Spatiotemporal organization of exocytosis emerges during neuronal shape change

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Neurite elongation and branching in developing neurons requires plasmalemma expansion, hypothesized to occur primarily via exocytosis. We posited that exocytosis in developing neurons and nonneuronal cells would exhibit distinct spatiotemporal organization. We exploited total internal reflection fluorescence microscopy to image vesicle-associated membrane protein (VAMP)-pHluorin-mediated exocytosis in mouse embryonic cortical neurons and interphase melanoma cells, and developed computer-vision software and statistical tools to uncover spatiotemporal aspects of exocytosis. Vesicle fusion behavior differed between vesicle types, cell types, developmental stages, and extracellular environments. Experiment-based mathematical calculations indicated that VAMP2-mediated vesicle fusion supplied excess material for the plasma membrane expansion that occurred early in neuronal morphogenesis, which was balanced by clathrin-mediated endocytosis. Spatial statistics uncovered distinct spatiotemporal regulation of exocytosis in the soma and neurites of developing neurons that was modulated by developmental stage, exposure to the guidance cue netrin-1, and the brain-enriched ubiquitin ligase tripartite motif 9. In melanoma cells, exocytosis occurred less frequently, with distinct spatial clustering patterns.

Introduction

Exocytosis is a fundamental behavior, ubiquitous across eukaryotes and cell types. Vesicle fusion promotes secretion of biomolecules and insertion of transmembrane proteins and lipids into the plasma membrane, which can affect physiological processes including polarized growth and motility (Mostov et al., 2000; Winkle et al., 2014). Where and when vesicle fusion occurs may be a critical regulatory point in cellular physiology. The minimal machinery required for fusion is the SNARE complex (Söllner et al., 1993), comprising a tightly associated bundle of four α-helical coiled-coils (CCs). For exocytosis, one α-helix is provided by a vSNARE, such as vesicle-associated membrane protein (VAMP) 2 (synaptobrevin), VAMP3, or VAMP7 (tetanus-insensitive VAMP) in mammals or snc12 in yeast (McMahon et al., 1993; Protopopov et al., 1993; Galli et al., 1998). Other α-helices are provided by plasma membrane target (t)-SNAREs—syntaxin-1 and synaptosomal-associated protein 25 (SNAP25)—in mammals or Sso1p/Sso2p and sec9 in yeast (Aalto et al., 1993; Söllner et al., 1993; Brennwald et al., 1994).

VAMP2, SNAP25, and syntaxin-1 were identified in brain, where they mediate synaptic vesicle fusion and neurotransmitter release. VAMP7 functions in SNARE-mediated exocytosis in both neurons and nonneuronal cells (Galli et al., 1998; Martinez-Arca et al., 2000). Subsequent to synaptic vesicle release, clathrin-dependent endocytic retrieval of membrane material maintains membrane homeostasis (Heuser and Reese, 1976). Perhaps less appreciated than synaptic exocytosis is the developmental exocytosis that occurs before synaptogenesis. The acquisition of an elongated, complex neuronal morphology entails significant plasma membrane expansion, estimated at 20% per day (Pfenninger, 2009). This is remarkable when compared with concomitant neuronal volume increases estimated at less than 1%. We previously demonstrated that constitutive SNARE-mediated exocytosis is required during neuritogenesis and axon branching (Gupton and Gertler, 2010; Winkle et al., 2014). We hypothesize exocytosis provides membrane material to the expanding plasma membrane, which can only stretch 2–3% before rupturing (Bloom et al., 1991), however whether SNARE-mediated exocytosis supplies sufficient material for membrane expansion has not been addressed. Asymmetric exocytosis is linked to attractive axonal turning (Tojima et al., 2007, 2014; Ros et al., 2015). As several neurological disorders are accompanied by disrupted neuronal morphology (Paul et al., 2007; Engle, 2010), regulated exocytosis involved in appropriate neuronal morphogenesis is likely central to the formation and maintenance of a functional nervous system. However, how exocytosis is spatially and temporally organized in developing neurons is not known.

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To visualize exocytic vesicle fusion, here we exploited the pH-sensitive variant of GFP (pHluorin) attached to the luminal side of a v-SNARE, which illuminates the occurrence of fusion pore opening between the acidic vesicular lumen and the neutral extracellular environment (Miesenböck et al., 1998). Analysis of such images has remained a manual and potentially biased time-intensive process. Here we developed computer-vision software and statistical methods for unbiased automated detection and analysis of VAMP-pHluorin–mediated exocytosis. This uncovered spatial and temporal organization and regulation of exocytosis in developing neurons that were distinct in soma and neurites, modulated by the developmental stage of the neuron, and sensitive to the axon guidance cue netrin-1. Mathematical estimates based on empirical findings suggested that VAMP2-mediated exocytosis and clathrin-mediated endocytosis approximately describe membrane expansion in developing neurons. Compared with neurons, melanoma cells exhibited slower frequencies and a distinct organization of exocytosis.

**Results**

**Automated identification and analysis of exocytosis**

Whether exocytosis is sufficient for neuronal plasmalemmal expansion, how fusion is organized spatially and temporally, and the mechanisms that regulate developmental exocytosis are not established. We imaged VAMP2-pHluorin or VAMP7-pHluorin in mouse embryonic cortical neurons using widefield epifluorescence or total internal reflection fluorescence (TIRF) microscopy to visualize exocytosis (Fig. S1 A). The area-corrected frequency of VAMP2-mediated exocytosis at the basal plasma membrane measured from the TIRF images was ~1.4-fold higher than measured by widefield microscopy, which captures events at both basal and apical membranes (Fig. S1 B). In contrast, the frequency of VAMP7-mediated exocytosis was comparable between the two imaging modes (Fig. S1 B). VAMP2-pHluorin exhibited a higher plasma membrane fluorescence than VAMP7-pHluorin (Fig. S1 C), which may occlude identification of apical VAMP2-mediated events. Indeed, events at the apex of the soma were visible by widefield microscopy only when the focal plane was shifted (Fig. S1 D, black arrows). This suggests that VAMP2-mediated events were not captured simultaneously on both membranes, and that the frequency of fusion observed by widefield microscopy was an underestimation. We conclude that the frequency of exocytosis is comparable between apical and basal plasma membranes for both VAMP2- and VAMP7-mediated exocytosis (Fig. S1, B and D), and was best captured by TIRF microscopy. For subsequent analysis, we relied on TIRF microscopy, which also offered increased signal-to-noise and spatial resolution, reduced photobleaching and phototoxicity, and faster image acquisition.

To perform unbiased, efficient identification and analysis of VAMP2-pHluorin–mediated exocytosis from TIRF images, we developed a computer-vision–based approach implemented in MATLAB and R (Fig. 1 A, Video 1, and supplemental .m and .R files). In the analysis pipeline, the cell was identified and segmented from noncellular background and a single cell mask was created, as cells did not significantly change shape or size over imaging (~2 min). We developed an algorithm that detected both diffraction-limited and larger fluorescent objects (Fig. 1 A; see Materials and methods). To assemble a coherent picture of exocytic events over time, fluorescent objects representing individual vesicles that may be undergoing exocytosis are linked across frames using a Kalman filter (Kalman, 1960; Fig. 1 B and Fig. S2 A). The Kalman filter used a cost matrix to determine whether an object detected in one frame was a new object, i.e., a fusion pore opening, or an existing object, i.e., the continuation of an exocytic event. Critically, the Kalman filter can handle the linkage of both motile objects, such as a motile fluorescent vesicle, and nonmotile objects, such as a fusing vesicle. Bona fide exocytic events were defined as transient, nonmotile objects that reached a significant intensity above the mean local background intensity calculated from previous frames, followed by an exponential fluorescence decay, with no limit on how long an event could last (Fig. 1 C; see Materials and methods).

**Confirmation of exocytic detection**

To test the algorithm accuracy at identifying transient events, neurons were treated with NH₄Cl (Fig. 1 D and Video 2), which alkalinizes intracellular vesicular compartments, reversing quenching of pHluorin fluorescence (Miesenböck et al., 1998). NH₄Cl treatment increased vesicular fluorescence (Fig. 1 D), and events detected were near or at zero, indicating the algorithm identified only transient fluorescent exocytic events. To confirm identified events were VAMP2-dependent, neurons were treated with tetanus neurotoxin (TeNT), which cleaves the cytoplasmic face of VAMP2, preventing SNARE complex formation and fusion (Link et al., 1992). VAMP2-pHluorin–mediated fusion events were rarely detected, if at all, indicating that the algorithm identified TeNT-sensitive events (Fig. 1 D and Video 2). To ensure images were acquired at a sufficient frame rate to capture all events, we artificially decreased sampling. At an acquisition rate of 1 Hz, the frequency of detected events was underestimated as compared with 5 Hz; no further improvement occurred at 10 Hz (Fig. 1 E). We subsequently used an acquisition rate of 10 Hz to satisfy the Nyquist criterion and ensure ample resolution for analyses of individual exocytic events. To assess the robustness of the algorithm to local background variation caused by plasma membrane–localized VAMP2-pHluorin and system noise, and to calculate true error rates, computer simulations of exocytic events based on empirical measurements were created (Fig. 1 F; see Materials and methods). The detection software was robust to the typical signal-to-noise ratio observed experimentally, with an error rate 2–7% (Fig. 1 G), comparable or better than other algorithms (Sebastian et al., 2006; Yuan et al., 2015).

A series of measurements were made to describe the population of fusing vesicles (Fig. 1, H–L), including the frequency of exocytosis per neuron (Fig. 1 I); the peak change in fluorescence per event (ΔF/F; Fig. 1, H and J), which estimates the amount of VAMP2-pHluorin per vesicle; the event $t_{1/2}$ (Fig. 1, H and K), which represents how quickly the VAMP2-pHluorin fluorescence decayed; the shape of the initial exocytic boundary (major/minor axis; Fig. 1 L), and the time and location (x, y) of fusion. The shape of the $t_{1/2}$ distribution exhibited no artificial truncation, indicating events with short or long $t_{1/2}$ were detected. The frequency of VAMP2-pHluorin exocytic events detected from TIRF images by the software was not different from that counted by several independent trained users (Fig. 1 I; P = 0.56).
Figure 1. Automated identification and analysis of VAMP-pHfluorin mediated exocytosis. (A) Overview of automated software. A cell mask is generated, followed by fluorescent maxima detection. A tracking matrix connects candidate events over time (Frame-to-Frame Tracking). (B) The tracking matrix was constructed using a Kalman filter to link a single exocytic event into a track over multiple frames. (C) Schematic and TIRF image montage show a typical exocytic event. Prefusion, VAMP2-pHfluorin is not fluorescent (1, blue). Upon fusion pore opening (2, green), a bright fluorescent diffraction-limited spot appears. The VAMP2-pHfluorin diffuses in the membrane over time (3, orange). (D) Example minimum projections of inverted TIRF time-lapse images before or after treatment with NH4Cl or TeNT. NH4Cl or TeNT treatment reduced the number of events detected (box plot, median ± interquartile range (IQR); whiskers reach minimum and maximum values within 1.5 times the IQR; n = 6 neurons per condition). See Video 2. (E) Box and whisker plots of effect of acquisition rate on exocytic detection (n = 17). (F) Examples of simulated images with noise of increasing Gaussian or Poisson intensity demonstrate the robustness of the algorithm to image background and system noise. Six simulations of exocytic events with increasing Gaussian or Poisson intensity demonstrate the robustness of the algorithm to image background and system noise. Typical experimental signal-to-background is highlighted in cyan. (H) ΔF/F for an individual exocytic event. Fusion pore opening occurs at time = 0 s. The normalized peak
Confirmation of detection of VAMP7-mediated exocytosis

We next tested whether the algorithm also accurately detected VAMP7-mediated events. Surprisingly, the frequency of VAMP7-mediated exocytosis detected was considerably lower than we previously reported using manual analysis (∼15-fold less; Fig. S1 B; Winkle et al., 2014). Alkalization with NH₄Cl revealed numerous VAMP7-containing vesicles and confirmed VAMP7-pHluorin fluorescence was quenched by low pH (Fig. S3 A). To ensure the algorithm was capable of detecting VAMP7-mediated fusion, we coexpressed VAMP7-pHluorin along with an activating VAMP7 mutant lacking the autoinhibitory longin domain (VAMP7ΔLD; Martinez-Arca et al., 2000). VAMP7ΔLD expression increased the frequency of VAMP7-mediated exocytosis (Fig. S3 B), as previously shown (Burgo et al., 2013), demonstrating the algorithm was capable of detecting VAMP7-mediated events.

Several potential factors could account for the disparity between the algorithm and hand-counted VAMP7-mediated exocytosis, including different image acquisition rates, unique attributes of VAMP7-containing vesicles, and the more rigorous definition of a fusion event used by the algorithm. Artificially decreasing the temporal resolution of images to match the 2-Hz sampling rate used previously (Winkle et al., 2014) increased apparent exocytic frequency (Fig. S3 C) but did not account for the differences between automated and manually defined values. Because these newly identified events met algorithm requirements only at reduced temporal resolution, we conclude they were unlikely true events. The peak ΔF/F and t₁/₂ were not significantly different between VAMP2-pHluorin and VAMP7-pHluorin (Fig. S3 D), indicating these were not the sources of incongruence. Along with artificially lowering the sampling rate, relaxing the algorithm requirement that events be nonmotile, a parameter that was difficult to assess manually, permitted the software to capture an exocytic frequency indistinguishable from previous studies (Fig. S3 C; Winkle et al., 2014). The mean squared displacement of events detected under this relaxed requirement was higher for VAMP7 than VAMP2 (Fig. S3 E), explaining why VAMP7-mediated events were previously overestimated and VAMP2-mediated events were not. To examine whether motile fluorescent puncta represented actual exocytic events, we coexpressed the autoinhibitory longin domain (VAMP7-LD; Martinez-Arca et al., 2000) with VAMP7-pHluorin. As reported, VAMP7-LD expression decreased VAMP7-pHluorin-mediated exocytic events when the nonmotile requirement was included in the detection algorithm (Fig. S3 B). Upon relaxation of this parameter, an increase in motile, VAMP7-mediated events was detected (Fig. S3, B and E). Together these results suggest that motile fluorescent events are not true exocytic events, and that the algorithm accurately detects exocytosis.

Spatiotemporal changes in exocytosis occur during development

With the algorithm validated, we set out to investigate developmental exocytosis. Dissociated neurons initially exhibit a “pancake-like” shape with peripheral protrusions. By 24 h in vitro, protrusions coalesce into immature neurites. By 48 h, neurons typically have several defined neurites, one of which is significantly longer and considered the axon. By 72 h, neurons are characterized by longer neurites and a longer, potentially branched axon. We hypothesized the temporal and spatial distribution of exocytosis in neurons would change over developmental time, and potentially involve fusion of both VAMP2- and VAMP7-containing vesicles. We measured VAMP2-pHluorin and VAMP7-pHluorin exocytic parameters in mouse embryonic day 15.5 (E15.5) cortical neurons after 24, 48, and 72 h in vitro (Fig. 2, A–I; and Videos 3 and 4). The rate of VAMP7-mediated exocytosis was negligible under these conditions (Fig. 2 E), so we focused on VAMP2-mediated exocytosis. We mapped the spatial occurrence and density of VAMP2-pHluorin–mediated events (Fig. 2 A), which suggested that their spatial distribution was not uniform. Neurons were segmented into soma and neurite regions of interest, and the frequencies of VAMP2-mediated exocytosis were compared, controlling for basal cell surface area (Fig. 2, B–D). At 24 h, exocytic frequency was faster compared with 48 and 72 h (Fig. 2 B), and faster in the soma compared with neurites (Fig. 2, C and D). This relationship between exocytic frequency in soma and neurites remained between 24 and 48 h (Fig. 2, C and D). However, at 72 h, a redistribution occurred, with an increased frequency of events in neurites and decreased frequency in the soma (Fig. 2, C and D).

Exocytic heat maps revealed that events were potentially clustered into spatial hot spots (Fig. 2 A). To determine if exocytosis was organized nonrandomly and to distinguish between clustering, randomness, or regular spacing (dispersal) of exocytic events, we adapted Ripley’s K function (Ripley, 1976; see Materials and methods; Fig. 2, F and G). There has been limited use of the K function for analysis of exocytosis, restricted to individual cells of simple morphology (Díaz et al., 2010; Yuan et al., 2015). Group comparisons have not been performed, which limits statistical power, comparisons, and conclusions. In our case, an aggregated Ripley’s K function (L(r)) compares the experimental distances in space or time between detected events in multiple cells (Fig. 2 F) against the theoretical distances between the same number of events if they occurred randomly in the same space or time. Simulated random events were performed for each test group, based on the experimental events and experimental space or time. When the experimental Ripley’s K function ± SEM (L_{obs}[r]) and the theoretical random Ripley’s K function (L_{theo}[r]; Fig. 2 G, red line) overlap, events were randomly organized. At distances where L_{obs}(r) rose above L_{theo}(r), exocytosis was clustered (P < 0.05), and at distances where L_{obs}(r) fell below L_{theo}(r), events were dispersed (P < 0.05). At 24 h, exocytosis exhibited spatial randomness in soma and neurites as well as temporal randomness (Fig. 2, H and I). In contrast, at 48 and 72 h, exocytosis was clustered into spatial hot spots in both neurites and soma (Fig. 2 H), with higher clustering in the soma (P < 0.05). Spatial clustering in each region did not change between 48 and 72 h (P > 0.05). However, exocytosis became clustered into temporal bursts at these time points. Thus, spatial and temporal organization of exocytosis...
Figure 2. **Spatiotemporal changes in exocytosis during neuronal development.** (A) Heat maps of the density of VAMP2-mediated exocytosis in cortical neurons cultured in vitro for 24, 48, or 72 h before imaging. The blue and orange boxes demarcate soma and neurite examples used in F, respectively. (B) Frequency of VAMP2-pHluorin mediated exocytosis for basal plasma membrane of cortical neurons over developmental time. (*, P < 0.05; n = 17 cells per condition and 464, 455, and 466 exocytic events per condition; box and whiskers plots, box shows median ± IQR and whiskers reach minimum and maximum values within 1.5 times the IQR). See Video 3. (C and D) Box and whiskers plots of frequency of VAMP2-pHluorin–mediated exocytosis in the soma (C) and neurites (D) of cortical neurons. (E) Box and whiskers plots of frequency of VAMP7-pHluorin–mediated exocytosis for basal plasma membrane was not significantly different between time points (n = 14 cells per condition). See Video 4. (F) Schematics of Ripley’s L(r) function in spatial and temporal dimensions. Red dots represent exocytic events. (G) Example of Ripley’s L(r) analysis. The mean L(r) value of the aggregated data from multiple replicates (L_\text{obs}[r], black line) and standard error of the data (L_\text{err}[r], pink) is compared with the expected L(r) value of completely random exocytic events (L_\text{theo}[r], red dashed line). (H) Spatial Ripley’s L(r) function analysis revealed that events were randomly distributed in the soma at 24 h, whereas exocytosis occurred in spatial clusters in the soma at 48 and 72 h. Exocytosis followed a similar pattern in the neurites (L_\text{obs}[r] = mean of 17 per condition). (I) Temporal Ripley’s L(t) function of exocytic events over time in mouse cortical neurons, yet temporal bursts of exocytosis at 48 and 72 h in vitro (L_\text{obs}[t] = mean of 17 per condition). See Video 3.
evolved from random to clustered during neuronal morphogenesis and was distinct in the soma and neurites.

A mathematical approximation of membrane expansion

To determine the significance of VAMP2-mediated exocytosis in the expansion of neuronal surface area, we sought to calculate plasma membrane expansion and exocytic addition of membrane. A similar basal neuronal surface area was estimated from TIRF images of VAMP2-pHluorin and CAAX-GFP (Fig. S4 A). Folding of the plasma membrane was not observed in neurons expressing CAAX-GFP or VAMP2-pHluorin, whereas plasma membrane folding was apparent in nonneuronal cells in the culture expressing CAAX-GFP (Fig. S4 B). Scanning electron microscopy revealed that the apical membrane of neurites was flat, and only minimal apical membrane ruffling occurred on the growth cone and soma (Fig. S4 C). The neurite surface area was thus approximated by doubling the basal area. To account for the 3D shape of the soma with a flat basal surface area adhered to the coverslip, the soma was fit to a truncated ellipsoid. The height of the ellipsoid was approximated via confocal z-stacks (Fig. S4 D) and the length and width via the longest and shortest axes of the soma (Fig. S4 E). Neurite and soma surface areas were summated to estimate neuronal surface area. We derived the increase in cell surface area between 24 and 48 h using a Bayesian linear model, based upon empirical neuronal surfaces area measurements, using time in vitro as a categorical predictor (Fig. 3 A; see Materials and methods). Posterior predictive checking indicated that the model was a good fit (Fig. 3 B), with predicted credible regression lines showing a positive increase in surface area at 24 and 48 h (Fig. 3 C). The 90% confidence interval showed that the surface area increased by 979–1018 µm² with a mean of 999 µm² (Fig. 3 D, blue line). This amounted to a ~57% increase over a 24-h time period, more than previous estimates (Pfenninger, 2009).

We estimated the surface area added by VAMP2-mediated exocytosis using the frequency of exocytosis (Fig. 2 B) and surface area of vesicles. A potential range of vesicular surface areas was approximated from vesicle diameters measured from transmission electron micrographs of cortical neurons at 48 h in vitro, with the assumption that vesicles were spherical (Fig. 3 E). Assuming a single population of vesicles with unimodal size distribution, and correcting for capturing random slices smaller than the actual vesicle diameter, we took the conservative estimate that the 75th percentile of the interquartile range represented the vesicle diameter (130 nm; Plooster et al., 2017). We also considered a smaller vesicle population, using the 25th percentile of the interquartile range (80 nm). We estimated membrane addition between 24 and 48 h in vitro, using the following formula:

\[
y = \begin{cases} 
    y_{\text{upper}} = S + (f_{24} \times z), \\
    y_{\text{lower}} = S + (f_{48} \times z), 
\end{cases}
\]

where \( y \) represents predicted neuronal surface area at 48 h, \( S \) is neuronal surface area at 24 h, \( f_{24} \) and \( f_{48} \) are exocytic frequency at 24 and 48 h, respectively, and \( z \) is surface area of vesicles. Because the frequency of exocytosis was not measurably different on basal and apical membranes (Fig. S1), we used the mean frequency of basal exocytosis at 24 and 48 h (Fig. 2 B) to define the upper and lower bounds of VAMP2-mediated addition. The predicted mean membrane addition was ~868–1,737 µm² using the smaller vesicle size, and ~2,200–4,587 µm² using the larger vesicle size. These results suggested that VAMP2-mediated exocytosis provided excess material for developmental plasma membrane expansion (Fig. 3 D, green lines).

This excess delivery may be balanced by compensatory endocytosis. Both clathrin-mediated and clathrin-independent endocytosis occur at the synapse (Watanabe et al., 2013; Dellendorf et al., 2016), but the relative contributions of different forms of endocytosis at the synapse and in developing neurons is not known. In several cell types investigated, 95% of membrane internalization occurs through clathrin-mediated endocytosis (Pearse, 1976; Bitsikas et al., 2014). Therefore, we used tagRFP–clathrin light chain (Shaner et al., 2008) in conjunction with TIRF microscopy to measure the frequency of clathrin-mediated endocytosis (Fig. 3 F). The rate of endocytosis did not change between 24 and 48 h (Fig. 3 F). To exclude the clathrin coat, we measured the inner diameter of clathrin-coated vesicles from electron micrographs (34 nm; Fig. 3 G). With an additional parameter of clathrin-mediated membrane internalization, we updated our formula:

\[
y = \begin{cases} 
    y_{\text{upper}} = S + (f_{24} \times z) - (e_{24} \times x), \\
    y_{\text{lower}} = S + (f_{48} \times z) - (e_{48} \times x), 
\end{cases}
\]

where \( e_{24} \) and \( e_{48} \) are the endocytic frequency at 24 and 48 h and \( x \) is the surface area of clathrin-coated vesicles.

The new predicted mean membrane addition between 24 and 48 h was ~1–868 µm² using the smaller exocytic vesicle estimation, and ~547–2416 µm² using the larger vesicle estimation (Fig. 3 D, orange lines). These results suggest that, by first approximation, plasma membrane expansion in cortical neurons can be explained by VAMP2-mediated exocytosis and clathrin-mediated endocytosis.

Netrin-1 modulates the spatiotemporal distribution of exocytic events in neurites

To further determine how exocytosis is organized during neuronal morphogenesis, we investigated the consequences of bath application of netrin-1 (Fig. 4, A–I), a guidance cue that accelerates neuronal morphogenesis (Winkle et al., 2016). Further validating the accuracy of the automated software, we confirmed previous findings (Winkle et al., 2014) that netrin stimulation increased the frequency of exocytosis (Fig. 4 E). Analysis of individual events identified parameters that were insensitive to netrin, including the major/minor axis of the vesicle fusion event, the peak \( \Delta F/F \), and the \( t_{1/2} \) (Fig. 4, A–C). This suggests that netrin altered the probability of fusion, but the same vesicles fuse with the plasma membrane using similar mechanisms, as they contained indistinguishable amounts of VAMP2-pHluorin, and fluorescence dissipated with identical patterns.

Mapping the location and density of events (Fig. 4 D) revealed that netrin altered their nonuniform spatial distribution. Interestingly, netrin increased the frequency of exocytosis in the soma by ~31% (Fig. 4 F), yet increased the frequency in neurites by 92% (Fig. 4 G), indicating neurites have increased responsiveness to netrin. Ripley’s K function revealed that exocytic events were nonrandomly clustered at all distances in soma and neurites. In neurites, netrin enhanced clustering (Fig. 4 H). In contrast, spatial clustering in the soma appeared to relax after netrin addition, although these changes were not significant. Ripley’s L(r) function showed temporal exocytic clustering that was lost upon netrin
Figure 3.  A mathematical estimation of membrane expansion. (A) Hierarchical diagram of the Bayesian linear model of neuronal surface area increases. Probability distributions (blue) of surface areas at 24 and 48 h represent priors imposed, with mean $\mu$ and SD $\sigma$ for the normal distributions, and a uniform distribution for the model error. (B) Posterior predictions of surface area expansion by the model (orange lines) were compared with actual data (black line) to check for model fit. (C) Credible regression lines (orange) and mean (blue line) regression line of predicted plasma membrane expansion ($n = 400$ credible regression lines, $n = 62$ cells). (D) Estimates of membrane addition between 24 and 48 h. The black line is the measured surface area at 24 h in vitro. The blue line and blue shaded area represent predicted amount of plasma membrane expansion using a Bayesian linear model (A–C). Green lines represent predicted membrane added by VAMP2-mediated exocytosis. Orange lines represent predicted net membrane addition from VAMP2-mediated exocytosis after accounting for clathrin-mediated membrane removal. (E) Example transmission electron micrograph and histogram of measured diameters of non–clathrin-coated vesicles with density line overlaid (black solid line), 25th percentile (red dotted line), and 75th percentile (black dotted line) of the interquartile range ($n = 88$). (F) Box and whisker plots of frequency of clathrin-mediated endocytosis ($n = 7$ cells at 24 h and $n = 8$ cells at 24 h; box represents median ± IQR and whiskers reach minimum and maximum values within 1.5 times the IQR). (G) Example transmission electron micrograph and histogram of measured diameters of clathrin-coated vesicles with a density line overlaid (black solid line). The 25th percentile of the interquartile range (red dotted line, 30 nm) and 75th percentile of the interquartile range (black dotted vertical line, 40 nm; $n = 13$).
addition (Fig. 4 I). These results suggest that netrin modulates the distribution of exocytosis specifically in neurites and dissipates temporal clustering.

**Tripartite motif 9 is required for netrin-dependent exocytic changes in neurites**

To determine how netrin differentially affected exocytosis in the soma and neurites, we investigated the brain-enriched E3 ubiquitin ligase tripartite motif (TRIM) 9, implicated in constraint of exocytosis and netrin responses (Winkle et al., 2014). Genetic loss of Trim9 did not change the major/minor axis of the initial vesicle fusion event, the peak ΔF/F, or the event \( t_{1/2} \) (Fig. 4, A–C). Although Trim9 deletion increased exocytic frequency and blocked netrin-dependent increases in exocytic frequency (Fig. 4 E), responses in the soma were similar to Trim9+/+ neurons (Fig. 4 F), indicating somatic responses were TRIM9-independent. Neurites of Trim9−/− neurons, however, exhibited an approximately threefold increased frequency of basal exocytosis.
that was not further increased by netrin (Fig. 4 G). This suggests that TRIM9 regulates VAMP2-mediated exocytosis in neurites.

Ripley’s K function indicated that exocytic events were nonrandomly clustered at all distances measured in soma and neurites of Trim9−/− neurons (Fig. 4 H). Similar to Trim9+/+ neurons, spatial clustering in Trim9−/− neurites appeared to relax after netrin addition. In contrast, spatial clustering in Trim9−/− neurons failed to increase in response to netrin (Fig. 4 H). Further, temporal clustering of exocytic events in Trim9−/− neurons persisted after netrin-1 addition (Fig. 4 I). This suggests that netrin-dependent modulation of the spatial distribution of exocytosis in neurites and the temporal clustering of exocytosis are TRIM9-dependent.

**Different domains of TRIM9 modulate specific parameters of exocytosis in neurites**

TRIM9 is a TRIM E3 ubiquitin ligase, characterized by a ubiquitin ligase RING domain, two BBox domains that modulate ligase activity, and a CC motif that mediates multimerization (Fig. 5 A). The TRIM9 CC motif also binds the exocytic t-SNARE SNAP25 (Li et al., 2001) and blocks SNARE complex formation and vesicle fusion (Winkle et al., 2014). The TRIM9 C-terminal SPRY domain binds the netrin receptor DCC (Winkle et al., 2014). To elucidate how these domains modified parameters of exocytosis and netrin response, we performed structure-function analysis. Expression of full-length and domain mutants of TRIM9 (Fig. 5 A) lacking the RING domain (TRIM9ΔRING), the DCC binding SPRY domain (TRIM9ΔSPRY), or the CC motif (TRIM9ΔCC) in Trim9−/− neurons further indicated that TRIM9-dependent regulation of exocytosis occurred only in neurites (Fig. 5, B–D). Reintroduction of full-length TRIM9 reduced the elevated basal frequency of exocytosis and returned netrin sensitivity to exocytic frequency in neurites (Fig. 5 C), exocytic clustering in neurites (Fig. S5 A), and relaxation of temporal clustering (Fig. S5 B).

TRIM9ΔRING expression reduced elevated basal frequency of exocytosis in neurites, but failed to rescue netrin-dependent changes in exocytic frequency (Fig. 5 C), spatial clustering (Fig. S5 A), or temporal clustering (Fig. S5 B). This indicated the ligase domain was unnecessary to constrain exocytosis, but required for response to netrin. Although previous studies demonstrated that TRIM9-dependent ubiquitination altered substrate function (Menon et al., 2015; Plooster et al., 2017), we did not observe netrin-1 or TRIM9-dependent changes in the ubiquitination of SNAP25 (Fig. S5 C), suggesting that ubiquitin-dependent modulation of SNAP25 did not explain TRIM9-dependent changes in exocytosis. Expression of TRIM9ΔSPRY or TRIM9ΔCC failed to reduce the elevated frequency of exocytosis in the neurites (P = 0.23 and P = 0.33, respectively; Fig. 5 C) or the netrin-dependent reduction in temporal clustering (Fig. S5 B). Expression of TRIM9ΔSPRY, but not TRIM9ΔCC, rescued the spatial exocytic clustering in response to netrin-1 (Fig. S5 A), suggesting that TRIM9ΔSPRY retains partial netrin sensitivity. Together these results suggest that distinct domains of TRIM9 specifically constrain exocytosis and regulate spatial and temporal clustering in response to netrin.

**Exocytosis in melanoma cells is distinctly organized**

In contrast to developing neurons, nonneuronal interphase cells are typically at a steady-state size. To determine if spatial and temporal control of exocytosis varied in such a case, we investigated human VMM39 melanoma cells. We monitored exocytosis mediated by ubiquitous v-SNAREs by imaging VAMP3-pHluorin or VAMP7-pHluorin (Fig. 6 and Video 5). VAMP3-pHluorin and VAMP7-pHluorin exhibited no difference in the frequency of exocytosis (Fig. 6 A); however, this frequency was slower than mediated by VAMP2 and faster than...
mediated by VAMP7 in neurons ($P = 0.002$ and $P = 0.017$, respectively). Mapping the location and density of VAMP3- and VAMP7-mediated events revealed their spatial distributions were distinct (Fig. 6 B). VAMP7-mediated events appeared polarized, whereas VAMP3-mediated events were distributed throughout the cell. To quantify this distribution, we segmented the cell with lines 10 µm from the edges of the cell, perpendicular to the longest axis (Fig. 6 B). VAMP7-mediated exocytosis occurred more in the larger end of the cell than in the middle and smaller end, whereas the frequency of VAMP3-mediated exocytosis was similar in each region (Fig. 6 C).

2D Ripley’s $L(r)$ analysis demonstrated that VAMP7-mediated events clustered at all distances measured (Fig. 6 D). VAMP3-mediated exocytosis was organized distinctively; exocytic clustering was observed at 1.5–2.5 µm (Fig. 6 D, inset). However, at larger distances (4.5 µm), the Ripley’s $L(r)$ value fell below spatial randomness, indicating dispersal of exocytic hot spots. 1D Ripley’s $L(r)$ analysis of the timing of VAMP3- and VAMP7-mediated exocytotic events revealed that both were temporally random (Fig. 6 E). Together these investigations of the spatial and temporal organization of exocytosis in interphase cells revealed an organization and likely regulation of exocytosis distinct from developing neurons.

**Discussion**

Here we built a computer-vision image analysis tool and applied extended clustering statistics to demonstrate that the spatiotemporal distribution of constitutive VAMP2-mediated exocytosis is dynamic in developing neurons, modified by both developmental time and the guidance cue netrin-1, regulated differentially in the soma and neurites, and distinct from exocytosis in nonneuronal cells. To our knowledge, this represents the first systematic, automated investigation of exocytosis in developing neurons. Our algorithm has several advantages over previously reported detection algorithms (Sebastian et al., 2006; Díaz et al., 2010), including a more rigorous definition of an exocytic event, use of a Kalman filter for better tracking of events, and both simulated and experimental validation (Fig. 1 A and
that agrees with the membrane growth observed, suggesting may also be involved, V AMP2-mediated exocytosis and endocytic retrieval of membrane by clathrin are sufficient to explain developmental plasma membrane expansion by first approximation.

**Dynamic spatial regulation of exocytosis in developing neurons**

Classic studies hypothesized that vesicles fuse at sites of cell growth (Feldman et al., 1981; Pfenninger and Friedman, 1993; Craig et al., 1995). Others suggested that membrane translocates anterogradely to the extending neurite tips (Popov et al., 1993), yet a systematic investigation of where vesicle fusion occurs has been lacking. We suggest that at earlier developmental stages, rapid membrane expansion is needed, but the localization of insertion is inconsequential. Perhaps with a less complex neuronal shape, cytoskeletal forces are sufficient to shape the plasma membrane. The developmental reduction in exocytic frequency but emergence of exocytic hot spots and shift of exocytosis toward neurites as neurons acquire a more complex morphology suggests that growth of individual neurites or individual branches requires local membrane insertion. Differences in the spatial distribution of exocytosis between developmental time points and cellular shapes suggest that the location and clustering of membrane insertion via exocytosis are regulated and developmentally critical to reach appropriate neuronal morphology. Our findings indicate that VAMP7-mediated vesicle fusion events were rare in the conditions and at the developmental time points investigated, and that VAMP2-mediated vesicle fusion occurred proximal to sites of growth, such as at the base of neurites and branches, supporting the anterograde membrane flow hypothesis at early developmental time points.

**Calculating membrane growth in developing neurons**

Several sources for membrane expansion have been identified, including exocytosis of secretory vesicles and/or lysosomes and membrane transfer at ER-plasma membrane contact sites (Arantes and Andrews, 2006; Pfenninger, 2009; Stefan et al., 2013). Additionally, astrocytes donate membrane material to neurons through lipoprotein particles (de Chaves et al., 1997; Mauch et al., 2001). The relative contributions of these sources have not been explored. Our results and calculations showed that the predicted surface area supplied by VAMP2-mediated exocytosis was roughly 2–10 times greater than the measured expansion of neuronal surface area, and further that clathrin-mediated endocytosis compensates by removing excess material. The measured increase in surface area most closely overlaps with vesicle membrane addition estimated by the addition of larger vesicles. This vesicle size is supported by the likely underestimation of vesicle diameter from electron micrographs and the unimodal distribution of vesicular VAMP2 content (Fig. 1 J). Although other modes of addition and retrieval may also be involved, VAMP2-mediated exocytosis and clathrin-mediated endocytosis together predict membrane addition that agrees with the membrane growth observed, suggesting that they may be the predominant mechanisms of membrane flux in developing neurons.

**Exocytosis in the soma and neurites is distinctly regulated**

Netrin-1 affects exocytosis distinctly in neurites and soma, suggesting there is regional regulation of exocytosis. Different proteins and vesicles have been shown to selectivity enter certain regions of the developing neuron (Winckler et al., 1999; Dean et al., 2012; Petersen et al., 2014). We found that TRIM9 specifically regulated exocytosis in neurites; however, TRIM9 is also present in the soma. Whether specific TRIM9 isoforms localize and function distinctly or there is differential regulation of TRIM9 in the soma and neurites remains to be seen. In vitro, we found that cortical axons turn up attractive gradients of netrin-1 (Taylor et al., 2015) and that this is absent in Trim9−/− neurons (Menon et al., 2015). Whether a gradient of netrin-1 induces TRIM9-dependent asymmetrical changes in the spatiotemporal pattern of exocytosis in the growth cone that are required for axon turning is not known.

Unlike TRIM9, F-actin is distributed differently in the neurite and soma, as well as within the turning growth cone (He et al., 2010). Actin polymerization exerts a mechanical force on the plasma membrane, which increases tension and alters vesicle fusion (Kliesch et al., 2017). Because increased membrane tension has been coupled to increased exocytic activity (Wen et al., 2016), this may provide distinct regulation of exocytosis in the soma and neurites, and across the growth cone. Although a role for the actin cytoskeleton in exocytosis has been demonstrated in multiple cell types (Eitzen, 2003), a systematic investigation of this in developing neurons has not been performed.

**Polarized exocytosis in nonneuronal migrating cells**

The slower frequency of exocytosis in melanoma cells is consistent with melanoma cells not expanding their membrane. Polarized exocytosis has been suggested as a driving force in directional cell migration (Bretscher, 1996). Indeed, the rate of polarized exocytosis at the leading edge of fibroblasts correlates with the speed of migration, whereas disruption of cell polarization and polarized exocytosis is associated with loss of migration (Bergmann et al., 1983; Bretscher, 1996; Schmoranzer et al., 2003). The role of different VAMPs in migration has not been systematically explored, even though evidence exists of their heterogeneous distribution, transport, and cargo (Advani et al., 1998; Alberts et al., 2006; Oishi et al., 2006; Burgo et al., 2012; Bentley and Banker, 2015). The distinct spatial distributions of VAMP3- and VAMP7-mediated exocytosis observed here suggest unique roles for these two vesicle populations in melanoma cells, with polarized VAMP7-mediated exocytosis potentially associated with expansion of the leading edge during motility.

**Materials and methods**

**Animal work**

All mouse lines were on a C57BL/6J background and bred at the University of North Carolina at Chapel Hill with approval from the Institutional Animal Care and Use Committee. Mouse colonies were maintained in specific pathogen-free environment with 12-h light and dark cycles. Timed pregnant females were obtained by placing male and female mice together in a cage overnight; the following day was designated as E0.5 if the female had a vaginal plug. The generation of Trim9−/− mice is described in Winkle et al. (2014). Mice were genotyped using standard genotyping procedures.
Media, culture, and transfection of primary neurons and immortalized cell lines

Both male and female embryos were used to generate cultures and were randomly allocated to experimental groups. Cortical neuron cultures were prepared from day 15.5 embryos as previously described (Visselmann et al., 2011). In brief, cortices were microdissected and neurons were dissociated with trypsin and plated on poly-t-lysine–coated glass-bottom culture dishes in neurobasal media supplemented with B27 (Invitrogen). This same media was used for all time-lapse experiments. For transfection, neurons were resuspended after dissociation in solution (Amxax Nucleofector; Lonza) and electroporated with a nucleofector according to manufacturer protocol. Recombinant neurotactin was concentrated from the supernatant of HEK293 cells (Serafini et al., 1994). Neurons were stimulated with 500 ng/ml of netrin-1 added 1 h before imaging.

CRISPR-generated TRIM9−/− HEK293 cells were described previously (Menon et al., 2015). HEK293 and VMM39 cells were maintained in DMEM + glutamine supplemented with 10% FBS. For HEK293 and VMM39 cell transfections, HEK293 cells were transfected using Lipofectamine 2000 per manufacturer protocol.

Plasmids and antibodies

pEgfp-SNAP25B was acquired from L. Chamberlain (University of Edinburgh, Edinburgh, Scotland, UK). pCNA3.1-HA rat DCC was acquired from M. Tessier-Lavigne (Stanford University, Stanford, CA). PCl-human-VAMP2-pHluorin was acquired from the Rothman laboratory (Yale University, New Haven, CT). pCAX-human VAMP3-pHluorin and pCAX-human VAMP7-pHluorin have a β-actin promoter (Gupton and Gertler, 2010). pEGFP-human VAMP7 N terminus (longin; aa 1–120) and VAMP7 C terminus were cloned into an mCherry vector. Antibodies include a rabbit polyclonal against GFP (A1122; Invitrogen) and ubiquitin (sc-8017; Santa Cruz Biotechnology).

Imaging and image analysis

All TIRF and widefield time-lapse imaging was performed using an inverted microscope (IX81-ZDC2; Olympus) with MetaMorph acquisition software (Molecular Devices), an electron-multiplying charge-coupled device (iXon), and a live cell imaging chamber (Tokai Hit Stage Top inverted microscope (IX81-ZDC2; Olympus) with MetaMorph acquisition software onto an iXon every 500 ms for 3 min. For all endocytosis assays, neurons expressing clathrin light chain–tagRFP to detect fluorescent maxima in each frame. An h-dome transform was performed on neurons expressing clathrin light chain–tagRFP to detect detectable exponential fluorescent puncta that lasted at least 20 s before disappearing were considered endocytic events. Bona fide exocytic events were defined as transient, nonmotile (mean squared displacement <0.2 µm²) objects that reached peak fluorescence intensity four deviations above the average local background intensity at t₀ (the first frame the object was detected in), followed by a detectable exponential fluorescent decay (≥3 frames) with no limit on how long the events could last. Objects that did not meet these requirements were discarded.

Clathrin-mediated endocytosis detection

An h-dome transform was performed on neurons expressing clathrin light chain–tagRFP to detect detectable exponential fluorescence maxima in each frame. Fluorescent puncta that lasted at least 20 s before disappearing were considered endocytic events (Loerke et al., 2009).

NH₄Cl and TeNT treatments

Neurons transfected with VAMP2-pHluorin or VAMP7-pHluorin were imaged at 48 h as in the Imaging and image analysis section. Either 25 mM NH₄Cl or 50 nM TeNT (Sigma-Aldrich) were added to the neurons followed by either immediate imaging for NH₄Cl treatment or imaging 30 min after the addition of TeNT. Analysis of exocytic events were performed as described in the Exocytic detection algorithm section.

Simulation of exocytosis

VAMP2-pHluorin signal on the cell surface was simulated with a normal distribution using a mean and SD equivalent to the measured median, to account for outlier fluorescent pixels, and SDs of experimental VAMP2-pHluorin signal. Gaussian fluorescent peaks with varying means and SDs, approximated from user-identified exocytic
events, were added to simulate exocytic events. To represent random noise, a range of intensities based on typical images that followed a Poisson or Gaussian distribution were added to simulated images (Pawley, 1990; Waters, 2009).

Surface area estimation
To estimate the surface area, we used TIRF images of VAMP2-pHluorin expressing cells. The soma was identified and segmented from the neurites, and the basal surface area of each was calculated separately. Total neurite area was estimated as doubling the measured basal membrane area. The mean height of the soma (~11 μm) was obtained from confocal image z-stacks through cortical neurons at 48 h in vitro. The major and minor axis of the soma were measured and used with the mean height of the soma to calculate the surface area using the calculation for a truncated ellipsoid:

\[
3 \frac{4\pi}{3} \left[ (a\beta) + (b\gamma) + (c\delta) \right]^{1/2} + \pi abc(0.75c)(3c - 0.75c),
\]

where \(a, b, c\) represent the three axes of the soma (length, width, and height, respectively). The surface area of soma and neurites were summarized to obtain the final surface area estimate of the neuron. For calculating local SD of fluorescence intensity of GFP-CAAX, a 9 × 9 square filter was convolved on each pixel, replacing the value with the SD of the 9 × 9 block of pixels.

Statistical analysis
The software package R was primarily used for statistical analysis of data. Both R and Adobe Illustrator were used for the generation of figures. At least three independent experiments were performed for each assay. Normality of data was determined by Shapiro-Wilk test. For two-sample comparisons of normally distributed data, an unpaired \(t\) test was used for two independent samples, or a paired \(t\) test for paired samples. For multiple comparisons, ANOVA was used to determine significance, followed by unpaired or paired \(t\) tests corrected using the Benjamini-Hochberg method. For analysis of nonnormally distributed data, the Mann-Whitney test was used for two samples. For more than two samples, Kruskal-Wallis nonparametric ANOVA was used to determine significance followed by the Benjamini-Hochberg method. For all Ripley’s \(L(r)\) functions, comparisons between individual \(L(r)\) functions were made using the Studentized permutation test (Hahn, 2012). To test for differences between groups of \(L(r)\) functions, we first aggregated \(K\) functions and performed Diggle’s test, (Diggle et al., 1991). The R package “brms” was used to run the Bayesian linear model and perform the Studentized permutation test (Hahn, 2012).

Bayesian linear model
A Bayesian linear model was used to calculate the increase in neuronal surface area between 24 and 48 h in vitro. We made the assumption that neuronal surface area can only increase over time, and thus used a \(\Gamma\) link function for the response variable. To give more weight to the data, we chose a weakly informative prior distribution for the predictor (normal distribution with mean of 500, \(\sigma\) of 100), with the assumption that neurons increased surface area over time with no chance of decreasing surface area, and a uniform distribution 0–10 for the variance.

Ripley’s K test of complete spatial randomness or complete temporal randomness
Ripley’s \(K\) function is defined in two dimensions as

\[
\hat{K}(r) = \lambda^{-1} \sum_{ij} w(l, t) \cdot \frac{I(d_{ij} < r)}{n},
\]

where \(\lambda\) is the intensity, described as \(\lambda = n/A, A\) is the area encompassing the points, \(n\) is the number of points, \(I\) is an indicator function (1 if true and 0 if false), \(d_{ij}\) is the Euclidian distance between the \(i\)th and \(j\)th point, and \(r\) is the search radius. To correct for edge effects, the function is weighted by \(w(l, t)\), which represents the fraction of search radius that contains \(A\).

The soma of neurons was analyzed using Ripley’s \(K\) function. However, long, narrow, and branched neurites posed a challenge to the spatial analysis, even with an edge corrector. Thus, we skeletonized neurites, and considered them a 1D network (Fig. 2 F). Exocytic events in neurites were mapped to the nearest point on the network. We then performed an extension of Ripley’s \(K\) function, the network \(K\) function, which takes the form

\[
\hat{K}(r) = \frac{L(r)}{\lambda n - 1/2} \cdot \sum_{ij} \frac{I(d_{ij} < r)}{n},
\]

where \(L_r\) is the union of all links in the network, and \(d_{ij}\) is the network distance between points (Okabe and Yamada, 2001).

Finally, to test the temporal clustering of exocytosis, we performed Ripley’s \(K\) function in 1D:

\[
\hat{K}(r) = \lambda^{-1} \cdot \sum_{ij} w(l, t) \cdot \frac{I(u_i < r)}{n},
\]

where \(u_i\) is the distance between points on a 1D line \((u_i = l_i - u_i); w(l, t)\) is the fraction of the search length, \(r\), that overlaps the number line \((0, T); T\) is the length of the 1D search space (Fig. 2 F, total time imaged for temporal analysis).

With the assumption that all cells measured in a group exhibit the same clustering pattern, the group-specific mean function is defined as:

\[
\tilde{K}_g(r) = \frac{1}{n_g} \sum_{i \in g} \hat{K}_i(t),
\]

for each \(g\)th group, and the mean \(K\) function mean of the total population is

\[
\tilde{K}(r) = \frac{1}{n} \sum_{i = 1}^{n} \hat{K}_i(t),
\]

where \(w_g = n_i/n, n_i\) is the number of points in the \(i\)th group, and \(n\) is the total number of points of all groups. A test statistic

\[
D_g = \sum_{i = 1}^{n} \left( \frac{\tilde{K}_g(t) - \tilde{K}(t)}{\hat{\sigma}} \right)^2 dt
\]

test is used to test differences between groups. We use the mean sampling variance of the functions weighted by \(w_g\) to construct confidence intervals \(\pm 2\) SEMs. To attach \(p\)-values to observed test statistics, we use a bootstrapping procedure to determine the distribution of \(D_g\). To do so, we define

\[
\hat{R}_g(t) = n_g^{-1/2} \left( \frac{\tilde{K}_g(t) - \hat{K}_g(t)}{\hat{\sigma}} \right)
\]

drawing at random with replacement from \(R_g(t)\), keeping the group sizes fixed. This bootstrapping procedure is performed 999 times, and the observed \(D_g\) values are ranked among the bootstrapped \(D_g\) values to obtain \(p\)-values of the null hypothesis: that the two groups being compared came from the same distribution (Diggle et al., 1991).

For ease of interpretation, we use the variance-stabilized Ripley’s \(K\) function, \(L(r)\), which gives an \(L(r)\) equivalent to the radius \(r\) under spatial or temporal randomness \((L_{iso}[r])\). To test whether
exocytic events are clustered, the L(r) function of aggregated observed data is compared with Monte Carlo simulations of complete spatial randomness (L_{CSR}(r)) or complete temporal randomness (L_{CTR}(r); Diggle, 2013). Under traditional Ripley’s K analysis, L_{CSR}(r) is equivalent to \pi r^2; in the case of a network function, L_{CSR}(r) is equivalent to the uniform distribution of points on the network. L_{CTR}(r) is equivalent to a uniform distribution.

Ubiquination assays
To measure ubiquitination of SNAP25, HEK293 cells were transfected with HA-DCC, FLAG-ubiquitin, and SNAP25-GFP and cultured for 24 h. 4 h before lysing, the cells were treated with 10 \mu M MG-132 or 10 \mu M MG-132 and 600 ng/ml of netrin-1. The treated HEK cells were lysed in 20 mM Tris-Cl, 250 mM NaCl, 3 mM EDTA, 3 mM EGTA, 0.5% NP-40, 1% SDS, 2 mM DTT, 5 mM N-ethylmaleimide, 3 mM iodoacetamide, and protease and phosphatase inhibitors (15 mM sodium pyrophosphate, 50 mM sodium fluoride, 40 mM \beta-glycerophosphate, 1 mM sodium vanadate, 150 \mu g/ml phenylmethylsulfonyl fluoride, 1 \mu g/ml leupeptin, and 5 \mu g/ml aprotinin), pH 7.4. For 6 million cells, 270 \mu l of lysis buffer was added and incubated on ice for 10 min. Cells were removed from the dish and transferred into tubes. 30 \mu l of 1x PBS was added, and samples were gently vortexed. Samples were boiled immediately for 20 min until they turned clear, then were centrifuged at 14,000 \times g for 10 min. The boiled samples were diluted using lysis buffer without SDS to reduce the SDS concentration to 0.1%. For immunoprecipitation of GFP-SNAP25, IgG-conjugated A/G beads (sc-2343; Santa Cruz Biotechnology) were washed three times with lysis buffer, and bound proteins were resolved by SDS-PAGE and analyzed by immunoblotting for GFP, FLAG, and HA.

Online supplemental material
Fig. S1 shows that TIRF imaging captures VAMP2-pHluorin- and VAMP7-pHluorin-mediated exocytosis efficiently. Fig. S2 presents the Kalman filter algorithm and parameter selection. Fig. S3 presents confirmation of VAMP7-pHluorin exocytosis. Fig. S4 presents estimation of exocytic addition and membrane surface area increases in developing neurons. Fig. S5 shows that specific domains of TRIM9 modulate distinct parameters of exocytosis in neurites. Video 1 shows algorithm identification of exocytic events. Video 2 confirms that detected exocytic events are transient and TeNT-sensitive. Video 3 demonstrates that VAMP2-mediated exocytosis changes over developmental time. Video 4 shows that VAMP7-mediated exocytosis adds a negligible amount of membrane. Video 5 demonstrates VAMP3- and VAMP7-mediated exocytosis in VMM39 melanoma cells. Run_script.m runs the entire detection algorithm over a folder of image stacks. Cell_mask.m creates a binary mask of a cell from a fluorescent image. Detection_algorithm.m finds all possible exocytic events and fluorescent puncta in each image of a z-stack. Multiobject_tracking.m performs the Kalman filter function, linking fluorescent events across frames and throwing out nonexocytic objects. Extract_fusion.m compiles the fluorescent pixel values, time points, and x and y positions of exocytic events and saves them to a CSV file. Full_fusion_script.R computes features of each exocytic event. Cell_SurfaceArea.R computes the surface area of the cell soma gives the length, width, and height. Bayesian_Cell_Model.R performs linear Bayesian analysis. Spatial_analysis.R performs the Ripley’s K function on exocytosis given a list of events and a cell mask.

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Author contributions: F.L. Urbina designed and performed experiments, analyzed data, and wrote the paper. S.M. Gomez consulted regarding framework of automated detection and analysis and edited the manuscript. S.L. Gupton designed experiments, provided guidance in software design, and wrote the paper.

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