# Modeling the VPAC<sub>2</sub>-Activated cAMP/PKA Signaling Pathway: From Receptor to Circadian Clock Gene Induction

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ABSTRACT Increasing evidence suggests an important role for VPAC<sub>2</sub>-activated signal transduction pathways in maintaining a synchronized biological clock in the suprachiasmatic nucleus (SCN). Activation of the VPAC<sub>2</sub> signaling pathway induces per1 gene expression in the SCN and phase-shifts the circadian clock. Mice without the VPAC<sub>2</sub> receptor lack an overt, coherent circadian rhythm in clock gene expression, SCN neuron firing rate, and locomotor behavior. Using a systems approach, we have developed a kinetic model integrating VPAC<sub>2</sub> signaling mediated by the cyclic AMP (cAMP)/protein kinase A (PKA) pathway and leading to induced circadian clock gene expression. We fit the model to experimental data from the literature for cAMP accumulation, PKA activation, cAMP-response element binding protein phosphorylation, and *per1* induction. By linking the VPAC<sub>2</sub> model to a published circadian clock model, we also simulated clock phase shifts induced by vasoactive intestinal polypeptide (VIP) and matched experimental data for the VIP response. The simulated phase response curve resembled the hamster response to a related neuropeptide,  $GRP_{1-27}$ , and light. Simulations using pulses of VIP revealed that the system response is extraordinarily robust to input signal duration, a result with physiologically relevant consequences. Lastly, simulations using varied receptor levels matched literature experimental data from animals overexpressing VPAC<sub>2</sub> receptors.

# INTRODUCTION

The suprachiasmatic nucleus (SCN) is the site of the master biological clock in mammals, where many of the circadian oscillations throughout the body, including overt locomotor behavioral rhythmicity, are orchestrated (1). Synchronization of the SCN with daily light/dark cycles, food availability, and temperature variations, etc., is maintained by numerous environmental inputs. In addition, the SCN receives physiological feedback from peripheral tissues for fine-tuning the phase relationships between the various rhythms in the body. Furthermore, within the SCN itself, cells communicate with one another to maintain synchrony. Synchronization and entrainment in the SCN is in part accomplished through intracellular signal transduction pathways.

There is abundant evidence indicating that many neuropeptides modulate the SCN circadian clock oscillation (2,3). Vasoactive intestinal polypeptide (VIP), a versatile neuropeptide, plays important roles in the circadian clock system. Microinjection of VIP into the SCN region of Syrian hamsters during the early or late subjective night produces phase-shifts similar to those induced by light (3,4). VIP also induces mammalian *per1* gene expression in SCN neurons (5,6) and phase-shifts the rat SCN clock in vitro (7,8). Two types of VIP receptors are present in the SCN:  $VPAC<sub>2</sub>$  and  $PAC<sub>1</sub>$  (9). Detailed reporter localization and immunohistochemical studies have demonstrated a high density of

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 $VPAC<sub>2</sub>$  expression in SCN neurons and SCN VIP efferent target neurons (10,11). The VPAC<sub>2</sub> receptor affinity for VIP is three orders of magnitude higher than that of  $PAC<sub>1</sub>$  (12). In addition, alterations in  $VPAC<sub>2</sub>$  expression profoundly disrupt the circadian system. For example, mice overexpressing  $VPAC<sub>2</sub>$  exhibit a shorter free-running period (13), whereas mice deficient in this receptor lack circadian rhythms in both locomotor behavior and clock gene expression (14). Loss of VIP also disrupts locomotor behavior rhythms, abolishes circadian firing rhythms in approximately half of all SCN neurons, and disrupts synchrony between rhythmic neurons (15). These observations suggest that  $VPAC_2$  may contribute to autoregulation and/or synchronization within the SCN.

Although the signaling pathways mediating the actions of VIP are becoming established in other systems, they are less clearly delineated in the SCN circadian clock cells.  $VPAC<sub>2</sub>$  is a G-protein-coupled receptor that has been clearly linked to the stimulating guanine nucleotide binding protein (Gs) and adenylyl cyclase (AC), with cyclic AMP (cAMP) implicated as a key second messenger in many tissues (12,16). In adenocarcinoma cells, VIP binding to  $VPAC<sub>2</sub>$  has been shown to activate the cAMP/protein kinase A (PKA) signal transduction pathway (17), whereas in pinealocytes,  $VPAC<sub>2</sub>$  activation leads to phosphorylation and activation of the transcription factor cAMP-response element binding protein (CREB), a PKA target (18). In pituitary tumor cells, activation of the phospholipase C/inositol-phosphate pathway downstream of  $VPAC<sub>2</sub>$ also leads to CREB activation through mitogen-activated protein kinase pathways (19). Activated CREB in turn induces gene expression, for example, in human choriocarcinoma cells CREB induces *per1* gene expression through CRE elements

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present in the per1 gene promoter (20). In SCN slices and dissociated SCN cells, VIP induces cAMP synthesis (21, 22). In ex vivo experiments, both PKA and mitogen-activated protein kinase have been shown to play roles in VIP-induced phase shifts in the spontaneous firing rhythms of SCN neurons (7). These results suggest that signaling downstream of  $VPAC<sub>2</sub>$  in the SCN is similar to  $VPAC_2$  signaling in other systems.

Many signaling pathways in the SCN are gated by the circadian clock such that the functional consequences of signaling depend on the phase of the clock when the signaling is initiated (2). The functional consequences of VIP signaling through cAMP/PKA is also gated by the circadian clock in such a way that VIP, like light, only induces phase shifts and per1 expression during the circadian night (3,4,5,6,23). Where along the signaling pathway the gating occurs is not clear.

To understand the dynamics of  $VPAC<sub>2</sub>$  receptor signaling, how it modulates circadian clock function, and how it is gated by the circadian clock, we have undertaken a computational modeling study of this system in this work. Specifically, we have focused on how the topology and interacting components of the  $VPAC<sub>2</sub>$  signaling pathway contribute to the control of clock gene induction and how the circadian clock responsiveness to VIP stimulation is gated. We fit the model to a wide range of experimental data from the literature for cAMP accumulation, PKA activation, and CREB phosphorylation. We linked the  $VPAC_2$  model to a mammalian circadian clock model (24,25) and observed phase shifts similar to what has been observed in vivo and in vitro. Interestingly, our simulations reveal that the system response to short pulses of VIP is nearly equivalent to the response to step changes in VIP concentration, a result with physiologically relevant consequences. Results of simulation studies with varied receptor levels agree with published experimental results for mice overexpressing the  $VPAC<sub>2</sub>$  receptor, providing additional validation of the model. Together, the modeling and simulation results of this study provide a framework for gaining increased understanding of the modulation of circadian clock properties by extracellular inputs.

# MATERIALS AND METHODS

The VPAC<sub>2</sub> model of this work is an extension of the cAMP/PKA signaling pathway framework described by Bhalla (26). Key reaction modules are shown in Fig. 1, A–H, describing the VIP-activated cAMP/PKA signal transduction that ultimately leads to gene induction in the nucleus. The model incorporates the following molecular processes originally modeled by Bhalla (26):

- 1. Ligand (L) binding to receptor  $(R)$  (Fig. 1 A). The receptors exist either by themselves or coupled with G-protein (R.GDP.Gs).
- 2. G-protein activation (Fig. 1 B). When ligand binds to the receptor coupled with G-protein (L.R.GDP.Gs), it induces guanine triphosphate (GTP)/guanine diphosphate (GDP) exchange and G-protein activation  $(GTP.G\alpha)$ .
- 3. Adenylate cyclase  $(AC)$  activation (Fig. 1 C). Activated G $\alpha$  binds AC, forms activated adenylate cyclase (Gas.AC), and produces cAMP.
- 4. PKA activation (Fig. 1 D). Four cAMP molecules bind sequentially to each PKA inactive heterotetramer  $(R_2C_2)$  and release two activated PKA catalytic subunits.
- 5. Phosphodiesterase activation (Fig. 1 E). Activated PKA activates cAMP phosphodiesterase (PDE), which converts cAMP to AMP.
- 6. PKA inhibition (Fig. 1 H). A cytoplasmic protein slowly inhibits PKA activity.

We extended the above framework to describe  $VPAC<sub>2</sub>$  signaling by including the following processes:

- 1. Receptor internalization (Fig. 1,A and B). The receptor-ligand complex is internalized as described by Langlet et al. (27), providing another mechanism for the attenuation of signaling.
- 2. Basal cAMP formation. To maintain a nonzero steady-state level of cellular cAMP, a nonspecific low level of G-protein activity was added, maintaining cAMP at  $\sim$ 0.15 nM (21,28).
- 3. Additional PKA dynamics (Fig. 1 H). PKA nuclear translocation was added to bridge cytoplasmic signaling with the nucleus. PKA nuclear inhibition and translocation back to the cytoplasm was added to terminate PKA nuclear action. PKA heterodimerization with regulatory units was added to replenish the inactive PKA pool.
- 4. CREB activation (Fig. 1 F). CREB phosphorylation by nuclear PKA was modeled, extending the intracellular signaling to gene regulation.
- 5. Clock gene (per1) induction (Fig. 1 G). Per1 promoter binding by phosphorylated CREB and subsequent transcriptional activation was modeled, bridging the  $VPAC_2$  signaling pathway model to the core circadian clock. Transcriptional regulation of per1 by CREB was modeled using the framework employed by Leloup and Goldbeter (24,25) to model circadian regulation of per1:

$$
\frac{dM_{\rm p}}{dt} = \nu_{\rm sp} \frac{(CREE^* - CREE_0^*)^{\rm n}}{K_{\rm CP}^{\rm n} + (CREE^* - CRES_0^*)^{\rm n}} - \nu_{\rm mp} \frac{M_{\rm p}}{K_{\rm mp} + M_{\rm p}} - k_{\rm dmp} M_{\rm p},\tag{1}
$$

where  $M_p$  is the *per1* mRNA level, CREB<sup>\*</sup> is the phosphorylated CREB level,  $CREB<sup>*</sup><sub>0</sub>$  is the level of phosphorylated CREB in the absence of VIP,  $v_{sp}$  is the maximum *per1* transcription rate,  $K_{CP}$  is the phosphorylated CREB level for half-maximal transcription,  $n$  is the degree of cooperativity of activation of *per1* transcription by CREB,  $v_{mp}$  is the maximal saturating enzymatic degradation of  $per1$  mRNA,  $K_{mp}$  is the  $per1$  mRNA level for halfmaximal degradation, and  $k_{\text{dmp}}$  is the nonsaturating per1 mRNA degradation constant.

The overall  $VPAC<sub>2</sub>$  signaling network is shown in flow diagram format in Fig. 1 I, where the complex feedback loops and intrinsically self-limiting nature of the pathway are apparent. Overall, the  $VPAC_2$  signaling pathway model consists of 36 ordinary differential equations (ODEs) and 66 parameters. It is a single-cell model where the cytoplasm and nucleus are assumed to be ''well-stirred (but separate) compartments'', i.e., perfect diffusional access to all components within each compartment. All reaction rates were based on standard mass action kinetics, except for the Hill function and Michaelis-Menten terms in Eq. 1.

The model parameters were tuned as follows:

- 1. The initial values for the first 40 parameters were obtained from Bhalla (26); the remaining parameters were assigned coarse initial estimates.
- 2. Experimental data from the literature were collected for the VIP responses of several system components, including cAMP, PKA, and CREB phosphorylation.
- 3. We fit the experimental data for each system component individually, starting with cAMP (early in the signaling pathway), and finish with CREB phosphorylation (bridging the signaling pathway to the nucleus).
- 4. For each system component model, we performed a sensitivity analysis in which all of the model parameters were tested for how strongly they affected the system response. Values of the parameters that most strongly controlled the concentration profile of the system component were varied until the simulation predictions matched the experimental data closely.



FIGURE 1 (A-H) Schematic kinetic reactions of VIP-activated signaling process leading from receptor binding to activated gene transcription. Reversible reactions are represented by double arrows and enzymatic reactions are represented by enzyme species over the single arrow reactions. Ligand receptor complex internalization is represented by dotted line arrows. L, ligand (VIP); R, receptor; L.R, ligand receptor complex; R.GDP.Gs, receptor G-protein complex; L.R.GDP.Gs, ligand bound receptor G-protein complex; GTP.G $\alpha$ , activated G-protein; G $\beta \gamma$ , G-protein  $\beta$ - and  $\gamma$ -subunit; AC, adenylyl cyclase; Ga.AC, stimulatory G-proteinactivated AC; GDP.Gs, GDP-bound G-protein trimer;  $R_2C_2$ , protein kinase A catalytic unit/regulatory unit heterotetramer;  $cAMP.R_2C_2-cAMP4.R_2C_2$ , cAMP complexed with PKA tetramer; PDE, phosphodiesterase; PDE\*, phosphorylated phosphodiesterase; CREB\*, phosphorylated CREB. (I) Flow sheet of the overall VPAC<sub>2</sub> signaling reaction network. Abbreviations are as above, except that  $PR<sub>2</sub>$  indicates PKA regulatory subunit dimer and I<sub>PKA</sub> indicates PKA inhibitor. (J) Flow sheet for the Leloup and Goldbeter (24,25) mammalian circadian rhythm model with input from the VPAC<sub>2</sub> model, adapted from Leloup and Goldbeter (24). Degradations are indicated by dotted arrows.

Parameters that remain unchanged from the original values reported in Bhalla (26) were related to ligand binding, receptor/G-protein coupling, G-protein activation, AC activation, and PKA inhibition (specifically,  $k_1, k_2$ ,  $k_5$ ,  $k_6$ ,  $k_7$ ,  $k_9$ ,  $k_{10}$ ,  $k_{11}$ ,  $k_{16}$ ,  $k_{18}$ , and  $k_{29}$ —see Supplementary Material). A complete list of all equations, parameters, and initial values is provided in the Supplementary Material.

As described above, sensitivity analysis played an important role in our parameter fitting procedure. We also employed sensitivity analysis to gain insight into the model behavior itself. We used the accumulated per1 mRNA concentration over the increasing phase of the induction as a system output and evaluated the extent to which it was affected by variations in the model parameters. More specifically, the following formula was used to calculate a scaled change in  $per1$  output in response to a change in parameter value (S):

$$
S = \frac{\sum_{i} (y(t_i) - y_{base}(t_i))}{\sum_{i} y_{base}(t_i)} \left(\frac{p - p_{base}}{p}\right)^{-1},
$$
 (2)

where  $y(t_i)$  is the level of *per1* at time  $t_i$  for the perturbed parameter value,  $y_{base}(t_i)$  is the level of *per1* in the unperturbed case,  $p_{base}$  is the initial parameter value, and  $p$  is the perturbed parameter value. The simulations were performed until  $t = 2000$  s (VIP treatment at  $t = 0$ ) and S value were calculated using 50 time points from  $t = 1000$  s to  $t = 2000$  s with a sampling time of 20 s. Parameters were varied individually, over a range from 0.5 to 2 times the nominal values. This local sensitivity analysis (29) provided insights into the biological processes most important in controlling the system output.

We also investigated the sensitivity of the model responses to the duration of the VIP input signal. As for the local sensitivity analysis described above, we used *per1* mRNA concentration time course profile as the output, but instead of computing sensitivity coefficients, we simply compared the time courses for differing pulse durations. We considered VIP inputs at 100 nM concentration with pulse durations ranging from 1 to 30 min.

To simulate the circadian phase-shifting properties of VIP in the SCN, we linked the  $VPAC_2$  signaling pathway model to the short form of Leloup and Goldbeter (24,25) mammalian circadian clock model. The Leloup and Goldbeter (24,25) model describes the transcriptional feedback network consisting of the core clock proteins Per1, Cry, and Bmal1/Clock and their posttranslational regulation by reversible phosphorylation. It consists of 16 ODEs with 53 parameters and is shown schematically in Fig. 1 J. We linked the Leloup and Goldbeter  $(24,25)$  model to our VPAC<sub>2</sub> signaling model through transcriptional regulation of per1, a gene induced downstream of  $VPAC<sub>2</sub>$  that is also a core clock gene. Regulation of  $per1$  transcription by  $VPAC<sub>2</sub>$  signaling and the circadian clock is accomplished by two different mechanisms. In the first case, per1 induction is mediated by CREB (as described in the model above), whereas in the second it is mediated by nuclear Bmal1/Clk protein complexes. It has been shown that the two mechanisms are independent (to a degree) in that disruption of CREB binding sites has no impact on per1 regulation by Bmal1/Clk (20). This independence has led us to postulate two functional hypotheses about the mechanisms by which the circadian clock and  $VPAC<sub>2</sub>$  signaling jointly regulate *per1* induction, shown here in Eqs. 3 and 4:

$$
\frac{dM_{\rm p}}{dt} = \nu_{\rm sp} \frac{B_{\rm N}^{\rm n} + (CREB^* - CREB_0^*)^{\rm n}}{K_{\rm BCP}^{\rm n} + B_{\rm N}^{\rm n} + (CREB^* - CREB_0^*)^{\rm n}} - \nu_{\rm mp} \frac{M_{\rm p}}{K_{\rm mp} + M_{\rm p}} - k_{\rm dmp} M_{\rm p}
$$
\n(3)

$$
\frac{dM_{\rm p}}{dt} = \nu_{\rm sp} \frac{B_{\rm N}^{\rm n}}{K_{\rm BCP}^{\rm n} + B_{\rm N}^{\rm n}} + \nu_{\rm sp} \frac{(CREB^* - CREB_0^*)^{\rm n}}{K_{\rm CP}^{\rm n} + (CREB^* - CREB_0^*)^{\rm n}} - \nu_{\rm mp} \frac{M_{\rm p}}{K_{\rm mp} + M_{\rm p}} - k_{\rm dmp} M_{\rm p},\tag{4}
$$

where the symbols are as defined for Eq. 1 with the addition of  $B_N$ representing the level of nuclear Bmal1/Clk complex. Equation 3 is a model for the case where CREB and Bmal1/Clk function independently but recruit the transcriptional apparatus by the same means. In this case, if the levels of Bmal1/Clk are high enough for transcriptional recruitment to be saturated, activation of CREB will not lead to further increase in transcriptional initiation (Fig. 2 A). The functional form is based on that employed by Ueda et al. (30). Equation 4 is a model for the case where CREB and Bmal1/Clk recruit the transcriptional apparatus through separate mechanisms, and thus activation of CREB may lead to either additive or synergistic transcriptional activation of  $per1$  in connection with Bmal/Clk (Fig. 2 B).

The models were implemented in MATLAB (The MathWorks, Natick, MA) and simulations were performed using the MATLAB stiff ODE integrator *ode15s* (31).

# RESULTS

# Model development and validation

We expanded the framework developed by Bhalla (26) for the cAMP/PKA signaling pathway and used it to describe the VIP receptor  $VPAC_2$ -activated signaling through the cAMP/ PKA pathway to circadian clock gene *per1* induction in the circadian pacemaker SCN cells. This model has incorporated PKA nuclear translocation upon activation, CREB phosphorylation by PKA, and the ensuing gene activation. To capture



FIGURE 2 Schematic representation of the two mechanisms for the combined VIP signaling- and circadian clock-regulated per1 gene expression. (A) The mechanism represented by Eq. 3, where either VIP signalingactivated CREB or the circadian transcription factor Bmal1/Clk can activate the transcription machinery to reach its maximum rate. When both are present, it is effectively as if only one is binding to the transcriptional machinery at a time to reach the maximum rate of transcription.  $(B)$  The mechanism represented by Eq. 4, where both CREB and Bmal1/Clk can activate the gene transcription to their individual respective maxima. When both are present, they both bind to the transcriptional machinery and have an additive or synergistic effect on the rate of transcription. C, CREB; B/C, Bmal1/Clk; Pol II, RNA polymerase II. The arrow denotes the direction of per1 transcription.

the dynamics of  $VPAC<sub>2</sub>$  signaling with our model, we systematically tuned the model parameters to match experimental data from the literature. Specifically, we systematically varied the parameters until we converged on a set of values for which the model predictions optimally matched the experimental kinetic profiles for cAMP accumulation, PKA activation, and CREB phosphorylation simultaneously. The details for each model component are given below.

# Fitting VIP-induced cAMP accumulation

As described above,  $VPAC<sub>2</sub>$  is a GPCR coupled with Gs that activates the cAMP/PKA signaling pathways. To fit the model to literature data on VIP-induced cAMP accumulation, we performed a local sensitivity analysis to identify the most sensitive parameters for cAMP production, as described in the Materials and Methods section. The parameters most important for matching the cAMP profile were related to G-protein coupling to ligand-receptor complex  $(k_3 \text{ and } k_4)$ , ligand binding to receptor-G-protein complex  $(k_7 \text{ and } k_8)$ , G-protein activation  $(k_{10})$ , cAMP production  $(k_{12}, k_{13},$  and  $k_{14}$ ), cAMP hydrolysis  $(k_{35}, k_{36},$  and  $k_{37})$ , and GTP hydrolysis  $(k_{43})$  (data not shown). These parameters were then varied individually to fit experimental data. After fitting the model, we obtained kinetic profiles in cAMP accumulation in response to VIP treatment similar to those obtained with cultured GH3 cells (28), as shown in Fig. 3. The simulated cAMP accumulation shows a fast increasing phase, a peak in  $\sim$ 5–10 min after VIP treatment, and then a slow decrease back to basal level (Fig. 3 A). A comparison of our simulation results to the cAMP increase in GH3 cells, experimentally measured at a single time point, is shown in Fig. 3 A. The simulated cAMP accumulation also showed dose dependence with an  $EC_{50} = 1.5$  nM compared to  $EC_{50} =$ 2.2 nM as reported in GH3 cells  $(28)$  (Fig. 3 B). It is also interesting to note that the experimentally obtained dose response curve showed a decrease in cAMP level at 100 nM VIP concentration as compared to at 10 nM. However, our simulated cAMP kinetic profile showed a corresponding increase in cAMP peak level with increasing VIP concentration (Fig. 3 A). The discrepancies arise from the timing of the sampling: the experimental data were obtained 15 min after VIP treatment, which our simulations indicate (at least



for higher VIP concentrations) was already beyond the time for the peak level of cAMP (Fig. 3 A). Because our simulation indicated a slightly different kinetic profile for different concentrations, and because of the discrepancies between our simulation and reported dose response curve, it would be desirable to measure cAMP increases across a time span and at different VIP concentrations to cover the whole dynamic range of cAMP concentration.

# Fitting VIP-induced PKA activation

One effect of elevated cAMP concentration in the cytosol is activation of PKA. In our simulation, PKA activation follows cAMP accumulation with a slight delay, with increasing cAMP accumulation resulting in increased PKA activation. The procedure for fitting the model to reported PKA activation profile is similar to the procedure described above for cAMP (see previous section). We matched our model predictions to experimental observations in cultured cells (17), where PKA activation peaked  $\sim$  5 min after VIP treatment and returned to baseline within 20 min (Fig. 4). The most important parameters for fitting the PKA activation profile are related to active PKA nuclear translocation  $(k_{45})$ , nuclear active PKA inhibition ( $k_{49}$  and  $k_{50}$ ), PKA inhibitor nuclear translocation  $(k_{57}$  and  $k_{58}$ ), and cAMP hydrolysis from PKA regulatory units  $(k_{60})$ . The association constant (Ka) value we obtained from the model fitting, 0.5 nM, is very close to the experimentally determined value of 0.4 nM (17). However, without quantitative kinetic data, the fitting had to be qualitative, and the simulated results are in arbitrary units. Nonetheless, the simulated PKA activation resembles experimentally observed PKA activation profiles quite well (17).



FIGURE 3 VIP-induced cAMP accumulation. (A) Simulated cAMP accumulation at different VIP concentrations. VIP addition was at  $t = 0$ . Symbols represent experimentally observed cAMP concentration at 800 s in GH3 cells (see Mackenzie et al. (28)). Different symbols correspond to different VIP concentrations as denoted in the legend. (B) Simulated dose response curve (*solid line*) compared to experimental data  $(O)$  that obtained from GH3 cells (28), 15 min after VIP treatment.

FIGURE 4 Simulated PKA, phosphorylated CREB, and per1 mRNA concentrations after VIP administration at time 0. All concentrations are normalized to give respective peak levels of 1. Dotted line is simulated PKA concentrations, dashed line is simulated phosphorylated CREB concentration, and solid line is simulated per1 mRNA concentration. ( $\blacklozenge$ ) Per1 mRNA expression data following foskolin stimulation from Yagita and Okamura (32).

#### Fitting VIP-induced CREB phosphorylation

Activation of the cAMP/PKA signaling pathway leads to transcriptional activation via activation of the CREB. Using a procedure similar to the ones in the two previous sections, we matched our model predictions to data from one detailed study in the rat pinealocyte that considered phosphorylation of CREB after VIP treatment (18). In both the experimental study and our simulations, phospho-CREB reaches peak levels 30 min after VIP treatment and returns to baseline in  $\sim$  2 h (Fig. 4). The most important parameters controlling the CREB phosphorylation profile were related to CREB phosphorylation ( $k_{47}$  and  $k_{48}$ ) and dephosphorylation ( $k_{59}$ ). Similar to PKA activation, only qualitative fitting was possible and the simulated CREB activation profile is in arbitrary units.

#### VIP-induced per1 gene expression

VIP induces the clock genes *per1* and *per2* in the SCN at least partly through the cAMP/PKA signaling pathways (6). We included CREB-mediated gene activation in our model using the scheme employed by Leloup and Goldbeter (24,25) (Eq. 1) and including *per1* induction after VIP treatment. Using the parameters for *per1* mRNA accumulation from the Leloup and Goldbeter model, our simulations results show perl transcripts peaking  $\sim$ 100 min after VIP treatment, returning to basal level in  $\sim$ 240 min (Fig. 4). These results resemble forskolin-induced *per1* expression in rat-1 fibroblasts (32), an in vitro model of the mammalian circadian clock (33).

### Model sensitivity analysis

To assess the sensitivity of *per1* induction to parameter changes, we systematically varied each individual parameter by a factor of 0.5, 0.95, 1.05, or 2, and computed scaled percentage changes in *per1* mRNA concentrations during the increasing phase of induction as described in the Materials and Methods section (Eq. 2). Of the 66 parameters, 16 gave changes  $>\pm 25\%$  under at least one of the changed conditions; 16 parameters gave changes  $\leq 25\%$  but  $\geq 5\%$  under at least one of the changed conditions; and 34 parameters either did not change the *perl* expression under any of the changed conditions or the changes were  $\leq 5\%$ . The most sensitive parameters include, in order of importance,  $v_{\rm{sp}}$ (maximum rate for *per1* mRNA synthesis),  $k_{49}$  (binding rate for nuclear inhibitor binding to nuclear PKA),  $k_{59}$  (CREB\* dephosphorylation rate),  $k_{12}$  (rate of cAMP production by activated AC),  $k_{13}$  (rate of ATP binding to activated AC),  $k_{51}$ (rate for nuclear-inhibited PKA translocation to cytoplasm),  $k_{55}$  (rate of inhibited PKA to reform holoenzyme with PKA regulatory unit),  $k_{46}$  (rate for PKA binding to CREB),  $k_{50}$ (dissociation rate for nuclear inhibitor bound to PKA),  $k_{57}$ (rate of PKA inhibitor nuclear translocation),  $k_{10}$  (rate of G-protein activation),  $k_{52}$  (rate of backward translocation of inhibited PKA to nuclei),  $v_{mp}$  (maximum rate for *per1* mRNA degradation),  $k_{\text{mp}}$  (Michaelis constant for *per1* mRNA degradation),  $k_{14}$  (dissociation rate for ATP-bound AC), and  $k_{43}$  (rate of GTP hydrolysis) (Fig. 5 A). The model showed considerable sensitivity to both increases and decreases in  $v_{\rm{sp}}$ ,  $v_{\rm{mp}}$ ,  $k_{\rm{mp}}$ ,  $k_{12}$ ,  $k_{13}$ ,  $k_{14}$ , and  $k_{43}$ , but was more sensitive to increases in  $k_{46}$  and  $k_{50}$  and to decreases in  $k_{49}$ ,  $k_{51}$ ,  $k_{55}$ , and  $k_{59}$ . Because  $v_{sp}$ ,  $v_{mp}$ , and  $k_{mp}$  are directly involved in the per1 mRNA synthesis and degradation, it is not surprising that the *per1* mRNA time course was directly proportional to changes in these parameters. Similarly,  $k_{10}$ ,  $k_{12}$ ,  $k_{13}$ ,  $k_{14}$ , and  $k_{43}$  are involved in AC activation and cAMP synthesis, and, not surprisingly, per1 mRNA accumulation was found to be very sensitive to changes in their values.

The parameters with moderate sensitivity include, in order of importance,  $k_{56}$  (rate of backward reaction for inactive PKA holoenzyme re-formation),  $k_{58}$  (rate of backward reaction for PKA inhibitor nuclear translocation), n (degree of transcription factor cooperativity),  $k_{35/36/37}$  (phosphodiesterasecatalyzed cAMP degradation),  $k_{AP}$  (activation constant for *per1* transcription),  $k_{3/4}$  (liganded receptor binding to G-protein),  $k_{41}$  (rate of basal G-protein activation),  $k_{19/20/21/21}$  $_{22/23}$  (rate for cAMP binding to PKA holoenzyme), and  $k_{42}$ (rate of receptor internalization) (data not shown).

Per1 induction was not sensitive to the remaining parameters, including  $k_{1/2}$  (ligand binding to G-protein free receptors),  $k_{5/6}$  (receptor and G-protein coupling),  $k_{7/8}$ (ligand binding to G-protein-coupled receptors),  $k<sub>9</sub>$  (trimeric G-protein formation),  $k_{11}$  (GTP hydrolysis),  $k_{15/16}$  (G $\alpha$  and AC binding),  $k_{17/18}$  (rate for first cAMP molecule binding to PKA holoenzyme),  $k_{24-28}$  (rate for releasing PKA catalytic units),  $k_{29/30}$  (cytoplasmic PKA inhibition),  $k_{31-34}$  (phosphodiesterase phosphorylation and dephosphorylation),  $k_{38/2}$ <sup>39</sup> (phosphorylated phosphodiesterase binding to cAMP),  $k_{44/45}$  (PKA nuclear translocation),  $k_{47}$  (PKA CREB dissociation),  $k_{48}$  (CREB phosphorylation),  $k_{53/54}$  (PKA tetramer re-formation),  $k_{60}$  (hydrolysis of cAMP bound to PKA regulatory units), and  $k_{\text{dmp}}$  (basal per1 mRNA degradation) (data not shown).

Overall the sensitivity of the *perl* mRNA time course was similar to what we observed earlier while tuning the parameters to fit experimental data to the predicted model responses of specific key signaling molecules, i.e., cAMP, PKA, CREB phosphorylation, and *per1* induction. However, it was surprising to note that the overall model was not sensitive to the rate of PKA dissociation from CREB  $(k_{47})$ and the rate of CREB phosphorylation  $(k_{48})$ . Phosphorylated CREB concentration is directly linked to *per1* transcriptional activation. The fact that *per1* transcriptional induction was not sensitive to CREB phosphorylation but sensitive to CREB dephosphorylation suggests that the balance of phosphorylated CREB is more dependent upon the rate of dephosphorylation.

To this point, all simulations have been performed with a step input in the VIP signal (i.e., VIP was added and the concentration held constant in the system throughout the simulation run). However, the bioactive effect of VIP in vivo only lasts a few minutes in biological fluids due to its rapid degradation and inactivation by enzymes, catalytic antibodies, and spontaneous hydrolysis (see Sethi et al. (34) for a review). To investigate the effects of transient VIP stimulation, we considered pulses in VIP concentration of 100 nM sustained for different durations. The results are shown in Fig. 5 B. A 1-min pulse of VIP gave rise to a peak level of *per1* induction  $\sim$ 20% of that obtained in response to a step signal; for a 2-min pulse, the resulting peak level is  $\sim$  50% of the step response and  $\sim 80\%$  for a 5-min pulse; the 10-min pulse response is almost indistinguishable from the step response (Fig. 5 B). These results suggest that a short pulse of VIP could be as effective as a step signal in inducing per1 gene expression in our model, reflecting the high sensitivity of the VPAC<sub>2</sub> signaling pathway to short pulse signals in vivo, as well as the robustness of the system to pulse inputs of longer duration than 10 min. These results have physiologically important consequences, as discussed below.

# Modeling VIP-induced phase shifts in the circadian clock

Injection of VIP into SCN has been shown to induce phase shifts in Syrian hamsters in vivo and in rat in vitro (3,4,8). We linked our  $VPAC_2$  signaling model to the Leloup and Goldbeter (24,25) circadian clock model to simulate the VIPinduced phase shift. Based on the observation that Bmal1/ Clk- and CREB-mediated per1 promoter activation are at least partially independent of each other (20), we postulated two functional hypotheses about the mechanisms by which the circadian clock and  $VPAC<sub>2</sub>$  signaling jointly regulate per1 induction (Materials and Methods, Eqs. 3 and 4). In both cases, VIP induced phase shifts of the circadian clock. The model represented by Eq. 3 generates phase shifts similar to experimentally measured locomotor behavior phase shifts induced by VIP injection into the SCN in vivo (3), though with a larger phase delay than the experimental observation (Fig. 6 A). In our simulation, VIP applied at late



80 A Experimental (Piggins et al., 1995) Simulation 60 40 Phase shift (min.) 20  $\mathbf 0$  $-20$  $-40$  $-60$  $-80$  $-100$ 20-24  $12 - 14$ Circadian Times (hours) В 250 Experimental (Reed et al., 2001) \_<br>Simulation 200 Phase shift (minutes) 150 100 50  $\mathbf 0$  $-50$  $-100$  $12 - 14$  $20 - 24$ **Circadian Times** 

FIGURE 5 Model sensitivity analysis. (A) Model sensitivity to parametric changes: parameters were varied individually in the range of 0.5, 0.95, 1.05, and 2 times the original value; the 16 most sensitive parameters, which gave rise to at least 30% changes in one of the four perturbations introduced, are shown. (B) Model sensitivity to perturbation signal duration: short pulses of VIP input were similarly effective as a step VIP input in inducing per1 transcription.

FIGURE 6 Simulated VIP-induced phase shift in SCN circadian clock using two different transcriptional regulation mechanisms. (A) Phaseshifting as predicted with combined transcriptional saturation represented by Eq. 3. (B) Phase-shifting as predicted with separate transcriptional saturation represented by Eq. 4.

A 300

200

100

 $\mathbf 0$ 

 $\mathbf 2$ 

 $\mathbf{A}$ 

 $\bf{0}$ 

200 100

 $\mathbf 0$ 

 $-100$  $-200$  $-300$  $\mathbf 0$  $\overline{2}$  $\overline{\mathbf{A}}$  $\bf 6$ 8 10  $12$  $14$ 16  $18$  ${\bf 20}$ 22 24

6 8  $10<sub>1</sub>$  $12$  $14$ 16 18 20 22

Circadian Time (hour)

24

 $-100$  $-200$  $-300$ 

Phaseshift (minutes)

B 300

Phaseshift (minutes)

night (rising phase of per1 mRNA near nadir) induced a 1 h phase advance, which is nearly the same as in the experimental data (60 vs. 50 min) (Fig. 6 A). However, VIP applied at early night (lowering phase near per1 mRNA nadir) induced an  $\sim80$  min phase delay, which was almost twice the mean phase delay observed in experiments (40 min.) (Fig.  $6 B$ ). The model represented by Eq. 4 generates phase shifts similar in magnitude to what has been observed in SCN neuron firing rhythm in vitro (7,8) (Fig. 6 B). VIP applied at late night induced a large 4 h phase advance (compared to an average 3 h phase advance observed in the SCN firing rhythm) (Fig. 6 B). VIP applied at early night induced a smaller 80 min phase delay, whereas VIP applied to SCN slices induced a 60 min phase delay in SCN firing rhythms  $(8)$  (Fig. 6 B).

To study the phase dependence of the VIP-induced phase shift, we simulated treatment with 100 nM VIP at each hour of the entire circadian cycle and generated phase response curves (Fig. 7 A). Lacking experimental VIP phase response



Circadian Time (hour)

curve data, we compared the phase response curve to that of another neuropeptide: gastrin-releasing peptide  $(GRP_{1-27})$ (4).  $\text{GRP}_{1-27}$  is a ligand for a different G-protein-coupled receptor that activates different signaling pathways (35,36). Nevertheless, it has been demonstrated that  $\text{GRP}_{1-27}$  and VIP induce similar phase shifts (4). Therefore, the  $\text{GRP}_{1-27}$ phase response curve is used currently as a reference for comparison. The simulated phase response curve generated using Eq. 3 closely resembles the phase response curves of light and  $GRP_{1-27}$ . The simulated phase response curve generated using Eq. 4, however, shows VIP-induced phase shifts throughout the circadian cycle, with phase advances from late night to early day and phase delays from late day to early night (Fig. 7 A).

We showed earlier that a short pulse of VIP induced similar *per1* transcriptional response as did the step signal (Fig.  $5 B$ ). To see if a short pulse of VIP will also induce appropriate phase shift throughout the circadian cycle, we simulated VIP phase response curves using a 5 min, 100 nM VIP pulse. The simulated phase response curve obtained from the model in Eq. 3 was almost identical to that for the step input in VIP (Fig. 7 B). The simulated phase response curve obtained from the model in Eq. 4 still followed the same general pattern as that resulting from the step input signal; however, phase advances were smaller, whereas the delay was about the same (Fig.  $7 B$ ). These results indicate that short pulse VIP signals were effective not only in generating *per1* response from the VIP signaling model but also in phase-shifting the circadian clock model.

Transgenic mice overexpressing  $VPAC<sub>2</sub>$  receptor showed faster re-entrainment to photoperiod phase-shifting as compared to wild-type animals (13). To investigate the modulation of the phase response curve by  $VPAC<sub>2</sub>$  receptor overexpression or suppression, we simulated receptor overexpression and suppression in our linked model, using as the perturbation a step increase in the VIP signal (Fig. 8). With the model in Eq. 3, lowering the receptor level to half of the nominal level slightly reduced the peak phase shift for both phase advance and phase delay. However, doubling the receptor level showed a more pronounced phase advance than phase delay (Fig. 8 A). For the model in Eq. 4, the entire phase response curve was shifted either up or down in direct relation to an increase or decrease in the receptor concentration (Fig. 8 B). With reduced receptor concentration, the phase delay became larger and phase advance smaller, whereas with increased receptor concentrations, phase advance increased and phase delay decreased. For both models, the changes in receptor level led to changes in phase-shifting for whichever changes in phase advance were more pronounced. These observations are in accordance with the reported photoperiod phase-shifting (13), where animals overexpressing the VPAC2 receptors showed a significantly enhanced re-entrainment to a phase advancing photoperiod change. Based on the simulation, we would predict that a single pulse of light or VIP will induce larger phase advances



FIGURE 8 Phase advance is more sensitive than phase delay to receptor level changes. (A) Simulated phase response curves using the model represented by Eq. 3. (B) Simulated phase response using the model represented by Eq. 4. Solid lines are simulated phase response curves with nominal receptor levels. Dotted lines are simulated phase response curves with doubled receptor levels. Dashed lines are simulated phase response curves with half amount of nominal receptor levels.

in the transgenic mice overexpressing  $VPAC<sub>2</sub>$  as compared to wild-type mice.

# **DISCUSSION**

Circadian rhythms are generated by molecular oscillations in cells that are modulated by extracellular stimuli. The SCN, as the central oscillator, orchestrates coordinated rhythmic processes throughout the body and receives many stimuli originating from the environment and within the organism itself. How the SCN integrates these numerous stimuli into a consistent and precise molecular oscillation is not clear. In an initial effort toward understanding this process, we report in this work a mathematical model that describes VIP-activated  $VPAC<sub>2</sub>$  receptor signaling and a coupling of the model to the circadian clock. We chose VIP for this in silico study because it has been suggested to be a paracrine/autocrine molecule contributing to the maintenance of sustained SCN oscillations, exerting its effect through the  $VPAC_2$  receptor (14,15).

Using a modeling framework for the cAMP/PKA signaling pathway developed by Bhalla (26), we built a kinetic model describing VIP-activated signaling in SCN cells that culminates in circadian clock gene induction. We tuned our model parameters to obtain good quantitative and qualitative fits to experimental data from the literature for VIP-induced cAMP accumulation (Fig. 3), PKA activation (Fig. 4), CREB phosphorylation (Fig. 4), and *per1* gene induction (Fig. 4). It is worth noting that the different measurements we used to fit the model were from different cells. We recognize that different cells will potentially have different kinetics, and that SCN cell specific measurements are needed for better parameter estimates. Nonetheless, fitting the model to experimental measurements gives us a working initial model with which we can explore the  $VPAC_2$ -mediated signaling dynamics and functionality in a biologically relevant context of the circadian clock. Importantly, linking the model to a circadian clock showed good agreement with experimentally observed phase shifts (Figs. 6 and 7).

Sensitivity analysis of the model allowed us to identify the 16 most sensitive model parameters for predicting per1 gene induction (Fig. 5 A):  $v_{\rm sp}$ ,  $v_{\rm mp}$ ,  $k_{\rm np}$ ,  $k_{10}$ ,  $k_{12}$ ,  $k_{13}$ ,  $k_{14}$ ,  $k_{43}$ ,  $k_{46}$ ,  $k_{49}, k_{50}, k_{51}, k_{52}, k_{55}, k_{57}$ , and  $k_{59}$ . These were related to *per l* mRNA synthesis, degradation, AC activation and deactivation, PKA inhibition, and CREB phosphorylation and dephosphorylation. It is entirely reasonable that the model prediction is sensitive to these parameters, given that they are involved in the critical steps of cAMP production, PKA activation, CREB activation, and mRNA synthesis. Surprisingly, per1 transcriptional induction in our model did not seem to be particularly sensitive to the rate of CREB phosphorylation in the range tested, rather showing sensitivity to the rate of CREB dephosphorylation—indicating that the rate of CREB dephosphorylation plays a more important role in maintaining the activated CREB concentration.

Since the half-life of VIP in biological fluid is only a few minutes (34), VIP signal duration is a critical issue in tissues. To test the sensitivity of the model to the VIP signal duration, we simulated the response to short pulses of VIP inputs. A 2-min VIP pulse was able to elicit a *perl* induction up to  $\sim$  50% of the peak level of the step VIP response, whereas a 5-min pulse response achieved  $\sim 80\%$  of the step response peak level (Fig.  $5 B$ ). The sensitivity of the model to the short pulses, and the robustness of the response to variations in input duration, once a critical duration is exceeded—observations that have physiologically relevant consequences—seem to validate the biological relevance of the model. The robustness of the system response to pulse inputs with durations  $\ge$   $\sim$  10 min may provide a physiological advantage in that variability in VIP release (that may arise from intrinsic biological noise) does not lead to variability in the system response: noisy input signals are converted into precise output signals, provided that the input duration threshold

 $(\sim10 \text{ min})$  is exceeded. The fact that the system response to VIP stimulation is intrinsically limited also may provide a protective mechanism, preventing potentially cytotoxic overstimulation. Intrinsically limited responses to a single input also allow for the requirement of synergistic or combinatorial inputs to achieve sustained responses. Lastly, the similarity between system responses to pulse and step inputs indicates that experimental observations obtained using step inputs may accurately reflect what occurs under physiological conditions.

By linking our  $VPAC<sub>2</sub>$  signaling model to the Leloup and Goldbeter (24,25) mammalian circadian clock model, we were able to simulate the phase-shifting effects of VIP on the SCN clock as evidenced in the *per1* gene oscillation. Using two models for the combined circadian and VIP regulation of per1 gene expression, we matched VIP-induced phase shifts to experimentally observed phase shifts in locomotor behavior rhythm and SCN neuronal firing rhythm (Fig. 6). In the first case, the circadian clock regulated *perl* gene expression, mediated by Bmal1/Clk, and the VIP-induced per1 gene expression, mediated by phosphorylated CREB, are independent but they recruit the transcription machinery in the same manner and thus can saturate *per1* transcription individually (Fig. 2 A). When Bmal1/Clk regulation of *per1* transcription is saturated, phosphorylated CREB can no longer induce transcription. Under such circumstances, a step increase in the VIP signal phase-shifted the circadian clock at early and late night as experimentally observed (4), although the simulated phase delays early in the night were greater than observed (Fig. 6 A). The simulated phase response curve mimics the light phase response curve and the GRP<sub>1–27</sub> phase response curve (Fig. 7 A). Saturation of per1 transcription by Bmal1/Clk during the day limited the action of the VIP signaling. This effectively served as a mechanism for circadian clock gating on VIP induction of per1 gene expression and restricted phase shifts to the night phase (Fig. 7 A). The limitation of the model is that it cannot explain the large phase shift observed in vitro in SCN neuron firing rhythm (7).

In the second model, we described the circadian clock regulation of *per1* gene expression as completely independent from VIP-induced *perl* gene expression such that Bmal1/Clk recruits the transcriptional machinery separately from CREB. Thus CREB can induce *per1* gene expression even when the Bmal1/Clk induced transcription is at its maximal rate (Fig.  $2 B$ ). The simulated phase shift matched the observed in vitro SCN neuron firing rhythm phase shift (Fig.  $6B$ ); and the phase response curve in this case showed phase-shifting throughout the circadian cycle, thus necessitating an additional gating mechanism to match the experimentally observed phase response curve. However, this model was able to describe the large phase shift induced by VIP in SCN firing rhythm observed in vitro (7,8). With currently available data, it is not possible to determine whether either model or some appropriate combination of the

two represents the mechanism of the integration of VIP signaling and circadian clock function more realistically. These different possibilities and their possible combined contributions to the VIP-induced phase shift warrant further experimental investigation.

It is interesting to note that with the limiting saturation rate of transcription as described in Eq. 3, the limitation serves as a gating mechanism for VIP-induced phase shift. Recently, Geier and colleagues (37) modeled light entrainment of the circadian oscillator based on the independence of lightinduced transcription of *per1* gene from Bmal1/Clk-driven transcription. In their model, a separate gating term was introduced to fit the light phase response curve. Our results indicate that with a limiting maximum transcription rate, clock-gated gene induction can be explained without an additional gating term. In terms of gene regulation, this makes sense: although various transcription factors can act independently to activate transcription, they do act to recruit transcriptional machinery to the same promoter; and the rate of transcription is limited to how fast the transcriptional machinery can be loaded onto the promoter and initiate transcription (of course, with the assumption that there is no interaction between the two sets of transcription factors). Therefore, if two separate transcription factors bind to the same promoter and they can function independently of each other, their combined transcriptional activation is still limited by the promoter capacity to initiate transcription.

We also tested if a short pulse of VIP is capable of phaseshifting the circadian clock. Our simulation using a 5-min pulse of VIP phase-shifted the circadian clock in a pattern similar to the simulated response to a sustained VIP step signal (Fig.  $7 B$ )—an observation with physiological implications indicating that the model describes in vivo VIP signaling pathways reasonably well in the sense that the model response to short duration of VIP signals and the induced phase response are similar to behavioral responses.

Varying the quantity of the VPAC<sub>2</sub> receptor in the model resulted in a corresponding variation in the magnitude of the phase shift induced by VIP. Increasing the  $VPAC<sub>2</sub>$  receptor amount induced a larger phase advance using both coupling mechanism represented by Eqs. 3 and 4 (Fig. 8), whereas decreasing  $VPAC<sub>2</sub>$  receptor amount reduced phase delay with Eq. 3 but increased phase delays with Eq. 4 (Fig. 8). However, changes in phase advances were more pronounced than changes in phase delays. These observations agree with the reported data from transgenic mice overexpressing  $VPAC<sub>2</sub>$  (13). Our simulation also predicts that a single pulse of light or VIP will induce larger phase advances in the transgenic mice overexpressing  $VPAC<sub>2</sub>$  as compared to wild-type mice. It would be interesting to see the prediction verified experimentally using transgenic animals.

In summary, we have presented the development of a kinetic model for the VIP-induced signal transduction process in SCN cells and compared our model simulation results to published data. These simulation results matched

experimental data closely for cAMP accumulation, PKA activation, CREB phosphorylation, and per1 gene induction. When the model was linked to a circadian clock model, the predicted VIP-induced phase shifts closely resembled experimental observations for most of the circadian day. Also, simulations of varying amounts of the VPAC<sub>2</sub> receptor predicted that overexpression of the receptor will cause a larger phase advance. However, we recognize that in reality, the VIP-induced phase shift is much more complicated than what we have described so far. For example, it is evident that the signaling pathways responsible for VIP signaling to the clock include both protein kinase A and phospholipase C pathways (6), and that mitogen-activated protein kinase signaling also contributes to the phase-shifting effect of VIP (7). Our next goal is to describe these signaling pathways and incorporate them into our model. We will take an approach of combined modeling and experimental validation to further our understanding of the role of VIP in maintaining the SCN circadian clock. Lastly, it is worth highlighting that other computational models for the circadian clock mechanism are available in the literature (38,39). It will be interesting to see if differences in the phase shift can be generated from simulations based on these other models.

## SUPPLEMENTARY MATERIAL

An online supplement to this article can be found by visiting BJ Online at http://www.biophysj.org.

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