

# Solving an X-ray structure of a bio-artificial neurotransmitter receptor designed for the naked-eye recognition of dopamine

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**Abstract** The literature is constellated with a wide variety of chemosensors against a plethora of analytes. [1, 2, 3, 4, 5, 6, 7, 8, 9, 10] This seminal library is used to inspire chemists to improve them using chemical synthesis. However, their optimization via chemical synthesis is a difficult task which takes time without the guarantee of final success. [11] We show here that combinatorial chemistry [12], the use of first and second coordination spheres and the displacement of indicators united within a protein cavity [13] offers an easy-to-assemble colorimetric bio-chemical sensor. It consists only of commercial chemicals. This colorimetric sensor is highly modular, cheap and evolvable. Its X-ray structure reveals the composition of its active site. This allows to design it rationally for the recognition of dopamine with the naked eye. Our bio-sensor therefore resembles a biological receptor for the recognition of neurotransmitters. Its immediate high adaptability and ability to be evolved can be useful for the selective detection of a wide variety of analytes going from small molecules to microorganisms. This discovery therefore makes it possible to dream of new biotechnological or new immunotherapeutic applications. [14, 15, 16, 17, 18, 19, 20, 21, 22]

## 1 Introduction

The literature abounds with descriptions of chemo-sensors for the detection of a wide variety of analytes. [1, 2, 3, 4, 5, 6, 7, 23] In particular be made of: cyclophanes [24], crown ethers [25, 26], cryptands [27], cavitands [28, 29], calix[n]arenes [30], calix[n]pyrroles [31], cucurbit[n]uril [32], cyclodextrines [33, 34], pinwheels [35, 36], dendrimers [37] or MOFS [38]. All these sensors take advantage of the first coordination sphere to capture analytes. None of them are easily optimized. Each requires synthesis steps that take time, are tedious and do not guarantee success. Based on this, by observing Nature more closely, we realize that bio-receptors such as membrane receptors [39, 40] are perfectly designed for the recognition of analytes. [40] Mention may in particular be made of membrane receptors for the recognition of neurotransmitters, for example dopaminergic receptors. [40, 41]

These optimized receptors [42, 43] take advantage of the second coordination sphere given by a protein environment for selective recognition. The active recognition site is decorated with amino acids that interact with the analyte to hold it captive. Therefore, inspired by chemical and biological sensors, we wanted to merge the best of both worlds to make a novel type of sensor. A sensors optimized by the first

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and second sphere of coordination for the exquisite recognition of analytes. In addition, we wanted to add optical properties to it, in particular a color change during detection by using an indicator displacement.

We chose a protein with a deep cavity. [13] We then redesigned its active site by introducing a ligand into it. This ligand carries a functional group and is anchored supramolecularly to the protein. On this functional group we added a colored indicator. When an analyte enters the active site, it attaches to the functional group and displaces the indicator. The change in color indicates interactions between the active site and the analyte. The second sphere of coordination acts as a screen. It selects the access to the analyte at the active site. More specifically, we have incorporated into the carbonic anhydrase, boronic acids [2, 3, 5, 7] coordinated with indicators. These colorimetric sensors were screened in the presence of neurotransmitters.

The results show that we have obtained a highly selective, cheap and easy to assemble dopamine sensor mimicking biological membrane receptors. Such a discovery allows us to imagine optimizations taking advantage of the broad possibilities such as the ligand and its functional group, the indicators, the protein by mutation, the pH, the temperature and or the concentration of the reactions, etc. This can lead to dynamic combinatorial chemistry [12], high throughput screening [44] and optimization processes via directed evolution protocols [45] using for example machine learning [46]. The immediate high adaptability and ability of our sensor to be evolved can be useful for the selective detection of a wide variety of analytes going from small molecules to microorganisms. This discovery therefore makes it possible to dream of new biotechnological or new immunotherapeutic applications [14, 15, 16, 17, 18, 19, 20, 21, 22]. We show, proof of principle, that guided through the crystal structure of our receptor, we can create a cheap, easy to assemble, colorimetric biosensor for the selective naked-eye detection of dopamine which mimics a dopaminergic receptor.

## 2 Methods

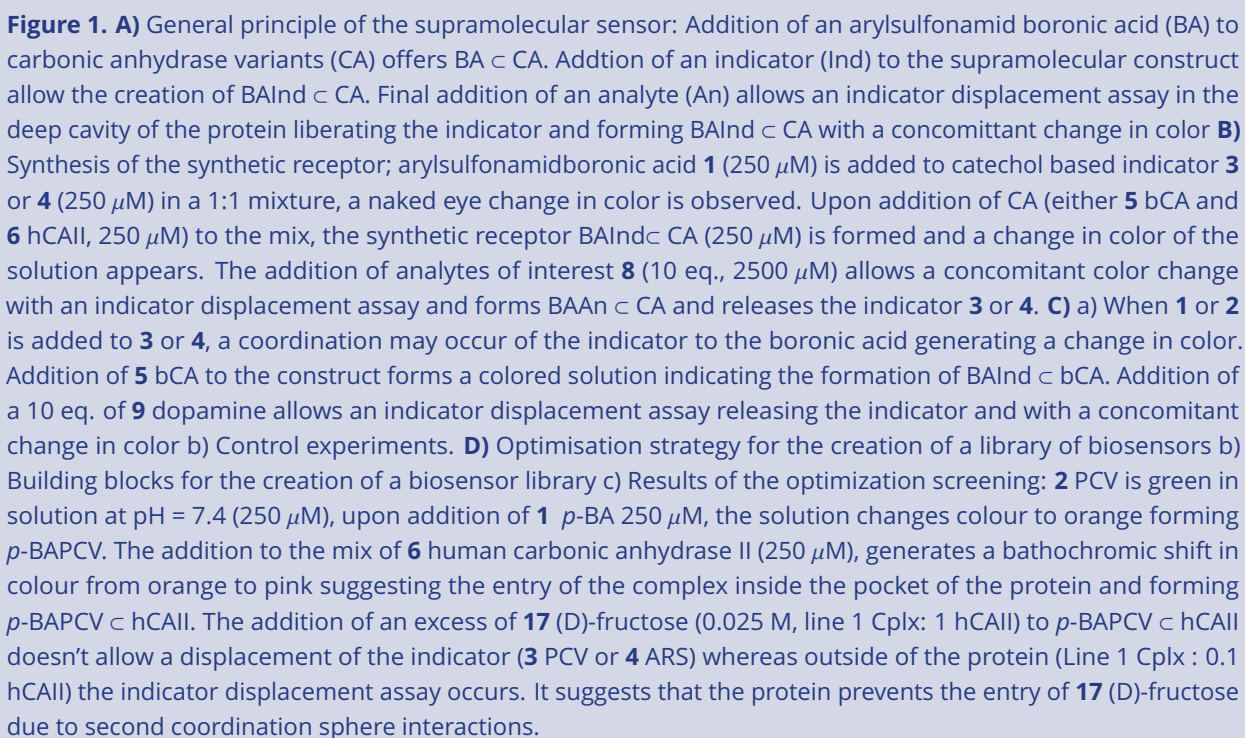
### 2.1 First coordination sphere detection

Dissolving 4-sulfamoyl(phenyl)boronic acid (**1** *p*-BA, 250  $\mu$ M) and pyrocatechol violet (**2** PCV, 250  $\mu$ M) in 2-[4-(2-hydroxyethyl)-1-piperazinyl]ethanesulfonic acid (HEPES, 100mM, pH=7.4) in a 1:1 mixture formed (*p*-BAPCV, 250  $\mu$ M), which is water-soluble and orange-red at working micromolar concentrations (see Figure 1). By homology with other reported arylboronic acid described in literature, we hypothesized that *p*-BAPCV could be formed and used to assemble a receptor for the naked-eye detection of various vicinal diols such as carbohydrates as described for **17** (D)-fructose [2] (See Figure 3) or catechols [1] such as **9** dopamine (see Figure 1 and Figure 3).

As anticipated *p*-BAPCV can detect visually and spectrophotometrically both **17** (D)-Fructose and **9** dopamine with a concomitant color change using an indicator displacement assay (IDA) (see Figure 1). We determined the association constant of *p*-BAPCV with **9** dopamine using an indicator displacement assay and we obtained a  $K_{ass} = 2.12 \cdot 10^6 \text{ M}^{-1}$  (see Table 1). [47] [2] Screening of various pHs ranging from pH = 5 to pH = 8 showed the best discrimination at pH = 7.4 as reported in other publications. [2, 6]

#### 2.1.1 Chemical diversity

To generate diversity in the composition of our sensors, we tested and used chemical optimization strategies. In such, combining two different sulfonamides boronic acids (**1** *p*-BA or **2** *m*-BA) with catechol based indicators (**3** PCV or **4** ARS) yielded four potential sensors for the detection of analytes. Of the four sensors tested only **1** *p*-BA was able to coordinate either **3** PCV or **4** ARS forming: *p*-BAPCV and *p*-BAARS. **2** *m*-BA did not react with both indicators suggesting that the position of the boronic acid in the aryl-sulphonamid moiety plays a key role in the coordination process of the indicator. With both *p*-BAPCV and *p*-BAARS in hands, we tested the two chemical variants with **17** (D)-Fructose for recognition and both offered an indicator displacement assay allowing detection of the analyte and showing no special selectivity in the recognition process (see Figure 3). For the continuation of our study, we therefore selected *p*-BAPCV and *p*-BAARS.



**Table 1.** Association constants of systems

System	$K_{ass}$ [ $M^{-1}$ ]
<i>p</i> -BA with PCV	$1.36 \cdot 10^5$
<i>p</i> -BAPCV with dopamine	$2.12 \cdot 10^6$
<i>p</i> -BAPCV with bCA	$3.60 \cdot 10^5$
<i>p</i> -BAPCV $\subset$ bCA with dopamine	xxxxxxx

## 2.2 Second coordination sphere detection

The catalytic Zn-active site present at the bottom of a deep hydrophobic funnel-shaped cavity of carbonic anhydrase endows high affinity for para-substituted aryl sulphonamids. [13] We thus speculated that upon tethering an aryl-sulfonamides boronic acid conjugated with an indicator may allow to anchor a recognition site within **5** bCA allowing an exchange between the indicator and selected molecules of choice (see Figure 1). In a first time, in order to confirm our hypothesis, we assembled the arylboronic acid **1** *p*-BA (250  $\mu$ M) and **2** PCV (250  $\mu$ M) in HEPES 100 mM, pH = 7.4 and formed *p*-BAPCV ( $\lambda_{max}$  = 465 nm) which is orange colour in a 1:1 mixture. We performed a titration of **1** with **2** in order to determine the binding constant of the host-guest receptor and obtained a  $K_{ass} = 1.36 \cdot 10^5 M^{-1}$  (see Table 1) with a 1:1 association.

In a second time, we added **5** bCA (1 eq.) to the 1:1 mix of *p*-BAPCV or *p*-BAARS (250  $\mu$ M in HEPES pH = 7.4). For *p*-BAPCV  $\subset$  bCA, a bathochromic change in colour appeared immediately after the addition of the protein (see Figure 1). The orange solution ( $\lambda_{max}$  of = 495 nm) of *p*-BAPCV turned intense pink with a  $\lambda_{max}$  of = 525 nm (see Figures 1 and 3). Titration of **5** bCA with *p*-BAPCV shows a bathochromic shift in color from 495 nm to 525 nm and a Job Plot titration confirms a 1:1 association of the bio-receptor (see supporting information) and an association constant of  $3.60 \cdot 10^5 M^{-1}$  (see Table 1). Same conclusions were observed for *p*-BAARS  $\subset$  where the shift in color is from 480 nm for *p*-BAARS to 485 nm for *p*-BAARS  $\subset$  however less pronounced than for *p*-BAPCV  $\subset$  bCA. The change in color confirms that the assembled orange colored *p*-BAPCV enters the protein. More interestingly, the order of the addition of **1** *p*-BA, **3** PCV and the protein **5** bCA didn't play any critical role. One can either form *p*-BAPCV before addition to **5** bCA or add *p*-BAPCV to the protein and add the indicator such as **3** PCV in a second time for coordination to *p*-BAPCV (see Figures 1 and 3) leading to an *indicator uptake-assay* which is known to improve the sensitivity of the assay compared to the displacement. [23] It suggests that CA can be used as a boronic proteic based platform for the recognition of analytes opening new routes for therapeutic proteins against catecholamines and that **3** PCV can be used as a sensor to probe the recognition of analytes coordinated to the boronic acid inside the active site of the protein.

### 2.2.1 Proteic diversity

In order to increase the diversity and induce selectivity in our sensors, we combined the two constructs *p*-BAPCV and *p*-BAARS with two variants of carbonic anhydrase such as **5** bCA (bovine carbonic anhydrase) and **6** hCAII (human carbonic anhydrase). The combination offered a four possibilities matrix ready to be screened with analytes; *p*-BAPCV  $\subset$  bCA, *p*-BAPCV  $\subset$  hCAII, *p*-BAARS  $\subset$  bCA, *p*-BAARS  $\subset$  hCAII.

## 2.3 Indicator displacement assay

We then tested our matrix of four sensors; *p*-BAPCV  $\subset$  bCA, *p*-BAPCV  $\subset$  hCAII, *p*-BAARS  $\subset$  bCA, *p*-BAARS  $\subset$  hCAII for the detection of **17** (D)-fructose through an IDA since recognition is described in literature outside a second coordination sphere. [2] The detection was not possible even in the presence of a large excess of **17** (D)-fructose (100 eq. of fructose compared to the proteic bio-conjugates) (see Figure 3) thus suggesting that the cavity of the protein prevents the entry of the sugar compared to the free assembled ligand-boronic complex *p*-BAPCV. In order to confirm the supra-molecular assembly, we performed a titration of the complex *p*-BAARS and *p*-BAPCV with a 1 (250  $\mu$ M) to 0.1 (25  $\mu$ M) ratio of *p*-BAARS and *p*-BAPCV versus **5** bCA and an excess of **17** (D)-fructose (100 eq., 0.025 M) (see Figure 1). Colour change

outside the protein was observed both for **3** ARS and **4** PCV as indicators confirming that the excess of *p*-BAARS and *p*-BAPCV (250  $\mu$ M) outside the protein reacts with **17** (D)-fructose (see Figures 1 and 3). As a consequence and in order to explore further the detection ability of our construct, we decided to investigate various analytes for recognition.

## 2.4 Crystal structure of the bio-sensor

In order to do so and predict further the interactions of potential analytes with our biosensor, we set out to crystallize it. We builded crystals of hCAII according to published procedures [48] and soaked **1** *p*-BA inside the enzyme. We obtained a crystal structure of our sensor *p*-BA  $\subset$  hCAII (PDB = 6XVH, see Figure 2 **A** and **B**) with same procedure also reported other crystal structures [48] of hCAII in conjugation with inhibitors [13] and in particular the crystal structure of hCAII with **18** 4-(4,4,5,5-tetramethyl-1,3,2-dioxaborolan-2-yl)phenylsulfamide [16, 17, 39, 49, 50, 40, 51, 48] (PDB = 3MNU, see Figure 2). Attempt to obtain crystal structure of *p*-BA  $\subset$  hCAII in conjugation with **3** PCV or **9** dopamine was not possible probably due to disruption of crystals in the soaking process.

## 2.5 Screening of analytes

With the obtained crystal structure (PDB = 6XVH) in hands (see Figure 2) we reasoned that molecules with a geometric similarity with the cavity should enter more easily the pocket of CA compared to **17** (D)-fructose. [2] In so, we were particularly interested in the close lying aminoacids to the boronic acids moiety such as: T-200, L-198, F-131, V-135, C-206. F-131 and especially F-131 that could interact with potential tested analytes entering the activ site of our construct.

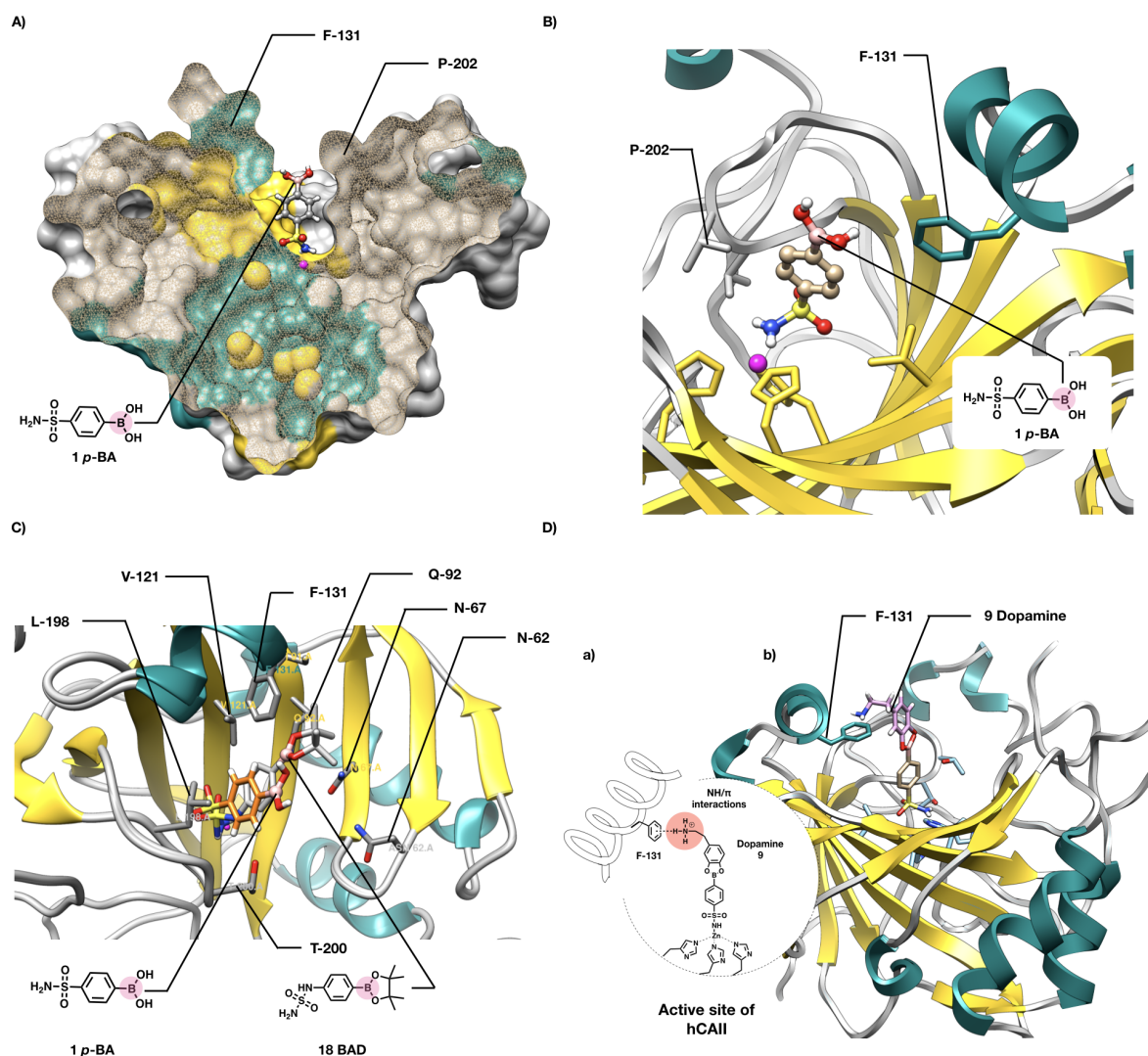
In addition, for screening of analytes of interest, we concentrated our efforts towards medically relevant and compatibles geometries molecules such as : **9** dopamine, **10** (*S*)-DOPA, **11** (*R*)-norepinephrine, **12** (*R*)-epinephrine, **13** GABA, **14** (*S*)-glutamic acid, **15** homovanilic acid, **16** DOPAC, **17** (D)-Fructose. (see Figure 3). Finally, we selected *p*-BAPCV  $\subset$  bCA and *p*-BAPCV  $\subset$  hCA II for screening since best discrimination with the naked eye is obtained with these systems (going from pink to green).

# 3 Results

The results of the screening showed that *p*-BAPCV (250  $\mu$ M) is able to recognize the catechol based neurotransmitters tested (small excess of 10 eq., 2500  $\mu$ M) showing no special selectivity (see Figure 1 and Figure 3). **13** GABA or **14** glutamic acid for example where not recognized even with a large excess of analyte (10 or 100 eq.). *p*-BAPCV  $\subset$  bCA and *p*-BAPCV  $\subset$  hCAII are not able to recognize **17** (D)-fructose even with a large excess (100 eq. compared to the bioreceptor *p*-BAPCV) suggesting that the second coordination sphere plays a critical role in preventing the recognition of the analyte (see Figures 1 and 3). *p*-BAPCV  $\subset$  bCA and *p*-BAPCV  $\subset$  hCAII recognize preferentially **9** dopamine over **11** (*R*)-norepinephrine or **12** (*R*)-epinephrine and other catechol based neurotransmitter even with significant structural similarities suggesting that second coordination sphere plays an Determining role in the selectivity process in the cavity of the protein (see Figure 3). Hence, **15** Homovanilic acid is not recognized by either *p*-BAPCV  $\subset$  bCA or *p*-BAPCV  $\subset$  hCAII suggesting that the catechol moiety plays a critical role for the recognition of the analyte. *p*-BAPCV  $\subset$  bCA II and *p*-BAPCV  $\subset$  hCAII follows the same trend in recognition of analytes suggesting that the active sites of both proteins are similar and pursue similar recognition patterns (see Figure 3). **9** dopamine is preferentially recognized over **16** DOPAC suggesting that the functional group at the tale of the neurotransmitter interacts with the second coordination of CA. A positive charge plays a key role in the recognition process (**9** dopamine) over a negative charge (**16** DOPAC).

## 3.1 Detection of analytes discussion

In order to understand the mechanism of selection discriminating the recognition between **9** dopamine and **16** DOPAC we sought to manually dock **9** dopamine inside *p*-BA  $\subset$  hCAII. Upon manual bond rotation we found that F-131 was close lying to the tail of **9** dopamine (see Figure 2). We then realized that the close proximity of an aromatic ring to an amine may lead to an NH/ $\pi$  interaction that could stabilize the

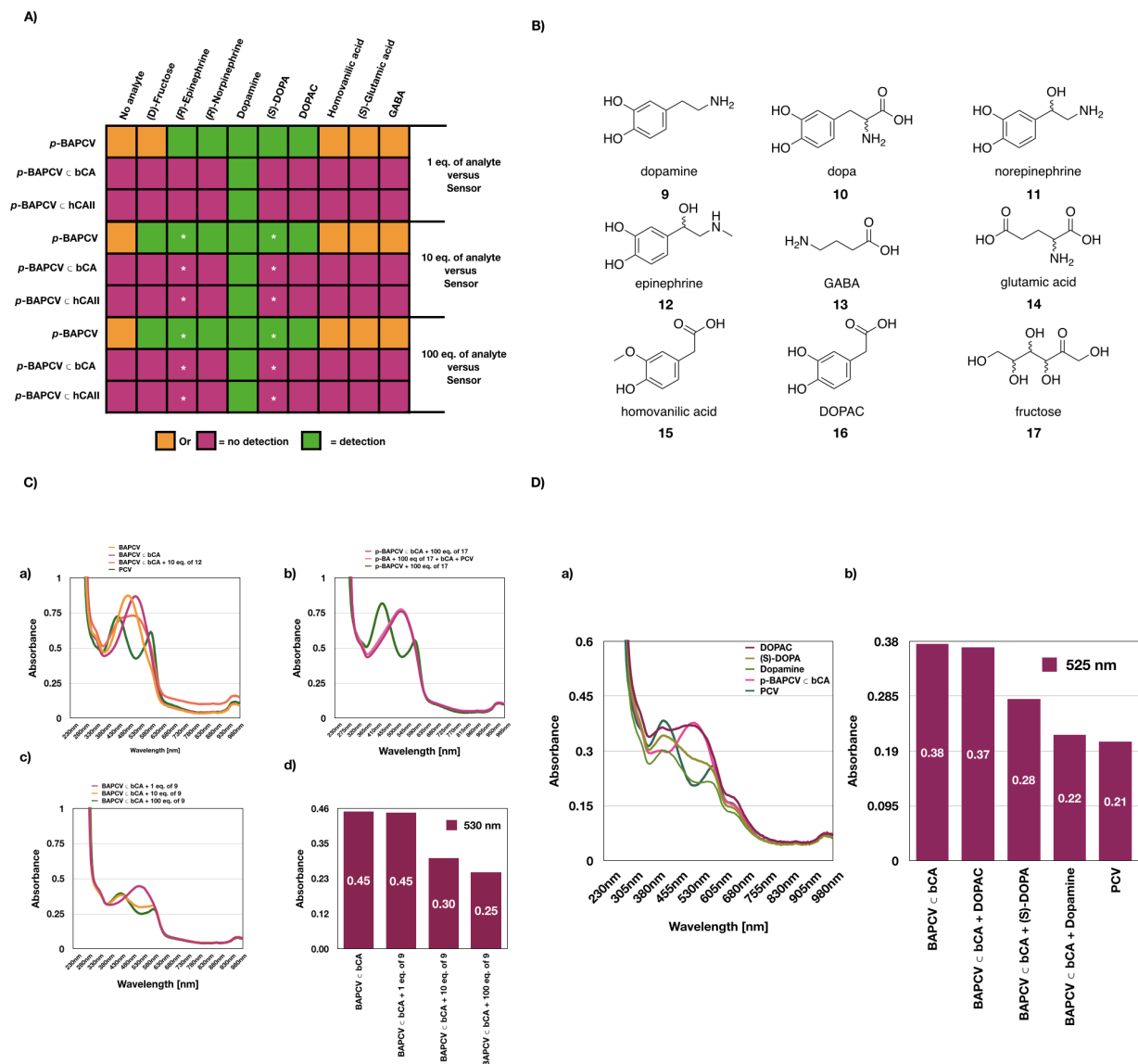


**Figure 2. A)** Cutted X-ray structure (PDB: 6XVH) presenting **1 p-BA** inside hCAII. [48] Of particular interest is the close lying aminoacid (F-131) to the boronic acid center of the supramolecular construct. **B)** Close view of *p*-BA inside hCAII **C)** Superposition of hCAII in conjugation with **18 BAD** (PDB code = 3MNU) and hCAII with **1 p-BA** (PDB code = 6XVH). Of particular interest are the aminoacids close to the binding site such as N-62, T-200, V-121, F-131. **D)** a) Proposed mechanisms for the recognition of dopamine inside *p*-BA c hCAII, a cataionic NH/ $\pi$  should occurs with close proximity of F-131 b) Manual docking of dopamine inside the active site of *p*-BA c hCAII.

interaction between **9** dopamine and *p*-BA c hCAII. We therefore suggest a mechanism of recognition with an NH/ $\pi$  interaction F-131 (See Figure 3).

### 3.2 Test of the best sensor in a complex sample

In order to test our best sensor *p*-BAPCV c bCA in real conditions, we decided test the determination of **9** dopamine in human urine. Urine is known to contain traces of **9** dopamine due to metabolic activities. In a first time, we tested *p*-BAPCV in the presence of pure urine from two different persons. Naked-eye detection of **9** dopamine was not possible nor any disturbance appeared on the sensor. In a second time we built *p*-BAPCV c bCA and tested it against the detection of traces of **9** dopamine in urine. No change in color was observable. In a third time, we spiked urine with **9** dopamine at a concentration of 2500  $\mu$ M



**Figure 3. A)** Screening of the synthetic bio-inspired receptor *p*-BAPCV  $\subset$  bCA for recognition of neurotransmitters. *p*-BAPCV (250  $\mu$ M), outside the protein is orange whereas inside the protein (CA, 250  $\mu$ M), the construct (*p*-BAPCV  $\subset$  bCA) is pink. Addition of a small excess (2500  $\mu$ M, 10 eq. versus sensor) of the analyte to the boronic acid outside of the protein may allow an indicator displacement assay. When *p*-BAPCV (250  $\mu$ M) is incorporated inside either **5** bCA or **6** hCA II (250  $\mu$ M) forming *p*-BAPCV  $\subset$  bCA only **9** dopamine can be fully recognized even with a large excess (0.025 M, 100 eq.) of the other analytes. **B)** Analytes used in the screening of this paper **C)** Absorbance spectras of the screening a) the incorporation of *p*-BAPCV (250  $\mu$ M) into bCA (250  $\mu$ M) allows a bathochromic shift in colour from  $\lambda_{max} = 495$  nm to  $\lambda_{max} = 525$  nm. Recognition of (R)-epinephrine **11** (100 eq., 0.025 M) at a concentration 100 eq. higher than **5** *p*-BA allows a poor recognition b) addition of **17** (D)-fructose to *p*-BAPCV  $\subset$  bCA doesn't allows an IDA either c) addition of a small excess (10 eq., 2500  $\mu$ M) of dopamine **9** to *p*-BAPCV  $\subset$  bCA allows an indicator displacement assay d) Decreasing absorbance upon addition of various catechol based analytes such of **9** dopamine (from 1 eq. to 100 eq.) to *p*-BAPCV  $\subset$  bCA D) a) Absorbance spectras of *p*-BAPCV  $\subset$  bCA in addition with various analytes b) Absorbance of *p*-BAPCV  $\subset$  bCA with various analytes at 525 nm.

and tested  $p$ -BAPCV  $\subset$  bCA for recognition. Change in color appeared immediately proving the possible determination of **9** dopamine inside complex samples such as human urine. (See supporting information)

## 4 Conclusions

Bio-molecular systems such as enzymes normally are dedicated to substrate transformations and allows very specific catalytic processes that depends on the composition of the active site. Here we have shown that such an active site can be completely redesigned by the introduction of a specific ligand bearing a functional group. In specific, we have shown that boronic acids can be introduced supramolecularly into a proteic environment and coordinated to indicators allowing specific detection of analytes using a displacement assay, for example dopamine. Despite their limited detection limits, these bio-receptors are distinguished by their easy to assemble, commercial disponibility, high modularity and evolvable features. Key to our construction strategy was the reimagination of the active site of carbonic anhydrase within a new structural context; a new boronic acid ligand for coordination of various analytes surrounded by a selectiv second coordination sphere. This example expands the general use of enzymes transforming them into exquisite biosensors. It could potentially be used for detection of various analytes going from small molecules to microorganisms mimicking natural antibodies.

## 5 Competing interests

The authors declare no competing interests

## 6 Contributions

Thibaud Rossel conducted the research, performed the experiments and wrote the manuscript. Bing Zhang produced crystals solved the X-ray structure. Raphael Gobat helped with the crystals production and with solving the X-ray structure.

## 7 Experimental section

All chemicals were purchased by Sigma Aldrich and used without further purifications. hCAII was synthesized by the Ward group University of Basel Switzerland.

A typical experiment (such as Figure 3C and D) is realised as follow (all solutions are freshly prepared prior to experiment):

25  $\mu$ L of a 250  $\mu$ M solution of BA in HEPES pH = 7.4 100 mM is added to a 25  $\mu$ L of a 250  $\mu$ M solution of indicator in a 96 well plate (same buffer). Upon change in color, 25  $\mu$ L of CA is added to the mix and change in color is observed (same buffer). Addition of 25  $\mu$ L of analyte allows an indicator displacement assay and a change in color. The absorbance spectra of the wells are measured in a 96 well plate reader TECAN safire 2 for analysis and comparison.

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