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Epigenome Interactions with Patterned Neuronal Activity

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Abstract

The temporal coding of action potential activity is fundamental to nervous system function. Here we consider how gene expression in neurons is regulated by specific patterns of action potential firing, with an emphasis on new information on epigenetic regulation of gene expression. Patterned action potential activity activates intracellular signaling networks selectively in accordance with the kinetics of activation and inactivation of second messengers, phosphorylation and dephosphorylation of protein kinases, and cytoplasmic and nuclear calcium dynamics, which differentially activate specific transcription factors. Increasing evidence also implicates activity-dependent regulation of epigenetic mechanisms to alter chromatin architecture. Changes in three-dimensional chromatin structure, including chromatin compaction, looping, double-stranded DNA breaks, histone and DNA modification, are altered by action potential activity to selectively inhibit or promote transcription of specific genes. These mechanisms of activity-dependent regulation of gene expression are important in neural development, plasticity, and in neurological and psychological disorders.

Keywords

chromatin remodeling; activity-dependent plasticity; oscillation; temporal coding; transcranial magnetic stimulation; behavior-dependent gene expression

Environmental information is encoded by neurons through the firing of action potentials with specific spiking patterns (temporal coding) (Kayser and others 2009); therefore, gene expression in the nervous system must be regulated by the temporal features of action potential firing to produce adaptive responses. In addition to temporal coding, neural activity across populations of neurons can summate to create local field potentials that fluctuate in intensity at specific frequencies, transiently coupling activity in networks of neurons to coordinate information processing by the degree of coherence and synchrony of brainwaves and neuronal oscillations (Buzsáki and Draguhn 2004; Bonnefond and others 2017). Neural oscillation patterns have correlates with specific behaviors and are associated with aspects of cognitive function such as memory, attention, and skill learning (Corlier and others 2016; Di

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Nota and others 2017; Friese and others 2013), suggesting the possibility of changes in gene expression associated with specific frequencies of neuronal oscillation are essential components of frequency-specific behaviors.

Neuronal activity-dependent changes in gene expression are classically attributed to intracellular calcium kinetics activating calcium-dependent protein kinase cascades, ultimately recruiting activated transcription factors in the nucleus. However, this is only one aspect of how context-specific action potential patterns can regulate expression of an appropriate gene network. Along with calcium-dependent and calcium-independent cytosolic signaling from neuronal firing, intranuclear events that may be regulated by the temporal features of neuronal firing have been much less studied, but increasing evidence suggests the importance of activity-dependent modification of chromatin structure in regulating gene expression.

Expression of genes requires a network of interactions between DNA, which is wrapped into a dynamic three-dimensional chromatin structure, along with heterogenous transcription machinery composed of protein factors, and non-coding RNA. Furthermore, a diverse array of epigenetic modifications come together to create biochemical marks on proteins or DNA nucleotide bases to allow for the specialized gene expression in individual cells adapted to unique and stimulating environments. In this review, we summarize the current understanding of neural information transduction into the nucleus with temporal specificity, with an emphasis on the connection between unique neuronal activity patterns and interactions within the epigenome to produce and maintain a stimulus-specific transcriptome.

Evidence of Action Potential Pattern-Specific Gene Expression

Rhythmic Magnetic and Optogenetic Stimulation

Transcranial magnetic stimulation (TMS) provides compelling evidence that gene expression is regulated by specific patterns of neuronal firing and neural oscillations in vivo. For example, repetitive TMS using an intermittent pattern of theta-burst frequency for 2 weeks following a stroke injury in rat upregulates 52 genes involved in angiogenesis, inflammation, neuroprotection and neuronal plasticity, while repetitive TMS at a constant 1 Hz or 5 Hz frequency had no effect on gene expression (Ljubisavljevic and others 2015). In another study, the immediate early genes (IEGs) *c-fos* and *zif268*, both of which are implicated in synaptic plasticity, were found to be differentially expressed in response to distinct patterns of TMS (Aydin-Abidin and others 2008).

An in vitro study used 5 different patterns of repetitive magnetic stimulation in a study of gene expression and intracellular calcium transients. Coils positioned outside culture dishes were used to drive magnetic fields through the preparation to excite neuronal firing in primary cell cultures isolated from mouse cerebral cortex (Grehl and others 2015). All patterns of stimulation elevated intracellular calcium to a similar extent, but the pattern of gene expression was highly dependent on the stimulation pattern. Thus, regulation of gene expression by neuronal firing is not simply explained by the amplitude of intracellular calcium concentration generated by different stimulus patterns. These different patterns of

stimulation had functional consequences, as shown by phenotypic effects on neuronal morphology and survival, which were consistent with the expression changes in genes implicated in neuron morphology and survival (Grehl and others 2015).

Other studies using electrical stimulation of awake adult rats (Ryan and others 2012) or rat hippocampal slices (Bukalo and others 2016; Lee and others 2005), in patterns that induce long-term potentiation (LTP) or longterm depression (LTD), show that the temporal pattern of gene expression in hippocampal neurons is altered differently by the different stimulus patterns (Bukalo and others 2016; Lee and others 2005; Ryan and others 2012). LTP-associated gene expression profiles also differ when stimulation is applied via synaptic input or action potential firing (Dudek and Fields 2002). Taken together, these findings illustrate the importance of both the temporal pattern and spatial component of neuronal activity in the subsequent activity-induced gene expression.

More recently, studies using optogenetic stimulation of *Drosophila* to activate different patterns of firing in the fly's nervous system, have been used to investigate this question. RNA-sequence data from *Drosophila* neurons activated by two stimulation paradigms indicate that each stimulation paradigm produces unique expression of activity-regulated genes (Chen and others 2016) (Fig. 1). To explain mechanisms driving activity-dependent expression of genes, Chen and others determined the kinetics of activity-regulated gene enrichment at different time-points. The majority of the transcripts sampled did not reach maximal expression until 60 minutes after robust, non-patterned LED-light induced depolarization. Analysis of chromatin compaction, by using transposase-accessible sequencing (ATAC-seq) indicates that the transcription start sites of activity-related genes were more open prior to stimulation (Chen and others 2016). Interestingly, this group also reports that different neuron populations each generate different sets of activity-regulated transcripts after undergoing the same stimulus paradigm.

However, using these various approaches of stimulating neural networks in vivo and in vitro, it is difficult to control the precise pattern of action potential firing, because the neurons are interconnected by excitatory and inhibitory synapses, and they typically exhibit spontaneous firing in complex patterns and bursts, making these methods an insufficient test of the hypothesis that gene expression is regulated by the temporal pattern of action potential firing. With these experimental approaches, the frequency-dependent effects of stimulation on gene expression are most likely related to changes in overall network excitability that is influenced by the different patterns of applied stimulation. In general, low-frequency TMS (1 Hz) decreases cortical network excitability and higher frequency stimulation (5 Hz and above, and theta-burst stimulation) increase network activity (Aydin-Abidin and others 2008).

Patterned Electrical Stimulation of Axons

To test directly the hypothesis that gene expression is regulated by the temporal patterning of action potential firing, cell cultures of mouse dorsal root ganglion (DRG) neurons have been stimulated by electrodes in combination with calcium imaging and analysis of gene expression. DRG neurons do not have dendrites nor do they form synapses on other DRG neurons. These neurons are not spontaneously active in cell culture and in response to brief

pulses of electrical stimulation, they fire a single action potential, rather than a train of action potentials (Fields and others 1992). With the ability to precisely control the pattern of action potential firing, DRG neuron cultures are therefore an ideal method to test whether temporal patterns of action potentials affect gene expression. Using four stimulation paradigms, Fields and others (1997) demonstrate that specific action potential patterns cause differential gene expression in neurons. The experimenters determined that expression of *c-fos* correlates inversely with the length of interval between consecutive stimuli presented at different frequencies and does not correlate with the net concentration of cytosolic calcium (Fields and others 1997). To explain this phenomenon, the authors analyzed the calcium-dependent intracellular signaling cascades and activation of the transcription factor cyclic-AMP response element binding protein (CREB), in response to the four firing patterns that differentially regulate expression of *c-fos*. The results indicate that changes in gene expression induced by the temporal features of action potential firing are in part a consequence of differences in the kinetics of activation and inactivation of calcium-dependent protein kinases and transcription factors controlling gene transcription in response to membrane depolarization. This and additional mechanisms for regulating gene expression by temporal coding of action potential firing will be considered in the next section.

Encoding Transients of Neuronal Activity in the Cytosol and Nucleus

Intracellular Signaling from Membrane Depolarization to Transcription Factors

Stimulus-specific changes in gene expression require the transduction of synaptic activity patterns into the nucleus with accurate temporal integrity. Calcium signaling activated by membrane depolarization is highly implicated in expression of genes, in part through activation of protein kinase C and ERK/MAPK signaling pathways to modulate many downstream transcription factors (Cohen and Greenberg 2008; Flavell and Greenberg 2008; Adams and others 2000). Transcriptome analysis following pharmacological depolarization of neurons has been valuable in identifying and characterizing many “activity-dependent genes” (Coba and others 2008; Hunsberger and others 2005; Pham and others 1999). In various cell types, IEGs, such as *c-fos* and *c-jun*, increase expression rapidly following neuronal stimulation, without the need for de novo protein synthesis. This rapid transcription occurs through activation of specific transcription factors (Bahrami and Drabløs 2016), the most widely studied being phosphorylation of the calcium-responsive transcription factor CREB (Pham and others 2000). Synaptic activity mediated through the excitatory neuronal receptor NMDA (*N*-methyl-D-aspartate) can activate the ERK signaling pathway and result in downstream activation of calcium-calmodulin kinase IV (CaMKIV) (Bito and others 1996). CaMKIV enters the nucleus to phosphorylate CREB allowing the CREB-binding protein (CBP) to form a complex and mediate transcription (Bito and others 1996; Impey and others 2002). This mechanism was thought to dominate activity dependent gene expression as it provided a clear connection between calcium kinetics and nuclear transcription factor activation (Impey and others 2002). However, while phosphorylation of CREB and the CBP complex mediate plasticity-related gene expression (Barco and others 2002; Impey and others 2002), electrical stimulation of DRG neurons by different frequencies and patterns of action potentials readily induces prolonged phosphorylation of

CREB, but with kinetics that would be unable to maintain temporal-specific integrity of many stimulation patterns (Fields and others 1997).

Stimulating action potentials in mouse DRG axons at 10 Hz in 1.8-second bursts, (18 action potentials, with a 1-minute interburst interval, referred to as 18/1) or for 9 seconds (90 action potentials, with a 5 minute interburst interval, referred to as 90/5), both deliver the same total number of action potentials at the same 10 Hz frequency during the experimental time course, but expression of many genes was found to be differentially regulated by these two action potential firing patterns. Gene expression analysis by genome-wide microarray performed after 2 and 5 hours of stimulation at these two patterns detected 2901 mRNA transcripts that were differentially expressed between the two stimulus patterns. Interestingly, genes that were upregulated by one stimulus pattern were typically downregulated by the second pattern (Fig. 2). Classically, gene expression that is regulated by neuronal firing has been considered a special property of IEGs, but this study shows that thousands of genes coding a wide range of proteins are regulated by the temporal features of action potential firing. Given this evidence that thousands of neuronal genes are not only activity-regulated but firing pattern-regulated suggests that many other signaling pathways, in conjunction with calcium signaling resulting in phosphorylation of CREB, must be involved. In support of this, after categorizing the differentially regulated genes based on their known functions, the authors conclude that 18 canonical signaling pathways were activated depending on the stimulus pattern. Similar to intracellular signaling pathways in the cytoplasm, intranuclear events are also sensitive to the pattern of action potential firing.

Nuclear Calcium

In addition to cytosolic signaling, neuronal firing patterns are encoded into corresponding nuclear calcium transients (Bengtson and others 2010; Hardingham and others 2001). Repetitive high frequency or theta burst stimulation paradigms used to experimentally induce LTP, produce waves of nuclear calcium (Bengtson and others 2010). Nuclear calcium dynamics correlate to the temporal pattern of environmental stimulus (Bengtson and others 2010; Hardingham and others 2001). Therefore, changes in nuclear calcium concentration might contribute to the processes by which environmental stimuli manifest in alternative gene transcription (Bading and others 2000). For example, nuclear calcium has been shown to bind nucleosomes and stabilize DNA-histone interactions (Yang and Hayes 2011). (Activity-dependent chromatin remodeling will be considered in greater depth separately in this review.) In particular, calcium ions modify nucleosome compaction, promoting chromosome condensation (Phengchat and others 2016). Nuclear calcium dynamics can act independently of cytosolic signaling to produce expression of CREB-dependent genes (Hardingham and others 2001). It is important to note, however, that the role of nuclear calcium transients as a medium for encoded synaptic information is debated, as some findings indicate that nuclear calcium dynamics do not appear to be tightly influenced by robust cytosolic calcium changes (Al-Mohanna and others 1994; Leite and others 2003), unlike the studies identified above. Taken together, the literature suggests that environmental stimuli may be converted into nuclear calcium dynamics, which have the ability to modulate and induce gene expression.

Transcription Factor Binding Sites

The study mentioned previously, Lee and others (2017), determined that activity-dependent expression of genes in DRG neurons is regulated on a genome-wide scale according to temporal features of action potential firing. By hypothesis, genes may be differentially sensitive to distinct action potential firing patterns by virtue of having multiple transcription factor binding sites in the regulatory elements throughout enhancer and promoter regions. If transcription factor activation occurs in response to only a subset of action-potential patterns, then pattern-dependent gene expression may arise when a transcription factor is preferentially recruited based on the stimulus provided, and subsequently binds to its motif inducing expression of only a certain set of downstream genes. To test this hypothesis, the authors analyzed the regulatory regions of the genes that were differentially affected by the two stimulus patterns applied. Using distant regulatory elements of co-regulated genes (DIRE), the authors found enrichment of certain transcription factor binding sites in the two sets of genes that were differentially regulated by the two patterns of stimulation. For example, transcription factors associated with activation of ERK/MAPK pathways were enriched in genes responding to the 18/1 stimulus pattern while canonical calcium signaling transcription factors are overrepresented in genes responding to the 90/5 stimulation (Lee and others 2017).

The authors conclude that differential transcription in response to distinct neuronal firing patterns is the result of cytosolic signaling pathway activation and enrichment of transcription factor bindings sites in different genes. Beyond these important considerations, more questions remain. If the expression of a gene or a gene network is altered based on the pattern of neuronal activity, and the expression of gene is dependent on the local and distal epigenetic architecture, what is the role of dynamic epigenetic modifications in neural pattern specific gene expression?

Neuronal Activity and Epigenetic Interactions

Experience-Dependent Epigenetic Modification

The new field of “neuroepigenetics” characterizes how the epigenetic landscape allows neurons to respond to unique environmental stimuli (reviewed further by Cholewa-Waclaw and others 2016; Grigorenko and others 2016; Riccio 2010). The most well-characterized epigenetic marks include histone methylation (Allfrey and others 1964), acetylation (Allfrey and others 1964), phosphorylation (Gutierrez and Hnilica 1967; Stevely and Stocken 1966), sumoylation (Kang and others 2001), and DNA methylation (Gold and others 1963). Each of these marks are a molecular addition to the protein or DNA to alter its biophysical interactions, such as introducing steric hindrance or by altering the strength of ionic interactions between charged histone tails and the negatively charged DNA sugar phosphate-backbone (recently reviewed by Yao and others 2016). While many features of the epigenome have been studied, continued research into known modifications as well as identification of novel and biologically elusive modifications is an active, ongoing field of research. In Table 1, we briefly summarize the most characterized histone tail and DNA modifications in neuroscience literature (Cao and Yan 2012; Cubenas-Potts and Matunis

2013; Huang and Dixit 2016; McConnell and Wadzinski 2009; Rossetto and others 2012; Roth and Sweatt 2009).

Epigenetic regulation can occur in response to environmental factors such as stress (Fuchikami and others 2010) and visual experience (Ruan and others 2016). Learning and memory are associated with histone modifications (Bredy and others 2007; Gupta and others 2010; Stefanko and others 2009; Blank and others 2014) and altered chromatin structure due to DNA double stranded breaks at the promoters of immediate early genes (Madabhushi and others 2015; Watson and Tsai 2017). Trans-generational effects of environmental enrichment on memory are associated with DNA methylation and histone modification (Arai and Feig 2011). Long-term memory is regulated by histone acetylation, and disruption of histone acetyltransferase (HAT) activity impairs long-term memory (Halder and others 2016; Pandey and others 2015; Rossetto and others 2012; Roth and Sweatt 2009). Augmenting acetylation by histone deacetylase (HDAC) inhibitors can enhance memory formation (Bieszczad and others 2015; Roth and Sweatt 2009). Conversely, eliminating the metabolic enzyme that synthesizes acetyl-CoA (acetyl-CoA synthetase 2), thus reducing acetyl group availability, reduces transcription of canonical memory-related neuronal genes and impairs long-term spatial memory (Mews and others 2017). Fear conditioning is hallmarked by rapid methylation of memory-repressive genes and demethylation of memory-associated genes (Roth and Sweatt 2009).

A wide range of cognitive disorders are associated with epigenetic regulation, including alcohol and drug addiction (Basavarajappa and Subbanna 2016; Kim and others 2017), psychotic disorders including schizophrenia (Costa and others 2003; Ruzicka 2015), and Alzheimer's disease (Cuadrado-Tejedor and others 2015). Epigenetic remodeling is similarly reported with developmental and physiological changes such as pain (Géranton and Tochiki 2015), nervous system development (Yoo and Crabtree 2009), aging (Pina and others 1988; Sen 2015; Singh and Thakur 2017), and synaptic plasticity (Maze and others 2015; Zhu and others 2016).

While features of the epigenetic architecture are widely associated with both neurological behaviors and pathology, the molecular interplay between neuronal activity and the epigenome in neuronal populations remains largely unexplored. As a note, the limitation of the following studies, similar to activity-dependent findings discussed above, is that many have yet to examine the temporal kinetics of action potentials that allow neuronal responses to be biologically relevant to the experiences and behaviors encoded by said action potentials. A summary of notable publications providing evidence of epigenetic interactions regulating stimulation pattern specific neuronal activity-dependent gene expression are featured in Table 2 and synthesized in Figure 3.

Chromatin Structure and Dynamics

Three-dimensional chromatin structure is defined on a small scale by spacing of nucleosomes, which wrap ~200 DNA nucleotides, and on a larger scale by topographically associated domains (TADs) which span hundreds to thousands of kilobases (Dixon and others 2012). TADs can be defined at their boundaries by the insulating DNA binding protein CCCTC-binding factor (CTCF) (Narendra and others 2015). Hi-C, a chromatin

conformation capture method used to illustrate DNA-DNA interactions, reveals DNA-DNA interactions are most enriched between sequences within the same TAD (Rao and others 2014). The boundaries of TADs as defined by binding of CTCF at the CTCF binding motif largely influence interactions such as those occurring between enhancers and promoters (Dixon and others 2016). The interactions between DNA, RNA, and protein used to first identify, then transcribe the appropriate sequence necessary for cell function requires epigenetic marks on histones and DNA to shape the physical architecture and accessibility of regions within the genome. The theory of a universal histone code, such that each mark is associated with a consistent biological function like “activating” or “inhibiting,” has been frequently debated (Rando 2012). Despite this, each mark is highly informational to the appropriate architecture of chromatin allowing sequences of nucleotides, whether they may act as enhancer or promoter elements, or are transcribed into non-coding RNA or protein coding regions, to become accessible or hidden depending on tissue and developmental stage context. One important context is the ability to respond and “remember” incoming environmental stimuli (Ravi and Kannan 2013).

Neuronal Activity and Chromatin Remodeling

Analysis of genome-wide chromatin compaction generated from ATAC-seq data using dentate granule neurons before and after acute electroconvulsive stimulation reveals ~50,000 new open chromatin regions primarily occurring in introns and intergenic regions (Su and others 2017). To associate the alternative chromatin accessibility regions with TADs previously characterized from cortical neurons, the ATAC-seq data was compared to previously compiled CTCF chromatin immunoprecipitation (ChIP) and histone modification ChIP data to reveal colocalization of newly opened sites with the known activating marks: methylated lysine 4 in histone 3 (referred to as H3K4me1) and acetylated lysine 27 of histone 3 (H3K27Ac) (Su and others 2017). RNA-seq of stimulated neurons reveals overlap of upregulated mRNA expression and regions with gained chromatin opening (Su and others 2017). ChromHMM analysis, used to characterize chromatin states, demonstrated active enhancer regions experience the most robust effects of chromatin remodeling following neural stimulation (Su and others 2017). It is important to note that this article does not explore how neuronal activity translates from cytosolic calcium signaling kinetics, into a change in nuclear protein interactions. While this study demonstrates crucial advancements in our understanding of neuronal activity and constant chromatin remodeling, the experimenters do not account for temporal specificity of neural activity that is essential to encode environment and behavior-specific information. It is therefore essential to first update the CTCF ChIP databases to include stimulated neurons, because it has not yet been shown that stimulation alters CTCF-DNA binding, and secondly apply physiologically relevant patterned stimuli to understand how these genome-wide features maintain temporal integrity.

At specific genomic regions, neuronal activity can induce relocation of gene loci and specific enhancer-promoter looping contacts for transcriptional regulation (Madabhushi and others 2015; Watson and Tsai 2017). Neuronal activity-dependent DNA double-stranded break formation in the promoter of immediate early genes can overcome repressive

topological constraints to allow for rapid activity-induced transcription (Madabhushi and others 2015; Watson and Tsai 2017).

Neuronal Activity and Histone Modifications

Genome wide changes in histone modifications have also been associated with neuronal activity. Robust depolarization with KCl resulted in increased H3K27ac and H3K4m3 marks and decreased H3K9m3 and H3K27m3 marks at the tyrosine hydroxylase promoter of neural precursor cell prior to KCl-induced differentiation into dopaminergic neurons (He and others 2011). Studies thus suggest neuronal activity can drive differentiation of cells through regulation of histone modifications. Interestingly, *in vitro* experiments in rat liver cells demonstrate that histone H1 responds to elevated calcium with a conformational change (Tarkka and others 1997). Taken together with the nuclear calcium signaling dynamics that may regulate transcription (Bengtson and others 2010), binding between temporally regulated nuclear calcium concentration in response to action potential activity and H1 histone binding present an intriguing and plausible mechanism for activity-induced, potentially pattern-specific, changes in chromatin structure.

Emerging evidence demonstrates enzymatic activity of histone modifying proteins are regulated by RNAs (Bose and Berger 2017). As whole genome sequencing improves, the existence and function of non-coding RNAs (ncRNAs) is becoming a major consideration. ncRNA transcribed from enhancer regions (eRNAs) is found to act as a scaffold between enhancers and promoters, and assists in chromatin looping and transcription factor binding ultimately affecting the abundance of transcripts (Bose and Berger 2017; Rajarajan and others 2016). eRNAs have widespread influence on the genome evidenced by RNA-seq data from E14.5 whole mouse tissue analysis that reveals about 70% of enhancers identified in DNA isolated from brain tissue transcribe eRNAs (Cheng and others 2015).

Important new experiments pairing photoactivatable ribonucleoside-enhanced crosslinking and immunoprecipitation (PAR-CLIP) to analyze RNA-protein interactions with *in vitro* enzyme activity assays reveal ncRNAs, including eRNAs, bind CREB-binding protein (CBP) and enhance its histone acetyltransferase (HAT) activity in the CBP active site (Bose and others 2017). HAT activity and H3K27ac marks are often associated with increased transcription (Bose and Berger 2017). Ultimately, the involvement of eRNAs in epigenetic modification regulation presents an intriguing layer of regional or target gene specificity in response to neuronal activity. With many recent advancements to understand eRNA function, temporal or localized characteristics of eRNA transcription and binding is hot topic in molecular biology and may have important implications for intricacies within pattern specific activity-dependent neuronal gene expression.

Neuronal Activity and DNA Modifications

Neuronal activity applied *in vitro* produces *de novo* methylation and rapid demethylation in a reported 1.4% of CpG dinucleotides in neurons isolated from dentate gyrus neurons (Guo and others 2011). Alterations in methylation due to activity lasted weeks after stimulation (Guo and others 2011). Interestingly, *de novo* DNA methylation can negatively regulate CTCF binding on DNA (Bell and Felsenfeld 2000). In addition to effects on CTCF binding,

gene-ontology analysis by Guo and others (2011) suggest activity-modified CpGs were most enriched at genes and motifs involved with splicing variants (Guo and others 2011). Altered DNA methylation genome-wide may be explained by the activity of DNA methyltransferases (DNMT) DNMT1 and DNMT3a (Day and others 2013; Sharma and others 2008). DNMT3a ChIP assay results indicate neuronal activity induced with the sodium channel agonist alters DNMT3a-DNA binding as well as subsequent IEG expression (Day and others 2013). Depolarization of cultured cortical neurons with KCl and sodium channel agonist veratridine results in decreased mRNA of DNMT1 and DNMT3a (Sharma and others 2008). Thus, differences in DNA methylation due to neuronal activity may occur via an indirect process. Changes in methylation have also been reported in vivo. Induction of LTP with high-frequency stimulation in rats produce differential methylation of LTP-associated genes as measured with a methylated DNA immunoprecipitation assay (Maag and others 2017). Levels of methylation were correlated with RNA-seq data at multiple timepoints after stimulation and indicated both up and down regulation of LTP-associated genes where alternative methylation occurred (Maag and others 2017). Importantly, the experiments performed by Maag and others present compelling evidence connecting a behaviorally relevant stimulus with pattern-dependent epigenetic alterations. While these authors focus on a predetermined set of genes, eventually performing a genome-wide analysis of sequences with altered epigenetic interactions will allow for a broader understanding of the pattern-specific epigenetic changes associated with many behaviors.

Future Questions and Conclusion

The majority of research in this field has demonstrated that generalized neuronal depolarization affects both gene expression and the epigenetic landscape (reviewed by Cortés-Mendoza and others 2013; Flavell and Greenberg 2008; West and Greenberg 2011). Yet, environmental information is encoded in patterns of action potentials and further, recent findings indicate that alternative gene expression occurs on a neuronal firing pattern-dependent manner (Lee and others 2017). To understand how specific populations of neurons maintain context dependent role, it is essential to look to the interactions between the epigenetic architecture and the intracellular propagation of neuronal activity into the nucleus. Specifically, addressing novel and essential questions surrounding how the temporal integrity of distinct frequencies of stimulation is maintained in the interplay between activity and epigenetic modifications to produce pattern specific alternative gene expression will prove invaluable to the field. Which epigenetic modifications are altered with stimulus pattern integrity? Do these malleable protein, DNA, and RNA constructs work alone or in combination? How do protein activation cascades or calcium transients propagate from the cytoplasm to the nucleus with temporal specificity? How are protein and nucleotide structures modified by cytoplasmic and nuclear signaling cascades? Are there certain genes or genomic regions that are more highly modified by activity? Are these regions conserved across differentiated neuron populations? How do separate differentiated cells respond differently to the same stimulus? What aspects of the genomic architecture maintain a differentiated specialized neuron state versus what aspects are highly malleable based on cellular activity? Furthermore, intricacies in the type of stimulus and the networks of genes expressed suggests that the currently characterization of “activity-dependent genes” due to

robust depolarization might miss genomic regions that are opened and expressed during more specific or intermediate types of neuronal stimulation.

From the neuroscience perspective, activity dependent gene expression is an important and fascinating phenomenon underlying the neuronal plasticity critical for learning and memory. From the molecular biology perspective, epigenetic remodeling in response to constant and persistent temporally unique stimuli presents an ideal system to discover stimuli-induced modulation of interactions between three-dimensional chromatin structures, subsequent DNA-DNA interactions, as well as DNA-protein interactions. Expanding the knowledge of epigenetics mediating neuronal cell responses to activity presents exciting and major interdisciplinary questions in cognitive neuroscience, cellular neuroscience and molecular biology.

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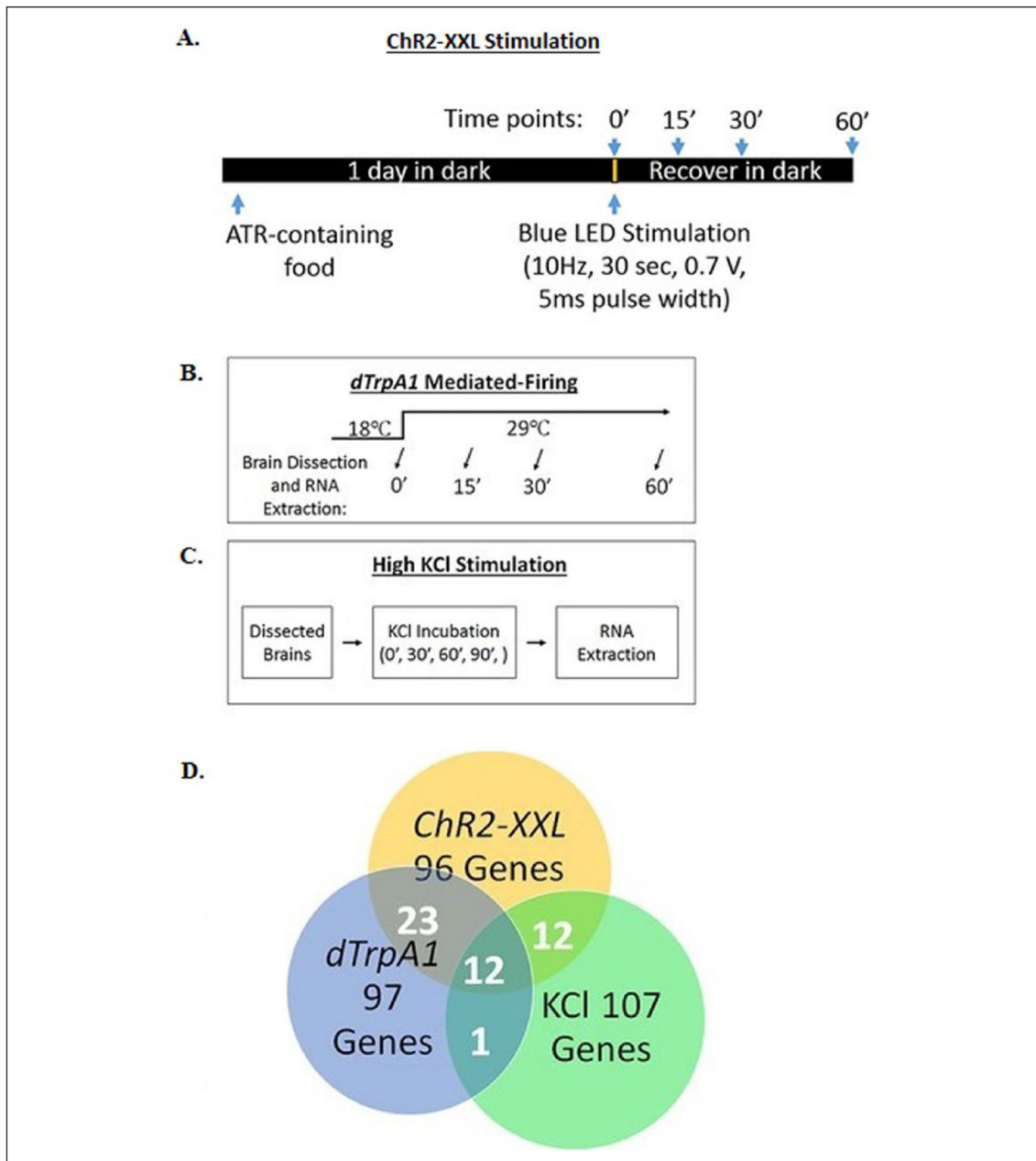


Figure 1.

Activity-dependent transcripts in *Drosophila* vary based on neuronal stimulation type. (A) Schematic for optogenetic stimulation of channelrhodopsin-2-XXL (ChR2) expressing neurons under Gal4 control with blue LED light. (B) Schematic for heat induced activation with *dTrpA1* heat-sensitive cation channel. (C) Schematic for robust depolarization with KCl treatment. (D) Overlapping expression of activity induced genes based on stimulation paradigm. Data generated from high throughput deep sequencing of mRNA libraries isolated from stimulated *Drosophila*. Figure adapted from Chen and others (2016).

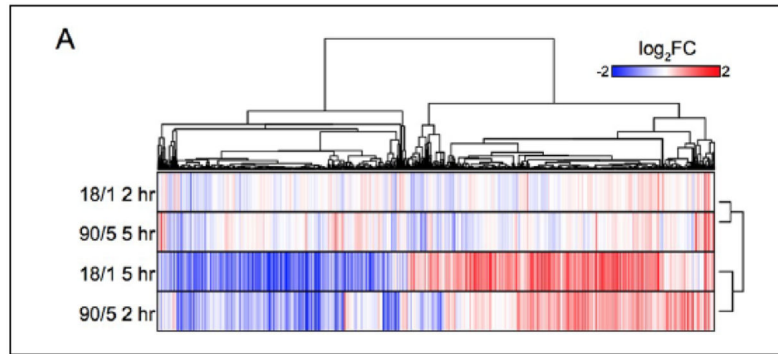


Figure 2.

Specific patterns of action potentials induce differential gene expression in mammalian dorsal root ganglion neurons (DRGs). Heat map represents RNA-seq data from DRGs after 10 Hz stimulation for 1.8 seconds with a 1-minute interval (18/1) or for 9 seconds with a 5-minute (90/5) interval for 2 or 5 hours (Lee and others 2017). Blue indicates downregulation of mRNA and red indicates upregulation of mRNA. Reprinted from Lee and others (2017).

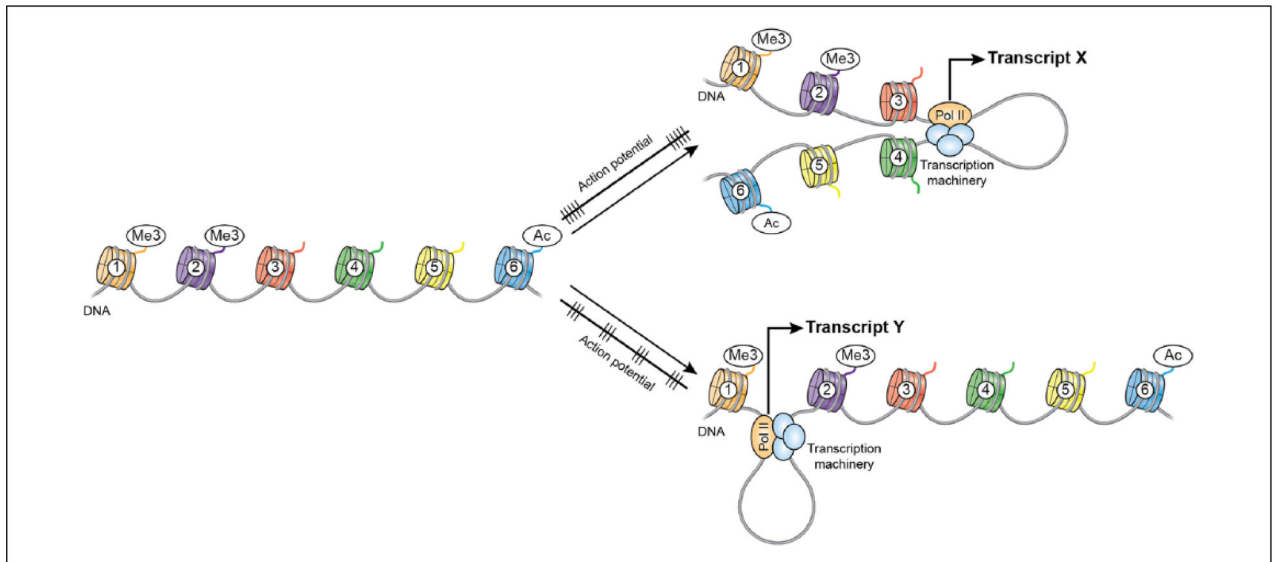


Figure 3.

Dynamic structures of the neuronal epigenome allow for encoded neural activity to produce targeted and controlled pattern-dependent gene expression in response to temporally specific neuronal activation. The unknown molecular mechanisms leading to pattern-specific gene expression present exciting questions for molecular, cellular and cognitive neuroscience and biology fields. Schematic illustrates DNA wrapped around histones (colored cylinders) each marked with representative histone protein modifications (labeled circles attached to histone tail). Straight line with perpendicular dashes beside arrows indicate action potential patterns.

Table 1. Biochemical Regulation of Chromatin Architecture with Histone and DNA Modifications.

Modification Class	Biochemical Action	Effect on Chromatin Architecture	Effect on Transcription	Inactivation	Pharmacology
Histone Acetylation	Transfer of acetyl group to NH ₃ groups of lysine residues by histone acetyltransferase, e.g., cyclic-AMP response element binding protein (CREB)	Most commonly, decreases affinity of histones with DNA and relaxes chromatin structure	Usually associated with transcriptional activation by increasing recruitment of transcription factors	Histone deacetylation via histone deacetylases (HDACs)	HDAC inhibitors Trichostatin A, sodium butyrate, valproic acid, suberoylamide hydroxamic acid
Phosphorylation	Phosphorylation of serine, threonine, and tyrosine residues by protein kinases	Chromatin relaxation or compaction	Usually associated with transcriptional activation by proteins containing phosphorbinding modules, e.g., 14-3-3 and BRCT (BRCA1 C-terminus) domains, regulates histone acetylation and methylation	Phosphatases	To promote phosphatase activity: protein serine/threonine phosphatase (PSTPs), protein tyrosine phosphatase (PTPs) or dual specific phosphatase (DSPs). To inhibit: phosphatase inhibitor cocktails
Methylation	Methylation of lysine, arginine residues of histones (H3 and H4) by histone methyltransferase	Generally associated with relaxing chromatin compaction	Promote or inhibit gene transcription depending on methylation site and number of methyl groups attached	Generally irreversible, but histone demethylases are known	Histone methyltransferase inhibitors and demethylases
Ubiquitination	Addition of ubiquitin to lysine residues by ubiquitin ligases	Chromatin condensation by histone degradation	Gene silencing or transcriptional activation	Deubiquitinating enzymes (DUBs)	Ubiquitin E1 enzyme inhibitors: PYR-41 and PYD-4409
SUMOylation	Small ubiquitin-related modifiers (SUMOs)	Multifaceted regulator of DNA methylation, histones, and transcription regulators	Generally associated with gene inactivation, but also gene activation by enhancing chromatin accessibility	Desumoylating enzymes, metalloproteases	SUMOylation inhibitor: 2-D08
DNA Cytosine methylation	Covalent addition of CH ₃ group to cytosine adjacent to guanine nucleotides (CpG islands) by DNA methyltransferases (DNMTs)	Recruits methyl-DNA binding proteins; e.g., HDACs to compact chromatin	Usually associated with suppression of gene transcription	Generally irreversible, demethylation enzymes not well established	DNMT inhibitors include azacytidine (Vidaza), decitabine (Dacogen), RG108, zebularine

Table 2.
Evidence for Neuronal Activity Pattern-Specific Changes to Gene Expression or Epigenetic Modifications.

Publication	Cell Type	Stimulation Type	Analogous Behavior or Disease	Molecular or Epigenetic Feature	Primary Technique	Important Findings
Su and others (2017)	Adult mouse dentate granule neurons	Whole animal in vivo electroconvulsive stimulation	Drug-resistant depression treatment	Genome-wide chromatin compaction	ATAC-seq	Neuronal activity induced 11,438 gained-open and 1739 gained-closed sites by 1 hour after stimulation. Notably, gained-open and gained-closed sites are enriched at active enhancers. C-Fos binding involved in initial chromatin opening at opened sites, but not maintenance of open site over time
Guo and others (2011)	Adult mouse dentate granule neurons	Whole animal in vivo electroconvulsive stimulation	Drug-resistant depression treatment	Genome-wide DNA methylation	Methyl-Sensitive Cut Counting (MSCC) to measure single nucleotide CpG methylation levels	Neuronal activity induced de novo methylation at 1,892 CpG sites and demethylation at 1158 CpG sites
Maag and others (2017)	Neurons isolated from dentate gyrus	LTP induced with in vivo high-frequency stimulation (HFS) to dentate gyrus for 30 minutes, 2 hours, or 5 hours	Hippocampal long-term potentiation	DNA methylation in LTP	Methylated DNA immunoprecipitation (MeDIP)-array	DNA methylation changes occurred in 48 regions after 30 minutes, in 699 regions after 2 hours and in 448 regions after 5 hours. DNA methylation changes due to HFS-induced LTP were uniquely associated with 353 genes that were not associated differential methylation following other stimulation types including contextual fear therapy with and without shock, or electroconvulsion therapy
Lee and others (2017)	Dorsal root ganglion (DRG)	Two patterns (18/1 or 90/5) and two duration lengths (2 hours or 5 hours) for in vitro stimulation: 10 Hz for 1.8 seconds with 1-minute intervals (termed 18/1) or 10 Hz for 9 seconds with 5-minute intervals (termed 90/5)	Patterned neuronal information	Differential expression of gene networks and transcription factor binding	Genome wide microarray in combination with distant regulatory elements of co-regulated genes (DIRE) and gene set enrichment analysis (GSEA)	Networks of genes, beyond the classically defined immediate response genes, are regulated by both kinetics and duration of stimulus pattern. 2501 genes up-regulated by electrical stimulation and 3424 were down-regulated by electrical stimulation. Pattern specific changes attributed to alternative enrichment of transcription factor binding in each stimulation condition.
Chen and others (2016)	<i>Drosophila</i> neurons	Optogenetic stimulation for 30 seconds at 10 Hz in vivo; in vivo heat activated dTrpA1 cation channel opening; ex vivo KCl (90mM) stimulation	Patterned neuronal information	Stimulus-dependent activity-induced gene expression	mRNA high-throughput sequencing, ATAC-seq	Expression of activity-related genes in <i>Drosophila</i> alters based on stimulation paradigm. Within a single stimulation paradigm, activity-regulated genes varied between differentiated neuron types
Bukalo and others (2016)	CA1 neurons from hippocampal slices	Theta-burst stimulation delivered antidromically producing action-potential induced long-term depression (AP-LTD)	Memory consolidation during Slow-wave sleep	Differential expression of exons within the same gene after AP-LTD stimulation	RT-PCR	Antidromic AP-LTD induction significantly decreased mRNA transcripts containing BDNF exon I or exon II after 15 minutes, while mRNA transcripts containing exons IV or IX were unaffected at the same time-point
Zhao and others (2017)	Dorsal root ganglion (DRG)	Spinal nerve ligation (SNL) and constriction injury of sciatic nerve (CCI)	Neuropathic pain	DNA methylation	Bisulfite pyro-sequencing assay for DNA methylation	DNA methyltransferase (DNMT) 3a, but not DNMT3b, mRNA and protein increased in DRG neurons following peripheral nerve injury. SNL-induced increase in DNMT3a produces increased methylation in the

Publication	Cell Type	Stimulation Type	Analogous Behavior or Disease	Molecular or Epigenetic Feature	Primary Technique	Important Findings
Liang and others (2016)	Dorsal root ganglion (DRG)	Spinal nerve ligation (SNL) and constriction injury of sciatic nerve (CCI)	Neuropathic pain	Histone methylation	Chromatin immunoprecipitation, RT-PCR	promoter region of <i>Kcna2</i> gene, decreasing <i>Kcna2</i> expression mRNA for G9a, the enzyme responsible for the methylation of histone H3 at lysine 9, increases with SNL and CCI, but not sham surgery
Fields and others (1997)	Dorsal root ganglion (DRG)	Four stimulation paradigms each delivering 540 impulses at 10 Hz for 30 minutes. Each paradigm stimulated for 1.8, 3.6, 5.4, or 9.0 seconds with 1-, 2-, 3-, or 5-minute intervals, respectively.	Neuronal bursting activity in utero	Temporal specificity of cytoplasmic and nuclear signaling	Western blot	Phosphorylation of CREB occurs with neuronal activity but does not maintain temporal specificity. Therefore, other factors must account for pattern-specific changes in gene expression
Worley and others (1993)	Hippocampal granule neurons	In vivo hippocampal stimulation in 10 train and 50 train paradigms. "10 train": 10 repetitions at 400 Hz each lasting 25 ms (grouped into 10 pulses, and stimulated for 400 pulses total); "50 train": 50 repetitions at 400 Hz each lasting 20 ms (grouped into 8 pulses and stimulated for 400 pulses total)	Hippocampal long-term enhancement	Relationship between temporally unique stimulation patterns and "activity dependent" transcription factor mRNA abundance	In situ hybridization	10-train stimulation induced significant increase in <i>zif268</i> and <i>juncB</i> but not <i>c-fos</i> or <i>c-jun</i> mRNA levels, by 30 minutes post-stimulation. 50-train stimulation alternatively induced significant increase in <i>zif268</i> , <i>juncB</i> , <i>c-fos</i> , and <i>c-jun</i> at the same time-point