here a similar uncertainty principle in terms of the vector fields  $\hat{X}_1$  and  $\hat{X}_2$ 

$$\Delta_{\hat{f}} \hat{X}_1 \, \Delta_{\hat{f}} \hat{X}_2 \ge \frac{1}{2} \left| < \hat{X}_3 >_{\hat{f}} \right|, \tag{3}$$

where  $\Delta_{\hat{f}}\hat{X}$  is the standard deviation of the operator  $\hat{X}$  and  $|\langle \hat{X} \rangle_{\hat{f}}|$  is the mean value of the operator  $\hat{X}$ when evaluated on the function  $\hat{f}$ . For  $|\langle \hat{X}_3 \rangle_{\hat{f}}|$  fixed we recognize that, if  $\hat{f}$  is concentrated in the Fourier domain so that its variance is small, then the variance of the angular momentum has to be high and viceversa. Note that the inequality expresses the uncertainty principle for the  $\pi$  periodic quantum pendulum between the two observable angular position and angular momentum. For  $\varphi \to 0$ , the fields  $\hat{X}_1$  and  $\hat{X}_2$  reduce to the classical position and momentum operators of the harmonic oscillator and the inequality expresses the well known Heisenberg uncertainty principle.

## 4 Coherent states as optimal localization in angular position and angular momentum

#### 4.1 Coherent states in the Fourier space

The minimizers of the uncertainty principle are called coherent states and correspond to the functions with the optimal localization in angular position and angular momentum. Let us first compute the reference minimal uncertainty "ground" state  $\hat{u}_0^{\Omega}(\varphi)$  by making use of the well-known equation (see [17])

$$\hat{X}_2 \hat{u}_0^\Omega(\varphi) = 2i\lambda \hat{X}_1 \hat{u}_0^\Omega(\varphi),\tag{4}$$

where the scaling parameter  $\lambda$  represents the frequency of the pendulum. Its solution can be analytically computed and, up to a normalization constant, is the ground state  $\hat{u}_0^{\Omega}(\varphi) = e^{\lambda \Omega \cos(2\varphi)}$ . The set of coherent states of SE(2) in the Fourier domain depends on the angular parameter  $\theta$  and is obtained as a displacement of the ground state  $\hat{u}_0(\varphi)$  of an angle  $\theta$ :

$$\hat{u}^{\Omega}_{\theta}(\varphi) = e^{\lambda\Omega\cos(2(\varphi-\theta))}.$$
(5)

Every coherent state represents the most concentrated function for optimal localization in angular position and momentum, both taken starting from the reference angle  $\theta$ . The function  $\hat{u}^{\Omega}_{\theta}(\varphi)$  is bell-shaped and centered around the angle  $\theta$  (see Fig. 3(a)). We note that the bigger is  $\lambda$ , the sharper is its localization. Indeed its standard deviation can be evaluated as  $\Delta \varphi \approx \frac{1}{2\sqrt{\Omega\lambda}}$  and its width reduces around  $\varphi = \theta$  as  $\Omega\lambda$ becomes big, leading to a delta  $\delta(2(\varphi - \theta))$  in the limit.

If  $\hat{u} = \delta(\varphi)$  then  $\sin(\varphi)\delta(\varphi) = 0$  and the variance of the angular position is null, meaning that it is maximally concentrated. Due to the uncertainty inequality  $\partial_{\theta}\delta(\varphi)$  has infinite variance i.e. it is maximally undetermined. On the other hand, if  $\hat{u}$  is constant, then  $\partial_{\theta}\hat{u} = 0$  and the angular momentum is maximally concentrated.

Up to now, the coherent states  $\hat{u}^{\Omega}_{\theta}(\varphi)$  have been computed using left invariant operators of the group SE(2) and hence imposing invariance on the domain of functions. Now we impose invariance also on the co-domain of  $\hat{u}^{\Omega}_{\theta}(\varphi)$  with respect to local phase rotation  $e^{i\alpha(\varphi)}$  so that each function  $\hat{u}^{\Omega}_{\theta}(\varphi)e^{i\alpha(\varphi)}$  is a coherent state. These states are solutions of the equation (4) where the operators  $\hat{X}_1$  and  $\hat{X}_2$  are expressed in terms of covariant derivatives instead of the usual derivatives. These coherent states, visualize in Fig 3(c) are invariant for any local change of coordinates in the domain and co-domain, modeling a system that does not require any knowledge of an external global reference system.

#### 4.2 Coherent states in the real plane

The Fourier anti-transform of the function  $\hat{u}^{\Omega}_{\theta}(\varphi)e^{i\alpha(\varphi)}$  defined on a circle of radius  $\Omega$  gives the expression  $u_{\theta}(x_1, x_2)$  of the coherent states in the real plane, providing the maps visualized in figure.



Figure 3: (a) A coherent state  $\hat{u}^{\Omega}_{\theta}(\varphi)$  in the reduced Fourier plane for a fixed value of  $\theta$  that is a real valued function minimizing the uncertainty principle (3). (b) (top) The standard deviation of the angular position  $\Delta_{\hat{u}_{\theta}} \hat{X}_1$  versus the one of angular momentum  $\Delta_{\hat{u}_{\theta}} \hat{X}_2$  for three different values of  $\lambda$ :  $\lambda \gg \lambda = \frac{1}{2\Omega}$ (left),  $\lambda = \frac{1}{2\Omega}$  (center),  $\lambda \ll \frac{1}{2\Omega}$  (right). For a better visualization the standard deviation is normalized  $\Delta_n X_i = \Delta_{\hat{f}} \hat{X}_i / |\langle \hat{X}_3 \rangle_{\hat{f}}|^{\frac{1}{2}}, i = 1, 2.$  (bottom) Coherent states in the real plane obtained by anti-transforming  $\hat{u}^{\Omega}_{\theta}(\varphi)$ . For  $\lambda \to +\infty$  the states u is maximally concentrated in the angular position (orientation) and it results  $u(x_1, x_2) = e^{i\Omega(-x_1\sin(2\theta) + x_2\cos(2\theta))}$  that is a pure harmonic function, whose level sets are rectilinear and globally oriented (left). Note that in this case the  $X_1$  derivative in global coordinates vanishes i.e.  $X_1u(x_1, x_2) = 0$ meaning that the angular momentum is maximally spread and the angular position is maximally localized. In the other case  $\lambda \to 0$  the state becomes a Bessel function  $u(x_1, x_2) = \int_0^{\pi} e^{i\Omega\sqrt{x_1^2 + x_2^2}\cos(2(\varphi - \theta))} d\varphi$  achieving the best concentration in angular momentum, since its level sets are circles with all the possible curvatures (right). Note that in this case  $X_2u(x_1, x_2) = 0$  meaning that the angular position is maximally spread and the angular momentum is maximally localized. For  $\lambda$  between the two limiting conditions the uncertainty are distributed between angular position and momentum achieving the equal distribution of uncertainty for  $\lambda = \frac{1}{2\Omega}$  (center). (c) A covariant coherent state  $\hat{u}^{\Omega}_{\theta}(\varphi)e^{i\alpha(\varphi)}$  in the reduced Fourier plane for a fixed value of  $\theta$ , solution of the equation (4) with covariant derivatives. The set of states is invariant with respect to local change of coordinates both in the domain and co-domain modeling a system that does not require any knowledge of an external global reference. The function is visualized with the same coding as in figure 2(a). (d) The Fourier anti-transform of a covariant coherent state (left) as model of a real activity map recorded by Bosking et Al [25] (right).

#### 4.3 From coherent states to pinwheels

In [2] the pinwheel structure of V1 has been reconstructed starting from a set of cortical activity maps acquired with optical imaging techniques in response to gratings with different orientations  $\theta$ . A color image has been obtained from gray valued activity maps, associating a color coding representation to preferred orientations [28]. Here we apply the same procedure to the set of coherent states (our model of activity maps), producing the pinwheel structure visualized at the center of Fig. 4.3.



Figure 4: Gray valued images visualize covariant coherent states on the 2D real plane by varying the angle  $\theta$ . The color image in the center has been constructed from gray valued maps, associating a color coding representation to preferred orientations, as in [2].

## 5 Qualitative and quantitative comparison with orientation cortical maps

The image show a qualitative impressive similarity with the original result obtained in [2] [29] [25] among many others. Moreover by computing the power spectrum of recorded pinwheels, following [27], a function defined on an annulus with radius  $\Omega$  is obtained, in complete accordance with the result predicted by the presented theory, built up on the basis of the geometry of the functional architecture. In our perspective the orientation activity maps are modeled by the coherent states, minimizing uncertainty introduced by functional geometry. Note that the coherent states are  $\pi$  periodic as the measured activity maps. To our knowledge in the existing models of pinwheels the activity maps are obtained a posteriori, while in our approach a geometric model of the activity maps is directly provided and the pinwheels are constructed as in the classical experiments.

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