Canalization of circuit assembly by δ-protocadherins in the zebrafish optic tectum

Sayantanee Biswas[1], Michelle R. Emond[1], Grace S. Philip and James D. Jontes[1,*]

[1]Department of Biological Chemistry and Pharmacology
Ohio State University Wexner College of Medicine
Columbus, OH 43210

*corresponding author: jontes.1@osu.edu

Abstract

Neurons are precisely and reproducibly assembled into complex networks during development. How genes collaborate to guide this assembly remains an enduring mystery. In humans, large numbers of genes have been implicated in neurodevelopmental disorders that are characterized by variable and overlapping phenotypes. The complexity of the brain, the large number of genes involved and the heterogeneity of the disorders makes understanding the relationships between genes, development and neural function challenging. Waddington suggested the concept of canalization to describe the role of genes in shaping developmental trajectories that lead to precise outcomes[1] . Here, we show that members of the δ-protocadherin family of homophilic adhesion molecules, Protocadherin-19 and Protocadherin-17, contribute to developmental canalization of visual circuit assembly in the zebrafish. We provided oriented visual stimuli to zebrafish larvae and performed *in vivo* 2-photon calcium imaging in the optic tectum. The latent dynamics resulting from the population activity described a circular manifold. Among different wild type larvae, these dynamics were remarkably similar, allowing quantitative comparisons within and among genotypes. In both Protocadherin-19 and Protocadherin-17 mutants, the latent dynamics diverged from wild type. Importantly, these deviations could be averaged away, suggesting that the loss of these adhesion molecules leads to stochastic phenotypic variability and introduced disruptions of circuit organization that varied among individual mutants. These results provide a specific, quantitative example of canalization in the development of a vertebrate neural circuit, and suggest a framework for understanding the observed variability in complex brain disorders.

Introduction

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Despite their immense complexity, vertebrate brains are highly organized and exhibit a

conserved, stereotyped architecture. Distinct brain regions comprise canonical circuits that carry out

well-defined functions, which are conserved both within and between species[2,3] . The assembly of these

conserved circuits is robust to genetic and environmental variation, as well as natural biological

heterogeneity. This allows the brains of distinct individuals to perform the same tasks, even though they

are not identical at the level of neurons and synapses, or in their particular developmental histories. The

mechanisms that confer robust circuit development in the face of these multiple sources of variability are

poorly understood[4,5] .

In the case of neurodevelopmental disorders, such as schizophrenia and autism, the relationship

between conserved structure and conserved function breaks down. Characterized by profound

disturbances in normal brain function, some evidence suggests that these disorders are

"connectopathies," arising from disruption of the underlying network topology[6–10] . While a large number

of genes have been linked to developmental brain disorders, understanding the relationship of genotype

to phenotype is challenging. In addition to natural biological variability, these disorders are plagued by

variability in penetrance and expressivity[11,12] . Moreover, putatively distinct disorders have amorphous

boundaries, overlapping with one another and exhibiting comorbidities[13], as well as sharing genetic

origins[14–16] . Collectively, these sources of variation mask the relationships between gene function,

circuit organization and neural activity. These same issues make interpretation of studies in animal

models similarly challenging.

Protocadherin-19 is a member of the δ-protocadherin family of homophilic cell adhesion

molecules[17–19] . In humans, mutations in *PCDH19* are linked to schizophrenia and autism[20,21] , and cause

a developmental epileptic encephalopathy[22,23]. To investigate how mutations in *pcdh19* or the related

pcdh17 affect neural development, we used visual stimulation and *in vivo* 2-photon calcium imaging in

the optic tectum of the larval zebrafish. We show that the neuronal population responses to oriented

sinusoidal gratings define neural dynamics that are strongly stereotyped among wild type larvae. In

mutants, these dynamics are altered, reflecting stochastic deviations in circuit organization. Our results

are consistent with a role for protocadherins in canalization of development, contributing to robustness of

circuit assembly. This can provide a conceptual framework for understanding the variability associated

with neurodevelopmental disorders.

Results

Moving stimuli, such as moving lines, spots or gratings, elicit robust responses in the optic tectum

of zebrafish[24–27]. To record the activity of tectal neurons, we generated a transgenic line that *pan-*

neuronally expresses a nuclear localized jGCaMP8s (Histone H2B-GCaMP8s).   These transgenic larvae

were mounted in a custom imaging chamber (**Fig. 1a**), and we elicited visual responses by projecting a

sequence of drifting sinusoidal gratings (12 directions rotated at 30º intervals) onto an adjacent

translucent screen (**Fig. 1b,c**). Two-photon image stacks spanning the optic tectum (7 optical sections at

10 µm spacing) were collected at 1 Hz (**Fig. 1d**), allowing us to sample population activity. We used

constrained non-negative matrix factorization (CNMF) with CaImAn[28] to automatically segment images

and extract fluorescence traces from visually-responsive neurons (**Fig. 1e,f**). For further analysis, the

neural responses were averaged across three trials (**Fig. 1g**). Overall, we obtained 2506 visually

responsive neurons (278.4±26.6, n=9).

It is now widely understood that sensory processing and motor control are encoded by neuronal

population dynamics, rather than the activities of individual neurons[29,30] . These latent dynamics consist

of a small number of covariation patterns, or neural modes, which describe a neural manifold within a

low-dimensional subspace[31–33] . To explore the structure of tectal population dynamics in response to

visual stimulation, we performed linear dimensionality reduction with principal component analysis (PCA)

(**Fig. 2a**). For n neurons, PCA reduces the data from an n-dimensional space to a more compact k-

dimensional space. We found that the first five neural modes captured 89.9±1.8% (n=9; mean ± std.dev.)

of the variance in our wild type data (**Fig. 2b**), and our subsequent analyses are confined to these five

neural modes. Each axis represents a significant pattern of neuronal covariation that is activated to

varying extent during the presentation of visual stimuli, and projection of the original neural data onto

these axes describes the latent dynamics evoked by visual stimulation (**Fig. 2c**). To determine how

consistent the neural responses are in individual larvae, the latent dynamics were obtained for individual

trials, and the Pearson's correlation (r) between individual trials was calculated along each dimension

(**Fig. 2c,d**). The mean trial-to-trial correlation was greater than 0.9 across all 5 neural modes (**Fig. 2d**).

Recent evidence suggests that the similarity of neural architecture among individuals gives rise to similar

latent dynamics for a given stimulus or motor task[34] . In mammals, latent dynamics are estimated from a

small subsample of neurons, which varies from individual to individual. In such cases, the latent

dynamics from different animals need to be aligned using a procedure such as canonical correlation

analysis[34,35] . Here, we image a relatively large proportion of visually-responsive neurons and sample

among the same neuronal types across different fish, obviating the need for alignment. For each wild

type individual, we determined the latent dynamics from trial averaged responses (**Fig. 2e**). To quantify

the similarity of the dynamics among the pool of wild types, we generated the averaged response, then

calculated Pearson's correlation between this average and the dynamics of each individual (**Fig. 2e,f**).

The mean correlation along each neural mode was nearly as high as for trial-to-trial correlations (**Fig.**

2c,d), indicating that the similarity of dynamics among individuals is comparable to the similarity of

successive trials in the same individual. Thus, the latent dynamics elicited by visual stimulation is

stereotyped across different zebrafish larvae, facilitating comparisons within and among experimental

groups. When plotted in three dimensions, the latent dynamics from individual larvae describe a rosette

shaped trajectory, with each leaf representing the response to a direction of grating drift (**Fig. 2g,h**). The

averaged dynamics yielded a smooth, roughly circular, trajectory in three dimensions (**Fig. 2i**). Thus, the

population response to our simple stimulus presentation, encodes the direction of motion on a neural

manifold that is preserved across zebrafish larvae.

To investigate the involvement of *pcdh19* in the assembly of visual circuitry we used two, distinct

pcdh19 mutant alleles. We previously introduced an indel lesion near the 5' end of exon1 shortly after

the sequence encoding the signal peptide[36,37] , resulting in a complete lack of functional Pcdh19 (*pcdh19⁻*

¹⁰ᵇᵖ). In addition, we have generated a new "promoterless" *pcdh19* allele, which lacks ~4kb of genomic

sequence, spanning the basal promoter, 5'UTR and the ATG start codon in exon 1 (*pcdh19^Δprom*). While

both alleles completely eliminate the production of Pcdh19 protein, evidence suggests that indel

mutations, like *pcdh19^-10bp^*, can elicit compensatory mechanisms arising from nonsense-mediated RNA

decay[38,39] . Both of these mutant lines were crossed into our *Tg(elav3l:H2B-GCaMP8s)* line. As above,

we performed calcium imaging on homozygous mutants during visual stimulation, and computed the

latent dynamics for each mutant from the trial averages of visually responsive neurons (**Fig. 3a,b**). To

determine whether the mutant groups differed from wild type in their visual responses, we correlated the

trial-averaged dynamics from each individual mutant with the wild type group average along each neural

mode (**Fig. 3c**). Both *pcdh19^-10bp^* and *pcdh19^Δprom^* showed decreased correlation with the group average

(**Fig. 3c**), although this varied by neural mode between the two mutants. The *pcdh19^-10bp^* larvae showed

the greatest change along the second neural mode, while *pcdh19^Δprom^* mutants exhibited significant

differences along neural modes 2-5 (**Fig. 3c**). The response to drifting sinusoidal gratings diverged from

wild type for both *pcdh19* mutants, as the trajectories of individual mutant fish were less correlated to the

wild type average than were individual wild type fish. To determine whether individual mutants described

similar or distinct trajectories, we calculated pairwise correlations between larvae within an experimental

group.   If mutants converged on a distinct, but stereotyped, circuit organization, then their intra-group

correlation should be similar to the intra-group correlations of the wild type group. Alternatively, if the

divergence of the mutants from wild type is due to stochastic variations, then the intra-group correlations

should be lower and exhibit an increased variance. Consistent with stochastic variation, the *pcdh19*

mutants exhibit lower intra-group correlations than wild type larvae (**Fig. 3d**). When visualized in three

dimensions, the trajectories from individual *pcdh19^Δprom^* mutants differ dramatically from the stereotyped

paths of wild type larvae (**Fig. 2g,h**), and diverge from each other (**Fig. 3e,f**). However, despite the

variability of the individual mutants, averaging within a genotype suppresses this variation and gives rise

to averaged dynamics that are strongly correlated with wild type (**Fig. 3g**). This suggests that the effect

of *pcdh19* loss on visual processing is best understood as stochastic developmental noise, as this noise

can be suppressed by averaging (**Fig. 3g**).

Pcdh19 is a member of a small family of related δ2-pcdhs. To determine if mutations in other δ2-

pcdhs also affect visual responses in the optic tectum, we recorded the response to visual stimulation in

mutants lacking *pcdh17* (*pcdh17^-5bp^*)[37] . As above, we used the trial averaged neuronal responses to

compute the latent dynamics along the first five neural modes (**Fig. 4a**). Similar to the *pcdh19* mutants,

the latent dynamics exhibited by *pcdh17^{-5bp}* mutants was less correlated with the wild type average (**Fig.**

4a), although the differences were not statistically significant (**Fig. 4b**). To measure the intra-group

variation exhibited by the *pcdh17^{-5bp}* mutants, we determined pairwise correlations along each neural

mode (**Fig. 4c**). Although there was a uniform decrease in pairwise correlation among the *pcdh17^{-5bp}*

mutants, this was only significant for neural mode 5 (**Fig. 4c**). This observed intra-group noise was

eliminated by averaging, as the *pcdh17^{-5bp}* group average exhibited high correlation with the wild type

average (**Fig 4d**). As each mutant genotype showed a reduced intra-group correlation, it is possible that

this increased variation is due to unreliable or noisy neuronal responses. To determine whether the

tectal responses to visual stimulation are reliable, we determined the between-trial correlations for each

neural mode within each experimental group (**Fig. 4e**). We found no significant difference in the

between-trial consistency of the population dynamics in the mutant groups, compared to wild type (**Fig.**

4e). This suggests that each mutant network is responding reliably and reproducibly to repeated

presentations of a given stimulus, yet deviates randomly from the wild type. To quantify the within-group

variance, we generated histograms of all pairwise correlation coefficients within each experimental group

(**Fig. 4f**). While the distribution of correlation coefficients for the wild type group is narrow and

concentrated at higher correlations, the mutants all exhibit significantly broader distributions (**Fig. 4f**). To

provide a metric for the overall similarity of latent dynamics among different larvae, we calculated the

mean r of individual correlations across the five neural modes for each genotype (**Fig. 4g**). If the

computed dynamics are empirical estimates of the neural manifold, then this summary r should measure

the similarity of an individual manifold to the averaged wild type manifold. In the case of each mutant

genotype, the dynamics are significantly different from wild type, although the effect is more robust for

the *pcdh19$^{\Delta prom}$* mutants (**Fig. 4g**). While the variations along individual neural modes are not considered

to be statistically significant for the *pcdh17^{-5bp}* mutants, the aggregate impact on the shape of the neural

manifold is significant (**Fig. 4g**). Thus, loss of either *pcdh19* or *pcdh17* alters the neural population

response to visual stimulation, by introducing stochastic perturbations into circuit assembly. Our data are

consistent with the idea that δ2-pcdhs contribute to canalization of the developing optic tectum (**Fig. 4h**).

The absence of these molecules allows configurations of the network that would otherwise be

inaccessible or improbable.

Discussion

The δ2-pcdhs comprise a subfamily of homophilic cell adhesion molecules within the cadherin

superfamily that are associated with neurodevelopmental disorders in humans[40,41] . Among the five δ2-

pcdhs in mammals, all are linked to human disorders: *PCDH8* and *PCDH10* are linked to autism[42,43] , a

genomic deletion encompassing *PCDH18* caused severe intellectual disability[44] , *PCDH17* is implicated

in mood disorders[45] , and mutations in *PCDH19* cause a developmental epileptic encephalopathy[22,23] ,

and are associated with autism and schizophrenia [20,21] . We previously used large-scale *in vivo* calcium

imaging of spontaneous activity and network analysis to show that zebrafish mutants lacking *pcdh19* had

defects in network topology[46] . Subsequently, others showed that mutant rodents and zebrafish larvae

were hyperexcitable[47,48] , and that mutant rodents showed increased network synchrony[47] . Here, our

results show that loss of either *pcdh19* or *pcdh17* impairs visual processing in the optic tectum of the

larval zebrafish.

Our data show that the response of the larval optic tectum to moving sinusoidal gratings is

encoded by low-dimensional dynamics that are confined to a neural manifold. These dynamics are highly

stereotyped among wild type individuals. It was recently shown that dynamics are preserved across

individuals within a species, but these dynamics need to be aligned using a procedure such as canonical

correlation analysis[34], due to the fact that the latent dynamics are estimated from only a small subsample

of neurons that vary among animals. Here, we image a substantial proportion of the visually responsive

neurons in the optic tectum. Consequently, the latent dynamics derived from different individuals do not

require further alignment. This allows the complex neural responses of hundreds of neurons in different

animals to be reduced to a common set of activity patterns that can be quantitatively compared within

and between genotypes. The variation among wild type individual larvae is very low, indicating that

development within a population gives rise to an ensemble of equivalent networks that differ in the

precise number, morphology and connectivity of the constituent neurons, but whose overall functional

variation is small.

Elimination of either *pcdh19* or *pcdh17* leads to altered latent dynamics. The stereotyped neural

response that characterizes the population of wild type larvae is degraded in the mutants, whose

dynamics are less well correlated to the averaged wild type response. The latent dynamics among the

mutant genotypes varies by individual. As a consequence, within a mutant group, individuals are much

less similar to each other than the pool of wild type larvae are to each other. Additionally, this stochastic

variability is masked in a group average, as the deviations specific to an individual can be averaged

away. This implies that the loss of Pcdh19 or Pcdh17 does not lead to a particular, alternative network

structure, but to a stochastic array of alternatives. Thus, the effects of the *pcdh19* and *pcdh17* mutations

are best understood as an increase in developmental noise, leading to an increase in phenotypic

variability. Our data show that the effects of a well-defined genetic lesion on a simple, highly stereotyped

network can be stochastic. While both *pcdh19^{-10bp}* and *pcdh19$^{\Delta prom}$* mutants result in a complete loss of

Pcdh19 protein, their effects on the optic tectum are not identical. The phenotype associated with

Pcdh19 loss in the *pcdh19$^{\Delta prom}$* line is significantly more severe than in the *pcdh19^{-10bp}* line. Combined

with the observation that the magnitude of the impact of indel mutations in *pcdh19^{-10bp}* and *pcdh17^{-5bp}* is

similar, this suggests that the difference could be due to the activation of compensatory mechanisms by

the indel mutations that are absent in the promoterless allele. This may indicate a further source of

variability in understanding neural disorders and in the study of relevant genes in animal models, as even

alternative "null" mutations may give rise to distinct phenotypes.

In evolution, strong selective pressures prevent the accumulation of mutations that have an

adverse impact on phenotypic fitness. Release of a selective pressure can then lead to an increase in

allelic and phenotypic diversity within a population. By analogy, our results suggest that Pcdh19 and

Pcdh17 suppress variation in the development of tectal circuitry. Loss of either protocadherin releases a

constraint on circuit assembly, allowing stochastic variation in circuit organization and function. These

results suggest that Pcdh19 and Pcdh17 contribute to developmental robustness by canalizing circuit

assembly and limiting developmental variability. While canalization is most commonly discussed in terms

of gene regulatory networks buffering against adverse genetic or environmental effects[49,50] , we suggest

that the protocadherins may buffer against the formation of inappropriate connections and help guide

circuit assembly toward an optimal outcome. These results suggest that while the heterogeneity

observed in neurodevelopmental disorders is often attributed to polygenic effects, it could also be due to

decanalization of circuit assembly and stochastic degradation of circuit function.

Methods

Zebrafish maintenance and generation of lines

Adult zebrafish (Danio rerio) were maintained at ~28.5°C and staged according to Westerfield

(1995). All animal procedures were performed in accordance with the Ohio State University animal care

committee's regulations. We previously generated lines harboring germline mutations of *pcdh19*

(*pcdh19*^{os51})[36] and *pcdh17* (*pcdh17*^{os69})[37] .

The *pcdh19*$^{\Delta prom}$ mutant line (*pcdh19*^{os77}) was established by co-injecting ribonucleoprotein

complexes (Integrated DNA Technologies) consisting of Cas9 protein and gRNAs targeting a site in the

5' end of *pcdh19* exon1 (GGGCTCAGATTAACCCATCG) and ~4 kb upstream of the ATG start codon

(CTGTTGTGAGCTAGTTACCA), which is predicted to eliminate the promoter region. Founders were

identified by PCR and sequenced, confirming the large genomic deletion. Like the *pcdh19*$^{-10bp}$ line,

Western blots confirmed that the homozygous *pcdh19*$^{\Delta prom}$ line produced no Pcdh19 protein.

The plasmid *Tol2-elavl3:H2B-GCaMP8s* was assembled using the following plasmids: Tol2-

elavl3-GCaMP6s (a gift from Misha Ahrens; Addgene plasmid # 59530 ; http://n2t.net/addgene:59530 ;

RRID:Addgene_59530), CMV:Histone H2B-mGL (H2B-mGreenLantern was a gift from Gregory Petsko;

Addgene plasmid # 164464 ; http://n2t.net/addgene:164464 ; RRID:Addgene_164464), and

CMV:jGCaMP8s (gift from GENIE Project; Addgene plasmid # 162371 ; http://n2t.net/addgene:162371 ;

RRID:Addgene_162371). Along with mRNA encoding Tol2 transpose, this plasmid was co-injected into

1 cell stage *nacre* embryos in order to establish the transgenic line *Tg(elavl3:H2B-GCaMP)*^{os78}.   This

transgenic line was crossed with the *pcdh19*$^{-10bp}$, *pcdh19*$^{\Delta prom}$and *pcdh17*$^{-5bp}$ mutant lines.

Calcium imaging

Unanaesthetized 6 days-post-fertilization (dpf) larvae were embedded dorsal side up in 2% low

melting point agarose. Imaging was performed on a custom-built resonant-scanning 2-photon

microscope. Briefly, 920nm excitation was provided by an Axon920-TPC laser (Coherent, Inc.). We

used a Nikon Apochromat 25x/1.1NA water-immersion objective for imaging. The resonant scan-head

and controller, 3DMS robotic stage, Hamamatsu GaAsP photomultiplier tubes and power supply were

obtained from Sutter Instruments (www.sutter.com). A piezo-electric objective positioner (nPFocus250)

was obtained from nPoint (www.npoint.com). The microscope was run with ScanImage 5.2[51] (Vidrio

Technologies). All other parts were obtained from Thorlabs (www.thorlabs.com). Image stacks of 7

optical sections (512x512), spaced at 10 µm, were collected at 1 s intervals, with a pixel size of 0.65 µm.

For each group, we included data from 9-13 larvae, which is in line with the number of fish used in

comparable studies[52–54] . These were derived from at least two, separate crosses.

Visual stimulation

262 Visual stimuli were programmed in Python, using PsychoPy3 (https://psychopy.org). Moving sinusoidal

263 gratings were presented for 5 seconds, with 10 seconds of a neutral gray background in between each

264 direction, which were rotated at 30° intervals. The stimulus set was presented three times, with 50

265 seconds in between each presentation. Stimuli were projected onto a translucent screen 2.5 cm from the

266 larvae using a Rif6 cube picoprojector (rif6.com). The stimulus occupied ~104° of the visual field.

Data analysis

We used CaImAn-MATLAB for processing of calcium imaging movies[28] , including non-rigid

motion correction with NoRMCorre[55] . First, sequences of image stacks (735 stacks of 7 planes) were

re-formatted to movies of image planes (7 stacks of 735 timepoints). These were motion corrected and

inspected for motion artifacts. Movies that exhibited z-drift or other defects were discarded. Brightness

and contrast were adjusted and then images were masked in order to analyze only the left (visually-

responsive) hemi-tectum. CaImAn was used to segment movies and extract ΔF/F fluorescence traces.

Cells that were responsive to the visual stimuli in each of the three trials were selected for further

analysis.

Principal Component Analysis was performed on individual datasets. As ~90% of the variance

was explained by the top 5 principal components (neural modes), we restricted our analysis to these.

We projected the original neural responses onto these new basis vectors. The order of neural modes

varied among datasets, as did the sign of the neural mode. We established a standard order and

inspected each dataset to ensure a common order and sign for the neural modes. For comparisons of

neural modes among datasets, we used Pearson's correlation, r[34,35] . First, we averaged dynamics

along each neural mode to generate a wild type average. Correlation of neural modes from individual

larvae to the averaged neural modes provided a measure of the variance. As an alternative measure of

the variance in the datasets, each individual set of neural modes was correlated to all others within a

group. This pairwise correlation describes how much latent dynamics varied among individuals within a

genotype. To generate a single measure of similarity of latent dynamics between an individual and the

wild type average, we averaged the correlation coefficients across the 5 neural modes. For

comparisons, statistical significance was determined using Dunnett's test. For the comparison of

distributions of r, we used a Dunn's test. All statistical analysis was performed in JMP Pro 17.

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Figure 1. Calcium-imaging of neural responses to oriented sinusoidal gratings.
a. *Schematic of the experimental setup. A 6dpf larva is embedded in agarose in an imaging chamber, allowing*
104º view of a projection screen.
b. *The visual stimuli are presented to the right eye and the neural responses are visualized in the contralateral*
(left) hemi-tectum.
c. *The stimulation protocol is a series of 5s on 10s off of a moving sinusoidal grating, 12 directions spaced at 30º*
intervals to encompass the full 360º. This is repeated three times. Below is a lateral view of the head of a
zebrafish larva. The inset shows the directions of motion of sinusoidal gratings with reference to the rostro-caudal
axis of the fish. The direction color-code is used throughout the paper.
d. *Image stacks consisting of 7 optical sections spaced at 10 µm were collected at 1s intervals. Shown are*
average intensity images of individual planes from a timelapse sequence collected in a 6 dpf transgenic larva,
Tg(elav3l:HistoneH2B-GCaMP8s). The visually-responsive hemi-tectum is outlined in yellow.
e. *Example data showing all the fluorescence traces from visually-responsive neurons collected from one larva.*
f. *ΔF/F traces selected from those shown in **e**.*
g. *Responses were averaged across the three trials. Shown are the trial averages from the traces in **f**.*

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Figure 2. Latent dynamics in the optic tecta of zebrafish larvae in response to visual stimulation.
a. *Illustration of our approach to data analysis. Datasets such as the one shown on the left consisted of*
fluorescence traces from n neurons. These were trial averaged and the dimensionality of the trial
averaged data was reduced using PCA. The new k dimensions are referred to as neural modes.
b. *The first 5 neural modes explain ~90% of the variance in the data. The shaded area represents the*
standard deviation, n=9).
c. *Shown are the latent dynamics of an individual wild type larva for the first 5 neural modes. The latent*
dynamics were calculated independently for each of the three trials. The mean correlation of the
dynamics among the individual trials to the trial average is shown as $\bar{r}$. The presentation of each
stimulus is shown as a gray bar, and the direction of each stimulus is shown at the top.
d. *Graph summarizing the mean correlations across trials along each mode for the wild type larvae*
(0.98±0.006, mode 1; 0.94±0.012, mode 2; 0.96±0.01, mode 3; 0.95±0.017, mode 4; 0.94±0.032, mode 5
;n=9)
e. *Latent dynamics determined from trial averaged data. Traces (purple) are the dynamics from*
individual larvae and the shaded area (blue) is the variance for the wild type group. The value, $\bar{r}$,
represents the mean correlation of each individual neural mode to the mean dynamics averaged across
*the group (see **f**).*
f. *Summary of the correlation between individual larvae and the group average along neural modes*
(0.97±0.008, mode 1; 0.93±0.014, mode 2; 0.91±0.017, mode 3; 0.93±0.015, mode 4; 0.93±0.013, mode
5; n=9).
g,h. *Three-dimensional representation of latent dynamics for two, individual larvae. Each color*
represents a direction of motion for the visual stimulus. The excursions of neural trajectories during
stimulus presentation describes a roughly circular neural manifold.
i. *A three-dimensional representation of latent dynamics averaged across the wild type group (n=9).*
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Figure 3. Mutations in pcdh19 lead to altered neural dynamics.

a,b. *Shown are latent dynamics determined from trial averaged neural data collected in homozygous*
*pcdh19^{-10bp} (**a**) and pcdh19$^{\Delta prom}$ (**b**) mutant larvae. Individual traces are in teal and the shaded area in*
blue indicates the group variance. The value, $\bar{r}$, represents the mean correlation of each individual
neural mode to the group averaged neural mode.

c. *Boxplot shows the correlation of individual trial-averaged neural modes to the wild type average (wild*
type, n=9: 0.97±0.008, mode 1; 0.93±0.014, mode 2; 0.91±0.017, mode 3; 0.93±0.015, mode 4;
0.93±0.013, mode 5; pcdh19^{-10bp}, n=12: 0.84±0.035, mode 1; 0.75±0.03, mode 2; 0.85±0.027, mode 3;
0.89±0.014, mode 4; 0.91±0.015, mode 5; pcdh19$^{\Delta prom}$, n=9: 0.88±0.03, mode 1; 0.78±0.04, mode 2;
0.77±0.046, mode 3; 0.80±0.04, mode 4; 0.78±0.022, mode 5; *p<0.05, Dunnett's test).

d. *Pairwise within-group correlations of neural modes for each genotype (wild type,n=36: 0.94±0.013,*
mode 1; 0.84±0.028, mode 2; 0.81±0.038, mode 3; 0.85±0.031, mode 4; 0.85±0.023, mode 5; pcdh19^{-}
^{10bp}, n=66: 0.71±0.064, mode 1; 0.56±0.076, mode 2; 074±0.051, mode 3; 0.82±0.03, mode 4;
0.86±0.022, mode 5 ; pcdh19$^{\Delta prom}$, n=36: 0.78±0.05, mode 1; 0.59±0.075, mode 2; 0.61±0.095, mode 3;
0.64±0.031, mode 4; 0.63±0.056, mode 5; *p<0.05, Dunnett's test).

e,f. *Three-dimensional representations of latent dynamics of individual pcdh19$^{\Delta prom}$ mutant larvae. The*
*view is the same as in **Fig. 2g-i**.*

g. *Neural modes were averaged within each genotype (wild type/purple, pcdh19^{-10bp}/blue,*
pcdh19$^{\Delta prom}$/teal. The value, r, represents the correlation of each mutant average with the wild type
average (pcdh19^{-10bp}/blue, pcdh19$^{\Delta prom}$/teal).

Figure 4. Mutations in pcdh17 lead to altered neural dynamics.
a. *Latent dynamics computed from trial averaged neural data collected in homozygous pcdh17^{-5bp} mutant larvae. Individual traces are in orange and the shaded area in blue indicates the group variance. The value, $\bar{r}$, represents the mean correlation of each individual neural mode to the group average of that neural mode.*
b. *The correlation of individual trial-averaged neural modes to the wild type average (wild type: 0.97±0.008, mode 1; 0.93±0.014, mode 2; 0.91±0.017, mode 3; 0.93±0.015, mode 4; 0.93±0.013, mode 5, n=9; pcdh17^{-5bp}: 0.87±0.042, mode 1; 0.83±0.04, mode 2; 0.87±0.019, mode 3; 0.89±0.027, mode 4; 0.87±0.093, mode 5, n=13).*
c. *Pairwise within-group correlations of neural modes for wild type (purple) and pcdh17 mutants (orange). (wild type, n=36: 0.94±0.013, mode 1; 0.84±0.028, mode 2; 0.81±0.038, mode 3; 0.85±0.031, mode 4; 0.85±0.023, mode 5; pcdh17^{-5bp}, n=78: 0.78±0.055, mode 1; 0.71±0.053, mode 2; 0.77±0.037, mode 3; 0.79±0.039, mode 4; 0.79±0.035, mode 5; *p,0.05, Dunnett's test).*
d. *Neural modes were averaged for pcdh17^{-5bp} mutants (orange) and the average was compared to the wild type average (purple). The value, $\bar{r}$, represents the correlation of each mutant average with the wild type average.*
e. *The mean trial to trial correlations are shown for wild type (purple), pcdh19^{-10bp} (blue) pcdh19$^{\Delta prom}$ (teal), and pcdh17^{-5bp} (orange) mutants. Trial-to-trial variability in the mutants is not statistically different from wild type larvae (wild type, n=9: 0.98±0.006, mode 1; 0.94±0.012, mode 2; 0.96±0.01, mode 3; 0.95±0.017, mode 4; 0.94±0.032, mode 5; pcdh19^{-10bp}: 0.92±0.034, mode 1; 0.89±0.034, mode 2; 0.92±0.022, mode 3; 0.92±0.027, mode 4; 0.91±0.036, mode 5; pcdh19$^{\Delta prom}$: 0.91±0.024, mode 1; 0.90±0.025, mode 2; 0.90±0.025, mode 3; 0.90±0.015, mode 4; 0.85±0.049, mode 5; pcdh17^{-5bp}, n=13: 0.97±0.009, mode 1; 0.95±0.009, mode 2; 0.94±0.013, mode 3; 0.94±0.012, mode 4; 0.92±0.026, mode 5).*
f. *Cumulative probability histogram for the distribution of all pairwise within group r values for wild type (purple), pcdh19^{-10bp} (blue) pcdh19$^{\Delta prom}$ (teal), and pcdh17^{-5bp} (orange) mutants. (**p<0.0001, Dunn's test).*
g. *Mean correlation (r) of individual datasets to the wild type average, averaged across neural modes (wild type, n=9: 0.90±0.018; pcdh19^{-10bp}, n=12: 0.83±0.017; pcdh19$^{\Delta prom}$, n=9: 0.74±0.033; pcdh17^{-5bp}, n=13: 0.82±0.028;*p<0.05, **p<0.0001, Dunnett's test).*
h. *Hypothesized roles of Pcdh19 and Pcdh17 in canalyzing the assembly of visual circuits in the zebrafish optic tectum. In the wild type scenario (left/purple), development is canalized and the outcomes (circuit response to visual stimulation) is restricted, showing a small distribution in outcomes (shaded Gaussian). In the case of protocadherin mutants (right/teal), the developmental landscape is flattened, allowing development to stochastically explore a variety of alternative paths, leading to an increased variation among outcomes (broad shaded distribution).*

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