Cancer Cells Sense Fibers by Coiling on them in a Curvature-Dependent Manner

HIGHLIGHTS

Cells sense ECM-mimicking suspended fibers by coiling (wrapping around)

Coiling occurs at the tip of growing protrusions in a curvature-dependent manner

Non-tumorigenic cells exhibit diminished coiling compared with metastatic cells

A bundle of small-diameter fibers recover coiling observed on a large-diameter fiber

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Cancer Cells Sense Fibers by Coiling on them in a Curvature-Dependent Manner

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SUMMARY

Metastatic cancer cells sense the complex and heterogeneous fibrous extracellular matrix (ECM) by formation of protrusions, and our knowledge of how cells physically recognize these fibers remains in its infancy. Here, using suspended ECM-mimicking isodiameter fibers ranging from 135 to 1,000 nm, we show that metastatic breast cancer cells sense fiber diameters differentially by coiling (wrapping-around) on them in a curvature-dependent manner, whereas non-tumorigenic cells exhibit diminished coiling. We report that coiling occurs at the tip of growing protrusions and the coil width and coiling rate increase in a curvature-dependent manner, but time to maximum coil width occurs bi-phasically. Interestingly, bundles of 135-nm diameter fibers recover coiling width and rate on 1,000-nm-diameter fibers. Coiling also coincides with curvature-dependent persistent and ballistic transport of endogenous granules inside the protrusions. Altogether, our results lay the groundwork to link biophysical sensing with biological signaling to quantitate pro- and anti-invasive fibrous environments.

INTRODUCTION

Protrusions are extensions from the cell body that are diverse in shape, molecular structure, and location relative to the cell body and play an important role in cell migration and extracellular matrix (ECM) degradation (Blanchoin et al., 2014; Clainche and Carlier, 2008; Koons et al., 2017; Machacek et al., 2009; Pollard and Borisy, 2003). The importance of protrusions as the precursor to migration (Alblazi and Siar, 2015; Friedl and Wolf, 2010; Ponti et al., 2004), in the presence of biophysical (Harland et al., 2011; Lo et al., 2000) and biochemical cues (Rhoads and Guan, 2007; Weber et al., 2013; Wu et al., 2012; Zigmond et al., 2001), is widely documented. In the context of cancer, specialized protrusive structures are known to break down the surrounding extracellular milieu (Buccione et al., 2004; Linder, 2007; Weaver, 2006).

The ECM through which cells navigate is a complex fibrous network that is composed of a wide range of fiber diameters (tens of nanometers to micrometers; Clark et al., 1982; Ushiki, 2002). In vitro assays, by us and others, have shown that the fiber diameter can have a significant impact on cell behavior by inducing changes in the morphology and redistribution of focal adhesion arrangements (Kennedy et al., 2017; Meehan and Nain, 2014). Using 3D gel assays, recent studies have reported that protrusions can remodel collagen fibers in the matrix in a “hand-over-hand” cycle at the leading edge (Meshel et al., 2005; Starke et al., 2013) or lateral to cell body (Wolf and Friedl, 2009), and aligned fibers in the gel limit formation of lateral protrusions, thus promoting cell persistence (Fraley et al., 2015; Riching et al., 2014). It has also been shown that cells seeded in 3D gels form multiple protrusions simultaneously to “probe” the surrounding matrix fibers before extending a single, stable protrusion to define a front-rear axis (Carey et al., 2016). Although these investigations have yielded valuable information on the nature of protrusions, our current understanding of how cells biophysically sense ECM fibers remains in infancy.

Using suspended network of fibers of contrasting curvatures (protrusive assay) that decouples bulk cell body migration from protrusive dynamics, we have previously shown that normal breast epithelial cells MCF 10A form shorter protrusions compared with the highly metastatic breast adenocarcinoma MDA-MB-231 on fibers of varying diameters (Koons et al., 2017). Briefly, our method allows us to constrain the cell body on large-diameter (≥2 μm) base fibers, whereas orthogonally deposited smaller diameter protrusive fibers elicit protrusive events. Using this platform, here, we report that migratory cells coil (wrap-around, Video S1) on fibers of varying curvature differentially. Coiling at the tip of protrusions occurs in bursts during growth phase of protrusions, which synchronizes with endogenous translocation of lipid granules inside protrusions along linear tracks in a persistent superdiffusive manner. Interestingly, depositing a bundle of densely packed small-diameter fibers recovers coiling dynamics of single large-diameter...
fibers. We also quantitate coiling by migrating cells in spindle shapes on single suspended fibers (migration assay). We report notable differences in coiling behavior between protrusive and migration assays on large-diameter fibers. For the breast cancer model used in this study, we report that non-tumorigenic MCF 10A exhibit diminished coiling in low numbers compared with their metastatic counterparts (MDA-MB-231 and BT-549). Altogether, our results using ECM-mimicking fibers lay the groundwork to link biophysical cell sensing with biological signaling to define pro- and anti-invasive fibrous environments.

RESULTS

We used the non-electrospinning Spinneret-based Tunable Engineered Parameters (STEP) platform (Nain et al., 2009; Wang and Nain, 2014) to quantitate protrusion coiling behavior and the dynamics of endogenous granule transport into the protrusions as a function of protrusive fiber diameter at high spatio-temporal resolutions (sub-micron and 1 s). To study individual protrusions perpendicular to cell body direction, we used mismatch of fiber diameters with the base fiber at least 2 μm in diameter while five different protrusive fiber isodiameters (Figure 1A) were selected to be 135 ± 3 nm (n = 71), 269 ± 3 nm (n = 51), 453 ± 4 nm (n = 36), 597 ± 8 nm (n = 30), and 1,013 ± 19 nm (n = 40) (Nain and Wang, 2013). We use two morphodynamic metrics, the protrusion length (L) and eccentricity (E), to quantitate protrusion formation, growth, and retraction to the main cell body (protrusive cycle) (Figures 1A and 1B). (Koons et al., 2017) From optical microscopic images, acquired at 63X and 1-s interval (Videos S2, S3, and S4 for 135, 600, and 1,000 nm diameter, respectively), we observed that the protrusion tip coils (wraps around the suspended fiber axis; Figure 1C) such that a coiling cycle is characterized by an increase in the width of the coil till a maximum width is reached followed by a subsequent decrease (Figures 1D and 1E).

Timing of Coiling Is Modulated by Fiber Curvature

To develop the framework to study the details of the coiling behavior on fibers of varying diameters, we defined additional metrics: maximum coil width occurring during one coiling cycle (Figure 1E), coi growth rate, and the time taken to reach maximum coil width. We observed that coiling occurred in “spurts” at the onset of protrusion growth (Figure 2A) where the protrusion growth phase is quantitatively represented by a concomitant increase in both protrusion length and eccentricity (Figure 2A (i, ii), more representative profiles are included in Figure S1). Next, we wanted to determine the relationship between protrusion eccentricity (broadening of protrusion base) and coiling. Given the dynamic, fluctuating nature of protrusions, we conducted a transient analysis of the evolution of eccentricity before and after coiling initiation (Figure 2B (i), with coiling initiation shown by t = 0). We observed that for the intermediate protrusive fiber categories (~270~~600 nm), growth in eccentricity occurred before the initiation of coiling. However, for the fiber diameters on either end of the spectrum (high curvature 135 nm and low curvature 1,000 nm), we observed that coiling started independent of the broadening in the protrusion base. During the coiling process, protrusions were found to elongate (elongation shown schematically in Figure 1E) in a biphasic diameter-dependent fashion (Figure 2B (iii)), and the protrusions continued to increase in length even after the termination of the coiling behavior. To quantify eccentricity-coiling relationship, we looked at the average eccentricity value at the initiation of coiling as a function of fiber diameter and found that for the intermediate-fiber-diameter category (~270~~450, and ~600 nm), the average eccentricity at the onset of coiling was at least 0.76 ± 0.02, whereas for the ~135- and ~1,000-nm cases it averaged 0.51 ± 0.04 and 0.47 ± 0.05, respectively (Figure 2B (iii)). We quantitated the time taken to initiate coiling (total time taken from the initial increase in protrusion eccentricity to the initiation of coiling), and consistent with average eccentricity values, found that on the small- and large-diameter fibers it took less time to initiate coiling (Figure 2B (iv)). Interestingly, we did not observe significance in total length of protrusion at coiling initiation or the number of coiling events occurring in an hour (Figure S2). Overall, we found that the average eccentricity at coiling initiation and its timing exhibited a biphasic response with increase in diameter followed by drop at ~1,000 nm.

Individual Coiling Dynamics Are Fiber Curvature Dependent

Having quantitated the interplay between increase in protrusion length during coiling, eccentricity, and coiling initiation, we next wanted to analyze the kinetics of coil growth. Observing coiling profiles on different fiber diameters (representative profiles in Figure 3A), we found that the maximum width of the coil, the rate at which the coil grows, and the time taken to reach the maximum coil width are modulated by fiber diameter. For both maximum coil width and the growth rate, we observed no significant differences between the two smallest diameter categories (~135 and ~270 nm). However, with further increase in
diameter, we found both parameters to increase in a non-linear manner (Figures 3B and 3C), whereas the time taken to reach the maximum coil width displayed a biphasic relationship (Figure 3D). Combined with our findings in Figure 2, we conclude that low curvature ~1,000-nm diameter fibers support widest coils that initiate independent of protrusion broadening, and do so at the fastest coil growth rate.

**Granule Translocation Occurs in a Fiber Curvature-Dependent Manner and Coincides with Both the Protrusion Growth and Coiling Cycle**

In conjunction with the protrusions coiling, we observed that individual granules entered the protrusions at high speeds persistently (Figure 4A). The granule translocation dynamics showed a near-stationary particle...
exhibiting fast travel through the protrusion and coming to a near-stationary state again within the protrusion (Video S5). Thus, we inquired if their translocation correlated with the kinetics of coiling.

Near-stationary granules (likely lipid particles, Figure S3) acting as endogenous “tracer particles” were observed to enter the protrusion during the growth phase of the protrusive cycle in ~80% of the cases, with the remaining particles translocating either in a non-growing protrusion or, rarely, in a retracting protrusion (Figure S4). Of the cases of particle translocation during the protrusion growth phase, we found that 69% of them coincided with the coiling cycle (Figure S5). Thus, we inquired if the granule dynamics were being modulated by the fiber curvature. To quantitate the dynamics of granules entering the protrusion, we manually tracked them using ImageJ software to analyze granule speed and persistence (defined as the ratio of the displacement of the granule to the distance covered by the granule during its journey through the protrusion, Figure 4B (i)). We found that for granules entering a protrusion, the speed and persistence both increased with fiber diameter (Figure 4B (ii, iii)). Granule speeds of up to 1.3 ± 0.2 μm/s at high persistence of 0.89 ± 0.03 were achieved for the low-curvature ~1,000-nm protrusive fiber diameters representing an ~2.3 times increase over the speed (0.57 ± 0.06 μm/s) and a ~1.5 times increase over the persistence (0.58 ± 0.03) recorded for the ~135- to 450-nm protrusive fiber diameter cases combined. Interestingly, in cases where multiple granules entered the same protrusion at different times, we observed them to follow a narrow spatial set of paths analogous to highways (Figure S6 shows representative cases on different fiber diameters, and Video S6).

As granules were translocating at high speeds in a persistent fashion into the protrusions, we inquired if the process of translocating could be described by mean square displacement (MSD) method used commonly to describe intracellular granule transport (Caspi et al., 2000; Metzler, 2017). Endogenous granule translocation studied using MSD analysis has been previously shown to range from subdiffusion to superdiffusion regimes indicating random to ballistic transport, respectively (Banks and Fradin, 2005; Bressloff and Newby, 2013; Bronstein et al., 2009; Reverey et al., 2015; Tolić-Narfe, 2004; Wachsmuth et al., 2000).
MSD for random diffusion of a particle through an unobstructed medium in “d” dimensions is given by \(<R^2> = 2dDt\) where “\(R\)” represents the MSD, “\(D\)” is the diffusion coefficient, and “\(t\)” is the lag time (Bressloff and Newby, 2013). However, given the densely packed nature of the cell cytoplasm and the presence of molecular motors to assist cargo transport, intracellular transport is better characterized by anomalous diffusion exhibiting a non-linear power-law behavior \(<R^2> = 2dDt^a\) where \(a = 1\) reverts back to the standard diffusion case (Banks and Fradin, 2005; Saxton, 1994). For \(a < 1\), the translocation is termed as subdiffusive, whereas for \(a > 1\) the translocation is termed as superdiffusive, and values of \(a \approx 2\) represent “ballistic” motion. Our analysis (Figure 4B (iv)) shows that translocation of granules within protrusions occurs in a superdiffusive manner across all the fiber diameter categories studied, and approaches a near-ballistic transport process occurring in protrusions on low-curvature fibers.

Finally, given the superdiffusive nature of the granule dynamics, we investigated if molecular motors might play a potential role in the transport of granules in the protrusions. Previously, we have shown that the localization of cytoskeletal components inside individual protrusions is dictated by the protrusion morphology (Koons et al., 2017). Specifically, whereas F-actin and microtubules are present in protrusions of all sizes, the intermediate filament vimentin localized only in mature protrusions (eccentricity \(\geq 0.8\) and higher). Thus, we investigated the effect of pharmacological inhibitors Monastrol (100 \(\mu\)M) to inhibit kinesin-5 (a microtubule-associated motor protein) and LY249002 (20 \(\mu\)M) to hinder localization of myosin X (an actin filament-associated motor protein) to the cell leading edge by inhibiting phosphatidylinositol (3,4,5)-trisphosphate (PI(3,4,5)P3) activity (PI(3,4,5)P3 plays a critical role in myosin X recruitment). In both cases (representative cells treated with both drugs shown in Figure S7 and Videos S7, S8, S9, and S10), we observed a change in the protrusive behavior highlighted by an increase in the proportion of relatively short protrusions (<5 \(\mu\)m in length compared with the average protrusion length of 19 \(\mu\)m \(\pm\) 0.3 \(\mu\)m; Figure S8). In both cases, washing the drug out recovered the original protrusive behavior. Intriguingly, we found that in both drug cases, there was also a decrease in the proportion of protrusions in which a granule translocation was observed. Analysis of the granule dynamics showed that speed and persistence were unaffected in case of the Monastrol addition, whereas a significant decrease in both speed and persistence was observed with addition of LY249002. Washing out the drugs resulted in recovery of original speed and persistence in both cases.

**Figure 3. Individual Coiling Dynamics Are Fiber Curvature Dependent**

(A) Representative coiling profiles show fiber diameter-dependent dynamics of coiling.

(B and C) (B) Maximum coil width and (C) average coil growth rate increase as a function of protrusive fiber diameter in a non-linear manner.

(D) A biphasic relationship is observed between the time to maximum width and protrusive fiber diameter. In the case of all three parameters (maximum coil width, coil growth rate, and time to maximum width), n values are as follows: 135 nm, 17; 270 nm, 17; 450 nm, 11; 600 nm, 11; 1000 nm, 77.

See Methods section for a discussion of the statistical significance parameters. Data are represented as mean ± SEM. ***p < 0.001.
Combined, these results suggest that whereas both kinesin-5 and myosin X motor reduce the instances of granule translocation, myosin X significantly impacts the dynamics of granule translocation.

DISCUSSION

Native fibrous environment surrounding the breast tumor is a complex architecture of fibers with varying diameters, spacing, and orientations (Figure 5A), which collectively make up pro- and anti-invasive bio-physical conditions. Invasion along fibers from the edge of the tumor requires cells to first biophysically sense fibers through formation of rod-like protrusions that can mature into broad structures in a fiber curvature-dependent manner (Koons et al., 2017). In our study, we quantitate, at single protrusion resolution, the biophysical probing or recognition of curvature of fibers over a wide range of fiber diameters mimicking the surrounding fibrous environment at the tumor periphery (shown by dashed oval in Figure 5A). We show that fiber curvature modulates the dynamics of the protrusion coiling (size, rate, and time of occurrence). Our findings show that for intermediate-diameter fibers (~270–600 nm), an increase in eccentricity precedes coiling initiation, whereas for the two ends of the diameter spectrum tested (high curvature, 135 nm, and low curvature, 1,000 nm) coiling occurs independent of protrusion widening (represented by increase in eccentricity, Figure 2). In contrast, the coil width and its rate of increase positively correlate with the fiber diameter (Figure 3). The similarities in time taken to reach maximum coil width observed across fibers on either end of tested diameters can be explained by minimal adhesion-driven contractility on high-curvature 135-nm-diameter fibers, and conversely low-curvature 1,000-nm-diameter fibers providing adequate surface area for adhesion sites to mature and increase in number. Indeed, supporting this hypothesis are our previous findings that show that cells attached to (1) small 100-nm-diameter nanoscale fibers are unable to spread and remain rounded while actively probing the fiber curvature (Koons et al., 2017) and (2) large 800-nm-diameter fibers have increased spatial distribution of focal adhesion sites resulting in larger forces (Sheets et al., 2016). However, the adhesion-based contractility on intermediate
Breast cancer has a well-known predilection for metastasizing to the bone (Lelekakis et al., 1999; Zhou et al., 2003). On entering the bone marrow, cancer cells are interfaced with stromal cells that combined together induce pro- and anti-invasive cell behavior. Inset shows scanning electron microscopic images of fibers deposited in varying configurations (Wang and Nain, 2014) that mimic the native environments including random and aligned configurations. Scale bars, 10 μm.

Cell migration starts with first cells sensing the native environments. Biophysical sensing of fibers can be studied by providing controlled and repeatable fiber architectures (spacing, bundles, and individual fibers of varying curvature). On left are representative phase images of cells on controlled fiber networks (scale bars, 10 μm). Bundling of small-diameter fibers can recover coiling width kinetics as that of a single large diameter.

Coiling during cell migration along fibers. Representative images showing “balled-up” cell morphology during migration on (i) high-curvature 135-nm-diameter fiber and elongated, “spindle” morphology during migration on (ii) low-curvature 1,000-nm-diameter fiber. Scale bars, 5 μm. Yellow arrows show simultaneous coiling on both sides of the cell. Comparison between coiling dynamics on a protrusion assay and migration assay for ~135-nm-diameter and ~1,000-nm-diameter fiber cases. Sample sizes for the protrusion assay are as follows: 135 nm, 117; 1,000 nm, 77, and for the migration assay are 135 nm, 85; 1,000 nm, 63. (iii) Maximum coiling during migration as a function of the fiber diameter. Sample sizes are as follows: 135 nm, 65; 450 nm, 50; 1,000 nm, 63; 2,000 nm, 61; 4,000 nm, 66.

Representative phase images of coiling dynamics exhibited by non-tumorigenic MCF-10A and metastatic MDA-MB-231 show diminished coiling in non-tumorigenic cell lines. Scale bar, 10 μm. Sample sizes for MDA-MB-231 are as follows: 135 nm, 65; 450 nm, 50; 1,000 nm, 63. Sample sizes for MCF 10A are as follows: 135 nm, 23; 450 nm, 36; 1,000 nm, 20. Data are represented as mean ± SEM. *p < 0.05; **p < 0.01 and ***p < 0.001.

Fiber diameters remain unclear as the time to reach maximum coiling width peaks at 450-nm diameter (transient profiles in Figure 3A and data in Figure 3D). Interestingly, substituting single large-diameter fibers with a bundle of smaller diameter fibers recovers coiling dynamics on the large-diameter fibers (Figure SB and Video S11), thus suggesting the role of both mechanical properties and available surface area in biophysical sensing. To determine if coiling was also exhibited by other breast cancer cell lines, we repeated the study with highly metastatic ductal carcinoma BT-549 (Figure S9). Our data show similarities in coiling dynamics between the two metastatic cancer cell lines.

After extending protrusions to sense the fibrous environment at the tumor interface, breast cancer cells can detach from the primary tumor and begin migrating along linearized collagen fibers toward the circulatory system for subsequent dissemination to secondary sites (Provenzano et al., 2006). Given that protrusion tip coiling is observed during protrusion extension, we further enquired if coiling also occurred during bulk cell body migration on aligned, single suspended fibers (Figure SC) of different diameters ranging from ~135 nm to ~4,000 nm (hereafter referred to as “migration assay”). On the smallest diameter tested (~135 nm), cell spreading was hindered as evidenced by frequent “balling-up” of the cell and blebbing (Video S12). In contrast, on relatively larger diameters (~450 nm and higher, Video S13) tested, cells adopted an elongated “spindle” morphology (Figure SC (i, ii)). Spindle cells on larger diameter fibers had reduced blebbing, consistent with our previous findings that cell blebbing inversely correlates with cell spread area (Sharma et al., 2013). Interestingly, cells displayed coiling at both ends of the cell body (Figure SC (i, ii) shown by yellow arrows, and Videos S12 and S13), thus suggesting concurrent sensing at opposite poles of rounded and stretched cells. Next, we quantified the dynamics of coiling at the tip of cells in line with the direction of migration and compared them with coiling quantitated in protrusion assay (perpendicular to the direction of migration) on ~135-, ~450-, and ~1,000-nm-diameter fibers. We found that the coiling behavior followed the trends obtained using protrusion assay, whereby the width and rate of coiling increase in a diameter-dependent manner, and the coiling cycle time is the longest for ~450-nm-diameter fibers (Figure S10). Notably, we found that on ~1,000-nm-diameter fibers that favor cells to form elongated spindle shapes, coils were significantly smaller in widths and grew at slower rates compared with the protrusion assay (Figure SC (i, ii)). Furthermore, the maximum coiling width in line with migration direction did not change on subsequent larger diameters (~2,000 and ~4,000 nm, Figure SC (iii)). Overall, the similarity in coiling on high-curvature fibers (~135 and ~450 nm) and differential response on low-curvature fibers (~1,000 nm and above) suggests a possible biophysical adaptation from a sensory to a deterministic migratory response with increase in diameter. How these two responses are utilized by cells to establish adhesion-based contractile machinery in single protrusions or at the two poles of a rounded or stretched cell where coiling occurs concurrently remains unclear and is the subject of our future inquiries.

Breast cancer has a well-known predilection for metastasizing to the bone (Lelekakis et al., 1999; Zhou et al., 2016). Following the attachment of previously circulating breast cancer cells to the vascular endothelia of the bone, their subsequent extravasation into the bone marrow compartment is promoted by bone and marrow-derived chemotactic factors (Mastro et al., 2003). On entering the bone marrow, cancer cells encounter a complex array of stromal cells and growth factors embedded in a highly mineralized ECM, which provide a combination of biophysical and biochemical cues that assist in the colonization of the.
bone (Gilles et al., 1998; Mastro et al., 2003; Senger and Perruzzi, 1996). The role played by the biochemical cues have been investigated in detail, whereas the influence of the mineralization of the collagen fibers unique to the bone is still unclear. A recent study has shown that MDA-MB-231 breast cancer cells exhibited more rounded morphology on mineralized collagen fibers compared with non-mineralized fibers (Choi et al., 2019). It is unclear if cancer cells could be employing coiling as a physical mechanism to aid invasion (easily visualized as a constant drilling process). Thus, we inquired if non-tumorigenic breast cells also displayed coiling on fibers of various diameters. Interestingly, we found that non-tumorigenic cancer cells (fibrosarcoma HT1080 and thyroid Hras1) as well as migratory NIH 3T3 fibroblasts (Videos S15, S16, and S17) to also exhibit coiling. Collectively, our data suggest that migratory cells advance on fibers by coiling, and the extent of coiling is modulated by the fiber curvature. However, how coiling is utilized in pro- and anti-migratory environments remains unknown.

In conclusion, using the non-electrospinning STEP platform, we quantitate the biophysical sensing of suspended fibers through coiling by cancer cells. We envision that future studies capable of integrating biophysical quantitation presented in this article with membrane tension, curvature-sensing BAR proteins, family of GTPases, and integrin-driven establishment of contractility will link the biophysical coiling with biological timing and signaling. In addition, by increasing the complexity of the fibrous environment in a repeatable manner (Sheets et al., 2013), cell morphology-driven coiling dynamics could help elucidate the potential role of morphology in cancer cell invasion. Through these future studies, we aim to quantitatively describe the migratory cell decision-making process in pro- and anti-invasive fibrous environments.

Limitations of the Study
We identify key limitations associated with our study along with some of our current and future efforts aimed at addressing them.

At the tumor periphery in vivo, tumor cells interact not only with the ECM fibers but also with the neighboring tumor cells with which they can form cell-cell junctions. However, our reductionist approach investigates the coiling kinetics of single cells interacting with suspended fibers. Thus, we do not replicate the cell-cell interactions that might potentially have an impact on coiling dynamics. In future studies, we aim to include these interactions by interfacing fibers with a monolayer of cells. Using such an approach, we have recently shown protrusion-driven control on invasion modes (single, multichain, and collective) through control of fiber diameter and spacing (Sharma et al., 2017).

The presence of stromal cells provide gradients of soluble biochemical cues in the form of secreted growth factors and chemokines that encourage the invasion of the tumor cells into the surrounding stroma (Oudin and Weaver, 2014). Currently, our studies are conducted in static six-well assays, which do not capture the potential effects of gradients on the coiling dynamics. A recent improvement to our method has been integration of fiber networks in custom microfluidic devices (unpublished data). We envision using this assay to calibrate coiling dynamics in controlled environments of biophysical and biochemical gradients. Similarly, haptotactic gradients (Rhoads and Guan, 2007) can be set up as we have previously shown that different concentrations of fibronectin cause a differential protrusive response (Koons et al., 2017).

Finally, the ECM surrounding the tumor is composed of a mix of mechanical properties (modulus, bending stiffness, and diameter). We have used fibers made of polystyrene, a commonly used material for culturing cells. The modulus of polystyrene (~1 GPa) matches the modulus of collagen fiber bundles (Silver, 2006; Silver et al., 2003; Wenger et al., 2007), and we have shown the role of bending stiffness (structural stiffness) in modulating cell behavior previously (Meehan and Nain, 2014). Using soft versus stiff polymers (for example, polyurethane with a modulus of ~1–10 MPa) will allow us to understand the role of stiffness in coiling kinetics. Furthermore, although we show that a bundle of small-diameter fibers recover coil widths of larger diameter fibers, future improvements to fiber spinning with precise control on the number of fibers in a bundle will help in dissecting the role of mechanical properties and curvature in coiling kinetics.

METHODS
All methods can be found in the accompanying Transparent Methods supplemental file.
SUPPLEMENTAL INFORMATION

Supplemental Information can be found online at https://doi.org/10.1016/j.isci.2019.08.023.

A video abstract is available at https://doi.org/10.1016/j.isci.2019.08.023#mmc19.

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AUTHOR CONTRIBUTIONS

Conceptualization, A.S.N.; Methodology, B.B. and A.S.N.; Investigation, A.M., B.B., and A.S.N.; Writing – Original Draft, A.M. and A.S.N.; Writing – Review & Editing, A.M., B.B., and A.S.N.; Funding Acquisition, B.B. and A.S.N.; Resources, B.B. and A.S.N.; Supervision, B.B. and A.S.N.

DECLARATION OF INTERESTS

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Supplemental Information

Cancer Cells Sense Fibers by Coiling on them in a Curvature-Dependent Manner

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Supplemental Figure S1. Representative protrusive profiles for the different protrusive fiber diameters studied, related to Figure 2. The mechanism of coiling behavior occurring in spurts during the protrusion growth is conserved across fiber diameters. Each row of plots is for the same fiber diameter.
Supplemental Figure S2: Average protrusion length at the initiation of coiling and subsequent coiling frequency as a function of fiber diameter, related to Figure 2. Both the (A) average protrusion length at the onset of coiling and (B) frequency of coiling spurts are independent of fiber diameter. n values for (A) are as follows: 135 nm – 20, 270 nm – 21, 450 nm – 23, 600 nm – 20, 1000 nm – 20. n values for (B) are 10 for each fiber diameter. See Methods section for a discussion of the statistical significance parameters.

Supplemental Figure S3: Oil Red O staining image, related to Figure 4. Representative cell after Oil Red O staining showing the granules in dark red (selective granules inside a protrusion indicated by black arrows).

Supplemental Figure S4: Linking granule transport to the protrusive cycle, related to Figure 4. % of total granule transport cases which occurred during the different stages of the protrusive cycle. n = 89 granules.
Supplemental Figure S5: Linking granule transport to the coiling cycle, related to Figure 4.
Percentage of total granule transport cases during protrusion growth which coincide with tip coiling. n = 71 granules.

Supplemental Figure S6: Representative profiles showing that granules enter protrusions along a tightly defined set of routes, related to Figure 4. Representative protrusion profiles (in red) and granule trajectories (circles) for the different fiber diameters are shown.

Supplemental Figure S7: Representative images of MDA-MB-231 cells before and after drug treatment, related to Figure 4. (A) Treatment with 100 µm Monastrol and (B) Treatment with 20 µm LY294002.
Supplemental Figure S8: Pharmacological inhibition of cytoskeletal motors, related to Figure 4. Here panel (A) represents the results using Monastrol while panel (B) represents the results using LY294002. In both cases, we recorded (i) the percentage of protrusions lower than 5 µm in length, (ii) the percentage of protrusions in which granule translocation was observed, (iii) granule speed and (iv) granule persistence for the control case (without drugs added), with the drug added and finally, after drug washout. n values for the Monastrol study are as follows: 64, 43, and 70 protrusions recorded for the cases without Monastrol, with Monastrol and Monastrol washout cases respectively. 33, 8, and 27 granule translocation cases observed in the without Monastrol, with Monastrol and washout cases respectively. n values for the LY294002 study are as follows: 55, 60, and 52 protrusions recorded for the cases without LY294002, with LY294002 and washout respectively. 24, 9 and 21 granule translocation cases observed in experiments without LY294002, with LY294002 and washout cases respectively. For the % protrusions entered, only the protrusions >5 µm were considered. See Methods section for a discussion of the statistical significance parameters.

Supplemental Figure S9: Quantifying coiling dynamics for BT-549 cells, related to Figure 3. (A) Maximum coil width, (B) Coil growth rate and (C) Time to maximum coil width as a function of fiber diameter. n values are as follows: 135 nm – 65, 270 nm – 63, 450 nm – 61, 600 nm – 61, 1000 nm – 60.
Supplemental Figure S10: Coiling dynamics on both protrusion and migration assays exhibit the same trend, related to Figure 5. Quantification of coiling dynamics for MDA-MB-231 cells on (A) protrusion assay and (B) migration assay as a function of fiber diameter. n values for the protrusion assay are: ~135 nm – 117, ~450 nm – 113, and ~1000 nm – 77. n values for the migration assay are: ~135 nm – 65, ~450 nm – 50, and ~1000 nm – 63.
Transparent Methods:

**Non-electrospinning STEP Protrusion Platform:** The previously reported STEP method (Nain et al., 2009) was used to spin a crosshatch network of large diameter, "strut-like" base fibers orthogonal to which were deposited the smaller diameter *protrusive* fibers. The networks were then fused at fiber intersections. The base fibers were fabricated to be at least 2 µm whereas 5 different *protrusive fiber* diameters were used: ~135 nm, ~270 nm, ~450 nm, ~600 nm, and ~1000 nm. Polystyrene (PS, Scientific Polymer Products, Ontario, NY, MW = 2 x 10^6 g mol⁻¹) of ~2 x 10^6 g/mol molecular weight was dissolved in *p-xylene* (Fischer Scientific, Pittsburgh, PA) at 7, 8, 10, 12 and 14% (w/w) to prepare the polymer solutions prior to spinning the ~135 nm, ~270 nm, ~450 nm, ~600 nm and ~1000 nm diameter fibers respectively. To prepare the ~2000 nm diameter *base fibers*, polystyrene of ~2 x 10^6 g/mol molecular weight was dissolved in a 1:1 xylene:dimethylformamide solution at a 10% (w/w) concentration. To prepare the ~4000 nm diameter fibers for the migration assay, polystyrene of ~15 x 10^6 g/mol molecular weight was dissolved in p-xylene at a 6% (w/w) concentration. The interfiber spacing was tuned to be ~200 µm between the *base fibers* and ~75 µm between the *protrusive fibers*.

**Cell culture, Seeding:** MDA-MB-231 mammary ductal adenocarcinoma cells were cultured in Leibovitz’s L-15 media (Thermo Fisher Scientific, Waltham, MA) supplemented with 10% Fetal Bovine Serum (Thermo Fisher Scientific, Waltham, MA). The culture was maintained in an incubator without CO₂ at 37 °C. BT-549 mammary ductal carcinoma cells were cultured in RPMI media (Thermo Fisher Scientific, Waltham, MA) supplemented with 10% Fetal Bovine Serum. MCF 10A non-tumorigenic breast epithelial cells were cultured using the MEGM growth kit (Lonza, Walkersville, MD). HT1080 fibrosarcoma cells were cultured in DMEM media (Thermo Fisher Scientific, Waltham, MA) supplemented with 10% Fetal Bovine Serum. Hras1 thyroid cancer cells were obtained from an Hras^{G12V/Pten KO} murine thyroid tumor (Jolly et al., 2016) and were cultured in F12 media (Thermo Fisher Scientific, Waltham, MA) supplemented with 10% Fetal Bovine Serum. NIH/3T3 fibroblasts were cultured in DMEM (Thermo Fisher Scientific, Waltham, MA) supplemented with 10% Fetal Calf Serum (ATCC, Manassas, VA). The BT-549, MCF 10A, HT1080, Hras1 and NIH 3T3 cultures were maintained in an incubator with CO₂ at 37 °C. To prepare for imaging the scaffolds were first glued down to the glass bottom of 6-well dishes (MatTek Corp., Ashland, MA) using
sterile high-vacuum grease (Dow Corning, Midland, MI). The scaffolds were sterilized using a 70% ethanol wash followed by two PBS rinses (Thermo Fisher Scientific). Subsequently, the fibers were coated with 4 µg/ml Fibronectin (Invitrogen, Carsbad, CA) for ~2 hours prior to cell seeding. At ~80% confluence, the cell culture was trypsinized using 0.25% Trypsin-EDTA (ATCC, Manassas, VA) and the cells were then re-suspended and diluted in culture medium. Cells were seeded with a density of ~300,000 cells/ml on the scaffolds and were allowed to attach to the fibers for ~3 hours. Finally, once cell attachment to the fibers was confirmed, each well was filled with 3 ml of media.

**Oil Red O Staining:** In order to prepare for Oil Red O staining, the cells on the protrusion assay were fixed in 4% paraformaldehyde for 15 minutes followed by two PBS rinses. 0.5% Oil Red O (Sigma Aldrich, St. Louis, MO) solution was prepared in ≥99.9% isopropanol. A working solution was prepared by diluting the Oil Red O solution in DI water in a 3:2 ratio. Before using the working solution, it was passed through a 0.2 µm syringe filter. 3 ml of the working solution was then added to each well of the fixed cells and kept in the wells for 15 minutes. Subsequently, the working solution was washed off by four DI water rinses.

**Pharmacological Inhibitors:** In order to inhibit kinesin-5 activity, 100 µm Monastrol (Millipore Sigma, St. Louis, Missouri) was used with an incubation period of 3 hours. In order to impair myosin X localization by inhibiting PIP₃ activity, 20 µm LY294002 (Millipore Sigma, St. Louis, Missouri) was used with an incubation period of 3 hours. In both cases, washout was performed by aspirating the media and washing the wells twice with PBS followed by addition of regular media. To determine the effect of the drug additions on granule dynamics, we quantified the percentage of total protrusions extended in which a granule was observed to translocate in addition to quantifying the granule speed and persistence.

**Microscopy and Imaging:** The cells were imaged using the AxioObserver Z.1 (with mRm camera) microscope (Carl Zeiss, Germany) at 63x (water based immersion) magnification with 1 second time imaging interval. Care was taken to ensure that only cells which were not interacting with other cells were imaged. The obtained videos were analyzed using ImageJ (National Institutes of Health, Bethesda, MD). Granules were tracked manually using ImageJ.

**Statistical Analysis:** Statistical analysis of the data was performed using RStudio (RStudio, Boston, MA) software. Shapiro-Wilks normality test was performed to test for the normality of the data. Analysis of
variance (ANOVA) test was used to test for statistical significance between different data sets. The following symbols are used throughout the paper to represent significance levels: * <0.05, ** <0.01, and *** <0.001. If there is no comparison shown between any data sets it implies that they are not significant. All error bars represent standard error of mean.