

# Development of micro-electrode array based tests for neurotoxicity: assessment of interlaboratory reproducibility with neuroactive chemicals

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Neuronal assemblies within the nervous system produce electrical activity that can be recorded in terms of action potential patterns. Such patterns provide a sensitive endpoint to detect effects of a variety of chemical and physical perturbations. They are a function of synaptic changes and do not necessarily involve structural alterations. In vitro neuronal networks (NNs) grown on micro-electrode arrays (MEAs) respond to neuroactive substances as well as the *in vivo* brain. As such, they constitute a valuable tool for investigating changes in the electrophysiological activity of the neurons in response to chemical exposures. However, the reproducibility of NN responses to chemical exposure has not been systematically documented. To this purpose six independent laboratories (in Europe and in USA) evaluated the response to the same pharmacological compounds (Fluoxetine, Muscimol, and Verapamil) in primary neuronal cultures. Common standardization principles and acceptance criteria for the quality of the cultures have been established to compare the obtained results. These studies involved more than 100 experiments before the final conclusions have been drawn that MEA technology has a potential for standard in vitro neurotoxicity/neuropharmacology evaluation. The obtained results show good intra- and inter-laboratory reproducibility of the responses. The consistent inhibitory effects of the compounds were observed in all the laboratories with the 50% Inhibiting Concentrations (IC<sub>50</sub>s) ranging from: (mean  $\pm$  SEM, in  $\mu$ M) 1.53  $\pm$  0.17 to 5.4  $\pm$  0.7 (n = 35) for Fluoxetine,  $0.16 \pm 0.03$  to  $0.38 \pm 0.16 \,\mu$ M (n = 35) for Muscimol, and  $2.68 \pm 0.32$  to  $5.23 \pm 1.7$  (n = 32) for Verapamil. The outcome of this study indicates that the MEA approach is a robust tool leading to reproducible results. The future direction will be to extend the set of testing compounds and to propose the MEA approach as a standard screen for identification and prioritization of chemicals with neurotoxicity potential.

Keywords: micro-electrode arrays, electrophysiology, neurotoxicology, primary neuronal culture

#### **INTRODUCTION**

Neuronal activity is the primary functional output of the nervous system and deviations from its physiological level often result in adverse behavioral or physiological function. Neurotoxicity occurs following exposure to a wide variety of xenobiotics that interfere with the function of the nervous system and can be produced by endogenous substances (mainly excitatory neurotransmitters) under a variety of circumstances (Obrenovitch et al., 2000; Vincent and Mulle, 2009). There are numerous mechanisms of action that ultimately result in neurotoxic outcomes. However, compounds are considered to be potentially neurotoxic when they affect a neurospecific endpoint at concentrations that do not affect general viability<sup>1</sup> (Costa, 1998).

Detection and characterization of chemical-induced toxic effects in the central and peripheral nervous system represent a

<sup>&</sup>lt;sup>1</sup>These studies are generally carried out using cytotoxicity assays such as Neutral Red (3-amino-7-di-methylamino-2-methylphenazine hydrochloride) uptake (NRU), Alamar Blue or 3-(4,5-dimethylthiazol-2-yl)-2,5-diphenyltetrazoliumbromide (MTT) reduction.

major challenge for registration and assessment of chemicals (e.g., REACH directive) for two main reasons: (a) neurotoxic effects can only be identified during *in vivo* studies for systemic toxicity evaluation, (b) no *in vitro* methods for evaluating the neurotoxic hazard of a chemical have yet been validated (Bal-Price et al., 2008).

Regulatory testing guidelines for the assessment of neurotoxicity rely exclusively upon *in vivo* observations (see U.S. EPA Guidelines for Neurotoxicity Risk Assessment: FRL 6011-3 and OECD TG481, TG419, TG424, and TG426). These include a number of behavioral tests, specific neurophysiological measurements and neuropathological examinations. The neurophysiological assessments comprise methods based on the electrophysiological activity of neurons such as somatosensory, visual, and/or auditory evoked potentials and electroencephalograms (EEGs). All of these approaches exploit the fact that neuronal activity is the functional output of the processes in the central and peripheral nervous system. Thus, these measures can provide a sensitive endpoint to detect early effects of chemicals before morphological changes occur (Costa, 1998).

While animal models have been the gold standard in toxicity testing for hazard identification over the last five decades, this approach is costly and time-consuming, and is not practical for hazard identification of thousands of chemicals such as under the REACH directive or in the high production volume program. Thus, alternative approaches to hazard identification are needed that have higher throughput capability and are predictive of *in vivo* effects (Coecke et al., 2007; Lilienblum et al., 2008).

When neurons are grown in vitro, they retain the basic processes underlying the in vivo physiological behavior. Their electrophysiological activity can be measured by a variety of approaches. Thus, in vitro assessment of neurophysiological function could be used to screen chemicals for potential neuroactivity/neurotoxicity. Furthermore while the seeding during the culture procedure leads to a random distribution of neurons, the connectivity maps derived from cultured neural assemblies are similar to other biological networks and display non-trivial structure in clustering network diameter, and assortative mixing (Bettencourt et al., 2007). One of the most widely utilized approaches, patch-clamp recordings, can provide exquisite mechanistic information about how a chemical interacts with membrane-bound ion channels and membrane reuptake transporters that ultimately control and modulate electrical excitability of neurons. High-throughput platforms for conducting patch-clamp electrophysiology are available, and have been utilized by the pharmaceutical industry for drug development. However, these platforms have some significant drawbacks from the standpoint of toxicity testing; they allow assessment of only one channel type at a time, assess changes only in individual cells rather than interconnected networks, and often require the use of transfected (often non-neuronal) cell types. When screening chemicals for potential neuroactivity, specific targets will not be known a priori, thus it would be impractical to screen multiple ion channel types. Furthermore, assessment of how a chemical affects communication between neurons in a network would identify actions that may be missed using measurements in individual, transfected cells.

Novel methods like electrophysiological recordings from *in vitro* neuronal networks (NNs) coupled to micro-electrode array

(MEA) chips provide a valuable alternative to conventional techniques (Pancrazio et al., 2003; Köhling et al., 2005). The MEA is a planar substrate with an embedded array of microelectrodes that are capable of measuring extracellular electrophysiology (spikes and bursts, i.e., packages of spikes) from electrically active tissues (Thomas et al., 1972; Gross et al., 1977; Pine, 1980; Egert et al., 1998).

Micro-electrode arrays are non-invasive, do not require external manipulations and provide simpler approach and higher content (up to hundreds of recording points) than conventional electrophysiological techniques. Since the 1990s, MEAs have been utilized for monitoring both acute and chronic effects of drugs and toxins (Streit, 1993; Gross et al., 1997; Gramowski et al., 2000; Shafer et al., 2008; Hogberg et al., 2011). In addition, MEA approaches with increasingly higher throughput are becoming available, which will facilitate rapid characterization of chemical actions on electrical activity in NNs. A recent review article by Johnstone et al. (2010) has proposed the MEAs as a high throughput, rapid screening method for toxicity testing.

Although MEAs have been used to study the actions of a variety of pharmacological and toxicological chemicals, to date there have been no multi laboratory studies that have evaluated the potential of this approach for formalized toxicity testing. Toward this goal, the aim of the present project was to verify intra-laboratory reproducibility and assess the interlaboratory variability of in vitro electrophysiology from NNs coupled to MEA-based system as an endpoint for an in vitro neurotoxicity test. Three reference chemicals: Fluoxetine<sup>2</sup>; Muscimol<sup>3</sup>; and Verapamil<sup>4</sup> were studied in six independent laboratories and the effects of these compounds on eight classical descriptors of neuronal electrophysiology (the number of spikes and bursts, the mean network spike rate and mean burst rate (MBR), the number of spikes in a burst, burst duration, interburst interval, and percent of spikes occurring in a burst) have been assessed. Among these parameters, the mean network spike rate was uniformly among the most sensitive parameters to reflect the neurotoxic effects of the applied test compounds. Thus the within- and inter-laboratory reproducibility, accuracy and robustness of the compounds' effect on the mean firing rate (MFR) has been assessed. In addition, this study has also identified recommendations on how the test system can be further improved in terms of reliability, reproducibility, and throughput performance.

## **MATERIALS AND METHODS**

## CHEMICALS

Three chemicals were selected for the project:

 R-(-)-Fluoxetine hydrochloride (FLU, Sigma Aldrich – F1678), CAS: 114247-09-5. FLU is a serotonin reuptake inhibitor. In both vertebrates and invertebrates, serotonin functions as a neuromodulator to either facilitate or inhibit synaptic activity mediated by neurotransmitters (Fink and Göthert, 2007).

<sup>&</sup>lt;sup>2</sup>http://www.chemspider.com/Chemical-Structure.3269.html

<sup>&</sup>lt;sup>3</sup>http://http://www.chemspider.com/RecordView.aspx?rid=a969e9d6-172a-40ff-8a47-fca9acc581db

<sup>&</sup>lt;sup>4</sup>http://www.chemspider.com/Chemical-Structure.59223.html

- Muscimol hydrobromide (MUS, Sigma Aldrich G019), CAS: 18174-72-6. MUS is a psychoactive alkaloid and it is a selective agonist of the GABA<sub>A</sub> receptor, thus enhancing the inhibitory neurotransmission and suppressing spontaneous activity. GABAergic agonists, like muscimol, are employed mainly as antiepileptic drugs or in conjunction with antipsychotics (Bartholini, 1985)
- (±)-Verapamil hydrochloride (VER, Sigma Aldrich V4629), CAS: 152-11-4. VER is an L-type voltage-dependent calcium channel antagonist. It blocks slow activating calcium channels modulating the neuronal excitability and reducing electrical activity (Rüschenschmidt et al., 2004).

Chemicals were purchased from the same stock from STU – IHCP – JRC and distributed to the other partners. Mention of trade names or commercial products does not constitute endorsement or recommendation for use.

#### **STUDY DESIGN**

Six independent laboratories: HTS lab – Systems Toxicology Unit, Institute for Health and Consumer Protection, Joint Research Centre, Italy (IHCP); Department of Biological Sciences and Center for Network Neuroscience (CNNS), University of North Texas, Denton TX, USA; Neuroproof and Institute of Biological Sciences, University of Rostock, Rostock (UR + NP), Germany; Integrated Systems Toxicology Division., U. S. Environmental Protection Agency (EPA), RTP, NC, USA; NeuroTech Lab – NBT, Italian Institute of Technology (IIT), Genoa, Italy; KBTLab – DIBE and ETT joint lab (KBT), University of Genoa, Genoa, Italy participated in the project. In each laboratory, each chemical was tested at least three times with two different *in vitro* preparations from different cultures.

During the study each participating laboratory adopted operating procedures and good laboratory practices for cell culture and data processing. *A priori* defined common acceptance criteria on NN morphology and spontaneous electrophysiology were used to select more than 100 independent experiments (about 700 h of recordings) that were included in the analysis of reproducibility between the laboratories (see Acceptance Criteria).

Each participating laboratory had its own well established cortical neuronal model. Since this was an initial assessment of interlaboratory reproducibility, attempts to standardize preparations were not made. Four different experimental models, namely mouse cortex (E14–17), cryopreserved mouse cortex (E14–15), rat cortex (E16–18), and new born (0–24 h) rat cortex, were used for NN preparation (see **Table 1**).

#### Cell culture

Different cell densities have been used according to each laboratory's good practice protocols following previously published methods. The number of seeded cells per chip was optimized by each group to reach a final density of 1500-2500 viable cells/mm<sup>2</sup>. The viability of the cells was assessed with trypan blue test prior to seeding and the appropriate volume of suspension was calculated to cover either the central part of the chip (with a 50-µl droplet) or the whole surface depending on each laboratory protocol (see **Table 1**). Regardless of the cell source, once extracted the cell suspension was added to the MEA device, medium was added and the MEA chip was kept in a Petri dish (100 mm) and placed in a humidified incubator at  $37^{\circ}$ C and 5% CO<sub>2</sub> or 10% CO<sub>2</sub> (depending on the specific laboratory) in order to let the NN reach maturation usually at 3–4 weeks.

Once or twice a week the medium was changed until the beginning of the experiment. Details on this aspect are given in **Table 1**.

All procedures of the participating laboratories involving animals have been approved by the respective National Committees on animal care and use for scientific research.

#### Chip handling and preparation

Standard 59–64 electrode MEA chips with  $30 \,\mu$ m diameter electrodes, 150–200  $\mu$ m inter-electrode spacing (Multichannel Systems GmbH, Reutlingen, Germany; Center for Network Neuroscience (CNNS) at the University of North Texas – MEA chip) were employed. The MEA chips contained either an integrated ground electrode, or an additional electrode was connected by the user to the ground signal.

Prior to plating cells, the MEA chip was sterilized by heating for 2 h in oven at 122°C, or autoclaving. Subsequently, to promote adhesion and neurite outgrowth, the chip was coated with Laminin (Sigma L2020) and Poly D-Lysine (PDL, Sigma P6407) or Poly L-Lysine (PLL, Sigma 2636). The order and amount of substrate deposition varied among laboratories (**Table 1**).

#### **Recording system**

The recording system consisted of (a) MEA amplifier, (b) personal computer equipped with A/D acquisition board, (c) recording software, (d) heating system and temperature controller, (e)  $CO_2$  atmosphere-maintaining and evaporation-preventing systems. Specific details regarding the MEA-based recording systems, electrophysiological activity sampling frequency, applied filtering and recording software are found in **Table 2**.

**Figure 1** shows an example of a NN coupled to the MEA chip and representative electrophysiological signal.

#### SIGNAL PROCESSING

#### Characterization of neuronal network electrophysiology

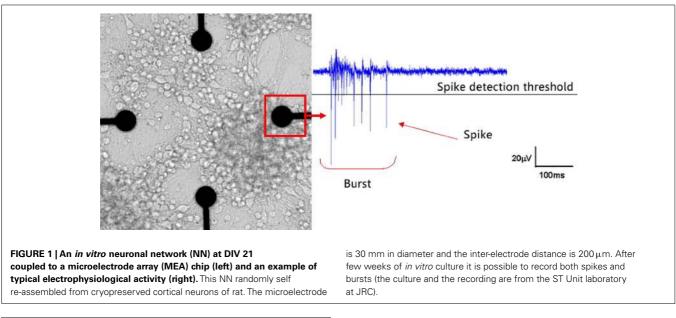
Raw electrophysiological signals consist of meaningful information (spikes and bursts) superimposed on background noise. **Table 3** reports details about spike and burst detection methods. In general the detection method is applied to each single MEA channel: when the electrophysiological signal exceeds a threshold an action potential (spike) is detected. The Plexon system has the additional feature of allowing real-time spike identification based on wave shape (template matching) and discrimination of up to four such shapes on each recording electrode (signal channel). When a spike is detected the system stores the time point of detection within the recording as a unit time stamp (see **Figure 2**).

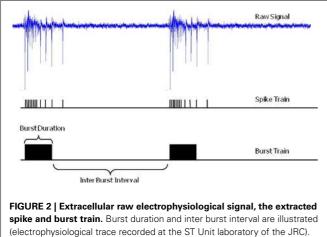
A burst is a dense sequence of spikes which can be recognized by a burst detection method. **Table 3** reports also details about the methods utilized by each laboratory for both spike and burst detection.

	IHCP	CNNS	EPA	ШТ	КВТ	UR + NP
Parameter used for IC <sub>50</sub>	Mean firing rate	Mean firing rate	Mean firing rate	Mean firing rate	Mean firing rate	Mean firing rate
Model – cell culture	(Cryo) mouse cortex E14–15	Mouse frontal cortex E15–E16	New born (0–24 h) rat cortex	Rat cortex E18	Mouse cortex E18	Mouse frontal cor- tex E15–16
Dissociation	No	Dnase I + papain	Mechanical ( + filter)	Trypsin	Trypsin	DNase I + papain
Chip coating	Laminin + PDL – 1:1 (just in the center)	Laminin + PDL – 1:1	Laminin + PLL – 1:1	Laminin + PDL – 1:1 (just in the center)	Laminin + PDL – 1:1 (just in the center)	Laminin + PDL – 1:2
Number of cells/chip	50000	300000	250000	50000	50000	300000
Culture medium	Lonza medium	DMEM + 5% serum (mus) DMEM + 5% (flu)	Nbasal A + 10% FBS NBA/FBS + Glutamate	Neurobasal B27	Neurobasal B27	Serum free NeurobasalTM/ B27 (Invitrogen) NbActive4 (GJ Brewer)
Fraction and frequency of the medium change (MC)	50% MC, once a week for the first 3 weeks, then 50% MC two times a week there on	50% MC, two times a week	100% MC, 1st after 24 h to FBS + glutamine (1%). 2nd 3 days later to FBS, then once a week thereon with FBS	50% MC, 1st after 2/3 days, then once a week, two times after 3/4 weeks	50% MC, 1st after 2/3 days, then once a week, two times after 3/4 weeks	30% three times a week (serum free), 50% two times a week (serum)
Antibiotics in cell medium	YES	NO	YES	NO	NO	NO
Presence of serum while recording	NO	YES	YES	NO	NO	NO
References	Novellino and Zaldívar (2010)	Xia et al. (2003)	Meyer et al. (2008)	Chiappalone et al. (2006)	Chiappalone et al. (2006)	Gramowski et al. (2006)

#### Table 2 | Recording conditions across participating laboratories.

	IHCP	CNNS	EPA	ΙΙΤ	КВТ	UR + NP
Recording DIV	19–44	21–68	21–28	24–31	24–31	27–35
Recording atmosphere (CO <sub>2</sub> , pH,)	Cap and water vapor enriched with 5% $CO_2 + 20\%$ $O_2 + N_2$	Warmed cap and water vapor + 10% CO <sub>2</sub> + air	FEP membrane + water 10 µl per administration	Cap and water vapor enriched with 5% $CO_2 + 20\% O_2 + N_2$	Cap and water vapor enriched with 5% $CO_2 + 20\% O_2 + N_2$	Warmed cap and water vapor + 10% CO <sub>2</sub> + air
Recording system	MEA system – multi channel systems	CNNS-MEA + Plexon	MEA system – multi channel systems	CNNS-MEA + Plexon	MEA system – multi channel systems	CNNS- MEA + Plexon
Sampling frequency	10 kHz	40 kHz	25 kHz	10 kHz	10 kHz	40 kHz
Other info	Amplifier gain 1000× Band pass digital filter: 60–4000 Hz	Amplifier gain 10 K with bandpass set at 500–6000 Hz	Amplifier gain 1100×; band pass digital filter cutoff 200 Hz	Amplifier gain 1000×	Amplifier gain 1000×.	Amplifier gain 10K with bandpass set at 500–6000 Hz





Spike trains were processed from the raw signals recorded from each channel to extract descriptors of the spontaneous electrophysiology at both spike and burst level, namely:

- 1. Number of spikes (summed over all the active channels in a 1-min bin),
- 2. Network MFR (spikes/s, summed over all the active channels),
- 3. Number of bursts (detected in the whole network in a 1-min bin),
- 4. Network MBR (bursts/min),
- 5. Number of spikes in burst,
- 6. Mean Burst duration (ms),
- 7. Inter burst interval (IBI) (s),
- 8. Spikes in burst/total spikes (%SB/TS).

All the parameters were extracted at single channel level and integrated over all the active channels in order to have descriptors at network level.

**Figure 3** displays an example of how these eight parameters are distributed and affected by the application of muscimol.

# Experimental procedure: from electrophysiology to concentration–response curves

Experiments were carried from the third to the ninth week *in vitro* (WIV). The recordings were performed on different days and using cultures from a minimum of two different isolations (see **Table 2** for details).

In some laboratories a 50% change of the medium was conducted prior to initiating the experiment (see **Table 1** for details), 15–30 min were allowed for the activity to stabilize before recording. In all laboratories, reference activity recorded 30–60 min before the first administration was used as the control condition. Reagents were then introduced by the following pipetting procedure to ensure proper mixing: 100–300  $\mu$ l of medium was removed from the medium bath covering the networks, mixed with a small volume (2–20  $\mu$ l) of the reagent dilution and carefully returned to the medium bath in order to minimize any osmotic or hydrodynamic stress. Typically concentration–response relationships were determined in a cumulative manner, in which the concentration of drug present in the medium was increased in a stepwise manner in log or half-log units.

All analyses were conducted on binned data with bin size of 60 s. Data from experimental episodes were averaged for the last 20 min over the 30- to 40-min time window of recording for each concentration (see **Table 3** for details). Each time point of the experiment was the average of the firing rate over a 60-s time period. A stable level of spontaneous activity was required in order to start the experiment and was considered as the reference. In general, there is a transition period until equilibrium is achieved which has been established by each laboratory with *post hoc* analysis in previous experiments. The response during this transition time window has not been considered for the concentration–response analysis. The percent change in firing rate at each concentration was then determined relative to the reference spontaneous activity period.

To determine the changes of network activity with time, mean network spike rate, and burst rate of all active channels over the course of the whole experiment were considered. For the purpose

#### Table 3 | Signal processing methods.

	Spike detection method	Burst detection method	Processing done on	Reference for applied methods
IHCP	Threshold – MC_Rack (6–seven times SD based on RMS).	Minimum number of spikes/burst = 5, ISI max = 100 ms, minimum bursting rate/channel: 0.4 bursts/min.	20–25 min (in stable activity).	Chiappalone et al. (2005), Novellino et al. (2009)
CNNS	Plexon unit identification and spike detection.	Based on two thresholds adjusted dynamically: ISI max = 50–150 ms, max time interval to end a burst: 100–300 ms.	Minimum 30 min of stable activity.	Morefield et al. (2000), Xia et al. (2003)
EPA	MC_Rack threshold ( $-15\mu$ V, $\sim$ 2:1 noise of 5 $\mu$ V RMS).	Minimum nr. of spikes/burst = 4, ISI max = 75 ms.	10 min in stable activity.	Shafer et al. (2008)
IIT	Precise timing spike detection (PTSD) on raw data: eight times SD, peak lifetime = 2ms, refractory period = 3 ms.	Minimum number of spikes/burst = 5, ISI max = 100 ms, minimum bursting rate/channel: 0.4 bursts/min.	40 min (after stable activity is reached at each administration).	Chiappalone et al. (2005), Maccione et al. (2009)
КВТ	Precise timing spike detection (PTSD) on raw data: eight times SD, peak lifetime = 2ms, refractory period = 3 ms.	Minimum number of spikes/channel = 5, ISI max = 100 ms, minimum bursting rate/channel: 0.4 bursts/min.	40 min (after stable activity is reached at each administration).	Chiappalone et al. (2005), Maccione et al. (2009)
UR + NP	Plexon unit identification and spike detection.	Based on two thresholds adjusted dynamically: ISI max = $50-150$ ms, max time interval to end a bursts: 100-300 ms.	30 min stable activity (after 30 min application stabilization).	Morefield et al. (2000), Gramowski et al. (2006)

of obtaining the  $IC_{50}$  values from the dose–response curve only the changes in MFR were considered. Plots were also used to determine the concentration that stopped all activity.

Bursts were recognized and detected as trains of action potentials based on a set of parameters defined *a priori* and reported in **Table 3**. The analysis on bursts was performed on 1-min bins as well as for the MFR.

All the laboratories tested, in a subset of the experiments, the viability of cells at the end of the recordings to assess that the lack of activity was due to the neurotoxic but not to the cytotoxic effect of each compound. This was done with a washout procedure in two steps performed within 10 min usually involving a 50% medium change (i.e.,  $500 \,\mu$ l) followed by a 100% medium change (1000  $\mu$ l). In all the cases full recovery of the activity was observed (example shown in **Figure 4**).

In one laboratory (JRC) also a test based on the measurement of lactate dehydrogenase (LDH) activity (Roche, Basel, Switzerland) was performed to have further evidence of the lack of cytotoxicity of these three compounds. Samples of the medium (150  $\mu$ l) were taken from the MEA chips at different times during the experiment namely: (i) before starting the recordings; (ii) at the end of the experiment during the first step of the wash out made with 50% change of the medium; and (iii) during the second step of the wash out made with 100% change of the medium. A negative control, 150  $\mu$ l of medium which was not in contact with the cells was also submitted to LDH measurement and a positive control with total LDH release by neurons in the chip was determined after lysis by addition of 1% Triton X-100 (Sigma, T8787). as previously done on neuronal cells (Calderón et al., 1999).

#### Acceptance criteria

In a pre-study meeting the consortium defined some simple rules for considering the NN and its activity acceptable. The first criterion was based on the network morphology and growth evaluation done by a trained and experienced operator. On a regular basis during the culture time and prior to MEA recording each chip was inspected under an optical microscope to exclude the presence of bacterial/fungal contamination. Furthermore before starting an experiment each culture was evaluated for neuronal morphology and network's growth basing on the presence of a dense and uniform distribution of neuronal cells and the presence of neuronal connections on the recording area as previously described (Hogberg et al., 2011 and see **Figure 1**). The second step in the quality check was based on the electrophysiological activity analysis. The network was considered acceptable for the study if the following conditions were present:

- activity recorded from at least 15 electrodes
- synchronized burst patterns
- bursting frequency  $\geq 6$  burst/min (over the whole network)
- mean spiking frequency  $\geq 6/s$  (for each channel)
- Number of spikes in bursts/all spikes  $\geq 0.6$

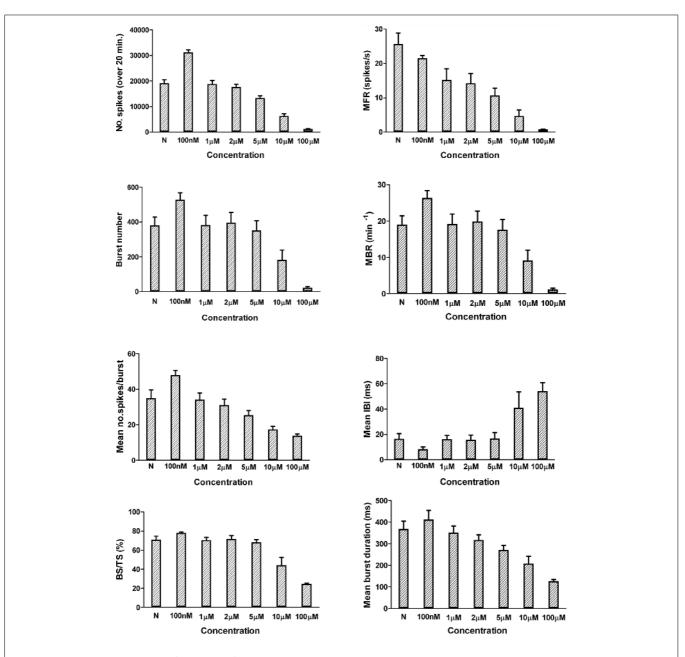


FIGURE 3 | Graphical representation (mean  $\pm$  SEM) of the eight electrophysiological descriptors and their change upon application of FLU at different concentrations compared to the reference value (*N*). Data from JRC, N = 8 from three different cultures.

- signal-to-Noise (S/N) ratio: larger than 2 × RMS of the recorded signal noise.
- SD of the IC<sub>50</sub> obtained from single concentration–response curves < 20% (see Statistical Analysis)

#### Statistical analysis

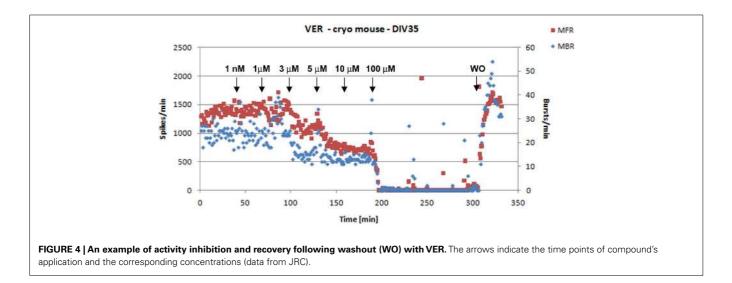
For each experiment, the changing spike rate as a function of the concentration was fitted with the Hill equation which has long been proposed as a model to analyze non-linear drug concentration–response relationships (Wagner, 1968):

$$y = y_{\text{START}} + (y_{\text{END}} - y_{\text{START}})/(1 + 10^{[\log(\text{IC50}) - \log(x)] + \text{HC})}$$

Where *y* is the observed value,  $y_{\text{START}}$  is the highest observed value,  $y_{\text{END}}$  is the lowest observed value (usually at the highest concentration), and HC the Hill coefficient which gives the largest absolute value of the slope of the curve.

From this model the  $IC_{50}$  values were determined (using the fitting tool from Igor Pro 6.1, Wavemetrics Inc., USA) for each compound and for each experiment.

The Hill equation was applied to single experiments where 20 points, each representing the MFR over a 1-min bin, were plotted against the corresponding compound's concentration. The  $IC_{50}$  was obtained with its own SD. If the SD was exceeding 20% of the  $IC_{50}$  value the experiment was discarded from the dataset. When



in each lab the set of experiments related to the same compound was completed, the mean values (with SEM) of the MFR at each concentration were plotted and fitted together and the  $\rm IC_{50}\pm SEM$  for the compound was obtained.

For direct comparability all parameters were normalized in each experiment with regard to the corresponding values of the reference activity (native or after treatment, respectively).

The distribution of the calculated  $IC_{50}$  values for each compound was tested by applying the one-way analysis of variance (ANOVA). In this approach the calculated variable *F*, which reflects both the variability within each dataset (intralaboratory variability) and among the different datasets (interlaboratory variability), is submitted to test. The result allows to assess whether the expected values of a quantitative variable (i.e., the  $IC_{50}$ ) within several pre-defined groups differ from each other and to compare the variability within each dataset and among different datasets. Where significant differences were detected a *post hoc* analysis with pairwise multiple comparisons was applied to determine which of the means differed. The one-way ANOVA and *post hoc* analysis were performed with GraphPad Prism (GraphPad Software Inc., La Jolla, CA, USA) and the levels of significance were p = 0.05 for the *F* and p = 0.01 for the *post hoc* tests.

#### RESULTS

One hundred six cortical cultures were recorded in this interlaboratory study. The age of the cultures ranged from DIV19 to DIV68. The cultures exhibited spontaneous activity in their respective media, consistent with previously reported effects (Xia et al., 2003; Gramowski et al., 2004; Chiappalone et al., 2006; Shafer et al., 2008; Pasquale et al., 2010).

Network spike rates ranged from (mean  $\pm$  SEM)  $3.2 \pm 0.6$  spikes/s (n = 25; cultures from new born rat) to  $60.10 \pm 7.04$  spikes/s (n = 71; cultures from embryonic rat freshly dissociated and embryonic mouse from cryopreserved vials). In spite of these differences in the basal activity the results in terms of IC<sub>50</sub> were very homogeneous among the groups and for each compound (see **Table 4**).

Addition of VER (1 pM–100  $\mu$ M), MUS (1 pM–3  $\mu$ M), and FLU (1 pM–100  $\mu$ M) resulted in concentration-dependent

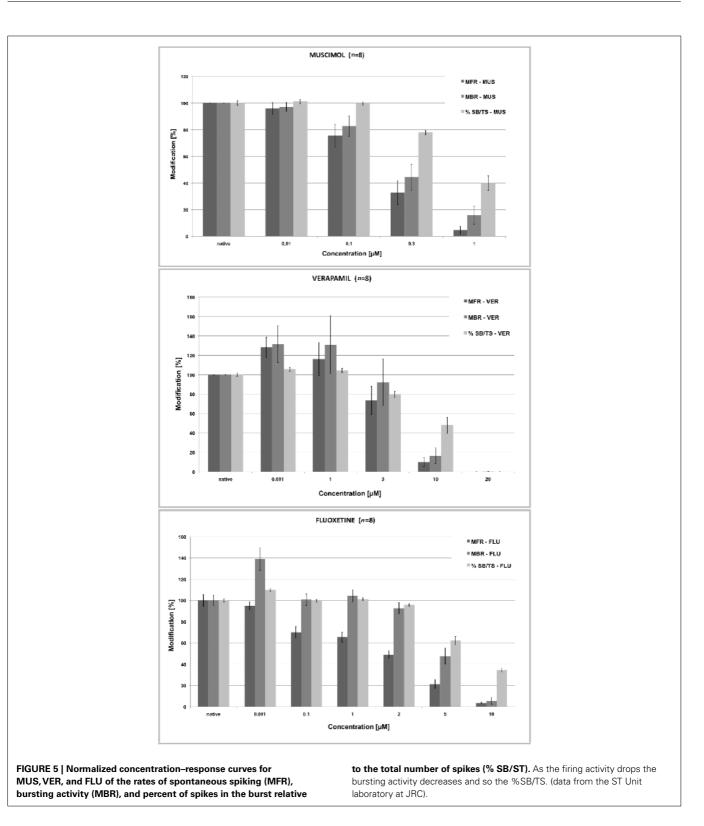
Table 4 | IC<sub>50</sub> values determined in participating laboratories.

Laboratory	Fluoxetine ( $\mu$ M)	Muscimol (μM)	Verapamil (µM)
IHCP	2.93±0.11	0.20±0.01	3.71 ± 1.23
CNNS	$5.40 \pm 0.70$	0.16±0.01	_
EPA	$5.38 \pm 0.41$	$0.42\pm0.05$	$2.68\pm0.32$
IIT	-	$0.38\pm0.01$	$5.23 \pm 1.07$
КВТ	2.05±0.10	-	_
UR + NP	$1.53\pm0.17$	$0.21\pm0.01$	$3.78\pm0.23$

Concentration–response curves for inhibition of mean spike rate by VER, MUS, and FLU. MEAs containing cortex cells were exposed to MUS (1 pM–3  $\mu$ M), VER (1 pM–100  $\mu$ M), and FLU (1 pM–100  $\mu$ M). Effects on spike rate were measured by averaging the number of spikes/min over the last 10–30 min of exposure to each concentration, when a stable level of activity had been obtained. Each value represents the mean  $\pm$  SEM of 5–11 experiments for each participating laboratory.

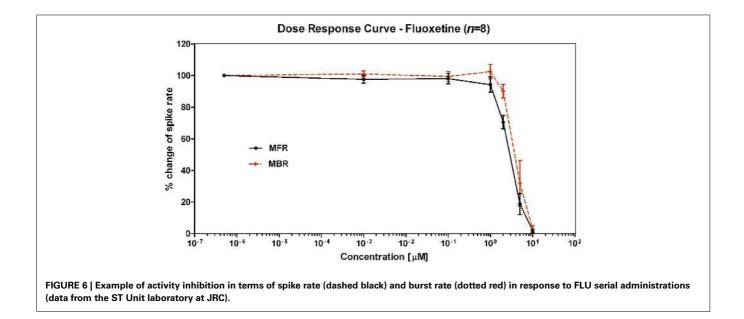
decreases in the rates of spontaneous spiking and bursting activity, and affected also the percentage of spikes in the bursts although with less efficacy (Figure 5). In some experiments, increases in the spike and/or burst rate at low concentrations were observed prior to decreases at higher concentrations (Figure 6) but this effect was not consistently observed and was not statistically significant (paired *t*-test of the MFR and MBR compared with the values at lower concentrations, p = 0.05). There were clear differences in the inhibitory strength of the three compounds, but for each of them every laboratory recorded the same order of magnitude of the IC<sub>50</sub> value (see Table 4; Figure 7). The one-way ANOVA showed that for both MUS and VER the differences among all the laboratories were not significant (p > 0.05) and that the intralaboratory and interlaboratory variabilities were comparable (see Table 5). This indicates that independently from the neuronal source (cryopreserved/embryonic cortical neurons or newborn cortex) and from the differences in the basal activity and the culture age the effects of these two compounds were uniformly detected and reproducible in all the laboratories (see Table 4).

The ANOVA on the FLU data has shown that there were significant differences among different laboratories. Thus we run a *post* 



*hoc* (Newman–Keuls) test for multiple comparisons and we found that both EPA and CNNS obtained a significantly greater value of the IC<sub>50</sub> compared to the UR + NP laboratory (**Figure 7**; **Table 5**). In spite of this the two of them were not significantly different as they were further tested with an unpaired *t*-test (p > 0.05). CNNS

and UR + NP were using the same cell model and same cell culture and signal analysis procedures. The source of this difference is most probably related to the age of the cultures which, in the case of FLU, may play a role (see Discussion). Both UR + NP and the CNNS labs utilized cultures from embryonic mouse frontal



cortex with CNNS performing experiments up to 9 weeks *in vitro*, while EPA performed its experiments on neurons obtained from new born rat cortex when the developmental state of the neurons is ahead compared to the embryonic stage. Yet there were no differences compared to the other labs so this is an effect which can be controlled by a better definition of the optimal culture age for the recordings.

Among the three studied compounds MUS was the most potent, while VER was the least potent (see **Table 4**).

The three compounds also inhibited the MBR, and burst related parameters, in a concentration-dependent manner that was nearly identical to effects on spike rate. **Figure 3** reports an example with Flu but a similar effect was observed also with the other compounds.

Among the parameters used to quantify the effect of the three compounds, the network MFR was identified as the best representing parameter because it was sensitive to the compound's application, robust, simple to extract, and the effectiveness of the detection was independent from the method applied by each laboratory. Moreover the other parameters are derived from an analysis (i.e., burst detection) of the firing rate so we decided to concentrate on the  $IC_{50}$  derived from MFR as the endpoint to assess the reliability and the reproducibility of the effects on neuronal activity.

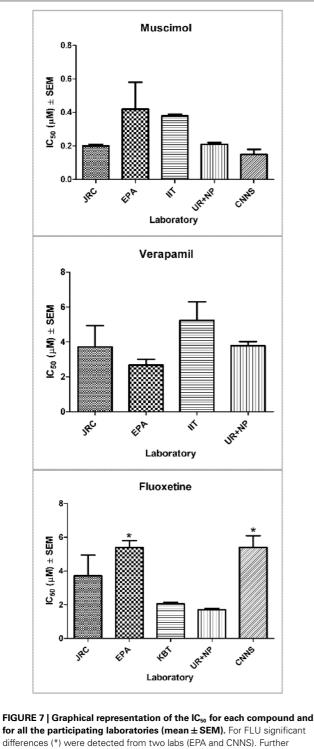
All participants observed that the decrease in network activity was not the result of cytotoxicity of MUS, VER or FLU to the cultures since in a subset of experiments the washout of the compound led to full recovery of the initial spike rate (see **Figure 4** as an example). Even after spiking and bursting activity was inhibited by >90%, events were still recorded. Furthermore in one lab (JRC), an LDH release test was performed to have further evidence of the lack of cytotoxicity of these three compounds and the results are summarized in **Table 6** (see Experimental Procedure: From Electrophysiology to Concentration–Response Curves).

## DISCUSSION

The present study examined the robustness and reproducibility of *in vitro* NNs coupled to MEA-based systems as a first step in demonstrating the utility of this approach for neurotoxicity screening. The results of this study demonstrate consistency across different laboratories in determining the magnitude of the effects for three pharmaceutical agents. Indeed for both MUS and VER, the variability of the IC<sub>50</sub> values determined across all the participating laboratories were comparable to the variability detected within each laboratory independently from the culture source and age. The same occurs for FLU when analyzing the data from all laboratories except for CNNS (older cultures age) and EPA (postnatal cortex neurons).

FLU deserves particular consideration because the age of the culture may influence the effect of the compound on the electrical activity. FLU acts on the serotonergic system by inhibiting the serotonin (5-HT) reuptake thus enhancing its the effect. Several published data provide evidence that the serotonergic system undergoes a dramatic change within the late embryonic phase and the first weeks of postnatal life and that the effects of 5-HT on neuronal excitability (and thus activity) may vary a lot within this time window (Hedner and Lundborg, 1980; Aitken and Törk, 1988; Béïqueet al., 2004). Thus experiments performed on cell cultures which span widely through this time period may be affected by the variability of the response related to the rapid changes occurring in the serotonergic pathway.

Still the reproducibility observed in the two subgroups (all laboratories except EPA and CNNS and EPA + CNNS) demonstrates the robustness of MEA approaches. Data derived from MEAs were already shown to be reproducible within an individual laboratory (e.g., Gramowski et al., 2004, 2006; Parviz and Gross, 2007). The present results extend this reproducibility across multiple laboratories and recording platforms. This reproducibility was evident despite the fact that different experimental models (see **Table 1**), as well as culture practices, and commercially available recording



differences (\*) were detected from two labs (EPA and CNNS). Further analysis revealed a possible influence of the culture age on the effects measured.

systems (i.e., MultiChannel Systems GmbH, and Plexon Inc.) were used across the different participating laboratories.

In vitro networks of neurons are spontaneously active and express patterns of electrical activity as part of their normal

function (Gross et al., 1997; van Pelt et al., 2005; Wagenaar et al., 2006). While there have been limited studies of effects of neurotoxicants using MEAs (see Johnstone et al., 2010), to date these studies have focused on understanding actions of individual chemicals. These studies have established that effects of compounds at the cellular level recorded with MEAs produce histiotypic responses that correlate with their characteristic signs and symptoms of intoxication (e.g., Xia and Gross, 2003; Meyer et al., 2008; Shafer et al., 2008). Furthermore, the alterations of electrical activity induced by a compound's application (functional neurotoxicity), is often not to the result of cell death (cytotoxicity). This is consistent with the acute neurotoxicity of many xenobiotics (e.g., ethanol, pyrethroids, and tetrodotoxin) that cause the organism death prior to the onset of significant cytotoxicity/pathology in the nervous system. While not systematically examined in the present experiments, the measurements of LDH release indicate that the compounds assessed in the present study also exerted changes in network activity in the absence of cytotoxicity. This ability of MEAs to detect changes in network function that either precede or occur in the absence of significant cytotoxicity make them a useful and sensitive approach for screening chemicals for neurotoxicity potential.

Compared to patch-clamp and other single electrode recording techniques, MEA approaches measure responses of a whole network, integrating global information on the interaction of all receptors, synapses and neuronal types which are present in the network. Furthermore, recently developed new technology of the MEA devices allows to increase the throughput. Already available 12-wells chips with up to 64 electrodes per well allow to simultaneously record neuronal activity in 12 different experimental conditions and very soon platforms which accommodate up to 96-chips in a plate with up to 798 recording channels will be available making the MEA a potential candidate for standard screening of neurotoxic compounds. In addition, because of the integrated nature of function in MEA recordings, they are closer to the whole animal situation than data from single cell or single ion channel studies, and allow for feedback and compensation to take place within the network. While the present studies utilized primary cultures from dissociated tissue, it is possible to measure activity in slices from several CNS regions, thereby preserving the three dimensional structure of the CNS, if desired.

As a first result, the present study demonstrates that MUS, FLU, and VER effects on network activity are characterized by an overall decrease in spiking and bursting activity in a potent and concentration-dependent manner. These results are consistent with patch-clamp and MEA recordings from previous studies (Xia et al., 2003) where FLU decreased the number of spikes and bursts, decreased the percentage of spikes occurring in a burst, and increased both the ISI and IBI or indirectly inhibited electrical activity by enhancing GABAergic transmission (Ye et al., 2008).

The effects that we observed with FLU on dissociated neuronal cultures are in agreement with published data on primary cultures (frontal and auditory cortices) showing that  $10-20 \,\mu$ M FLU, similar to the range that we used, induced complete inhibition of electrical activity (Xia et al., 2003).

Compound	F value with DF	Estimate interlab variability	Estimate intralab variability	Sign. difference	р
MUS	F(4,27) = 3.86	0.078	0.020	No	0.015
VER	F(3,24) = 1.32	5.89	4.46	No	0.29
FLU	F(4,40) = 5.88	28.6	4.86	Yes	0.134
FLU*	F(2,20) = 2.22	9.48	4.27	No	0.0008

The variable F with the dataset degrees of freedom (DF) was obtained as the ratio between the estimate inter- and intra-lab variability and is submitted to the statistical test. Both the estimate intra- and interlab variabilities are obtained with the sum of squares of the differences with the corresponding means. p is the critical probability value of the corresponding F. When a significant difference in the dataset was detected a post hoc multiple comparisons test (Newman–Keuls) with level of confidence p = 0.01 was run to perform pairwise multiple comparisons and detect more in detail the ones which were different. In the last row of the table FLU\* indicates refined statistical analysis when the IC<sub>50</sub> values for FLU from both EPA and CNNS were excluded from the dataset.

Compound	LDH in neurobasal at the start of the recording	50% WO	100% WO	LDH in the Medium (neg. control)	Triton X-100
FLU	21	13	5	1	172
VER	22	20	13	4	147
MUS	21	18	13	2	264

Viability of cells on MEAs was assessed by measuring LDH release in the medium before and at the end of an experiment during the 2-steps washout (WO) procedure. The measurement was performed with the Cobas Integra 400 System (F. Hoffmann-La Roche AG, Basel, Switzerland) and values are expressed as IU/I.

The present experiments demonstrate that *in vitro* NNs retain electrical responses which resemble those from their original brain tissue. In fact our results gave evidence that the three compounds exerted inhibition of spontaneous activity at a similar magnitude compared to what previously observed *in vivo* and on primary cultures (Wada et al., 1995; Heinke et al., 2004; Darbin and Wichmann, 2008).

These effects are consistent across:

- four different cortex sources, namely mouse cortex (E14–15), cryopreserved mouse cortex (E14–15), rat cortex (E16–18), and new born (0–24 h) rat cortex;
- six culture cell-chip practice protocols;
- two different recording platforms (Multi Channel Systems and Plexon);
- three different spike detection methods (two commercial and provided with recording system and one method developed "in house").

Basing on the differences detected with FLU one recommendation is to narrow the time window for recording in relation to the culture age. In fact when considering only the experiments on embryonic neuronal cultures at younger age the results obtained were consistent and the intralaboratory and interlaboratory variabilities were also comparable.

During drug development and pharmacological evaluation, an efficient and reliable experimental platform is needed for drug screening prior to *in vivo* whole animal testing. The multi-unit recording of cultured NNs represents a valuable advance with many advantages, including better control of compound concentrations, moderate throughput rates (it is possible to record from different systems in parallel), and easy data interpretation.

The present study has demonstrated the reproducibility of the MEA approach for three pharmaceutical compounds. The reproducibility and the sensitivity of this method make it an eligible candidate tool for systematic analysis and priority ranking of chemical compounds for hazard assessment.

However, to gain acceptance as a potential approach for screening and prioritizing chemicals for potential neurotoxicity, additional studies need to be conducted that examine broader classes of neuroactive/neurotoxic chemicals, and approaches for compound classification (Gross et al., 1997; Chiappalone et al., 2003; Gramowski et al., 2004) must be extended to also include well known classes of neurotoxicants. Future studies are planned to examine effects of neurotoxic and non-neurotoxic compounds and describe further relative potency and structure–activity relationships. The results of such studies will provide further proof of principle that MEA recordings will be useful for neurotoxicity testing.

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