The role of kinematics in cortical regions for continuous human motion perception

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Abstract It has been proposed that we make sense of the movements of others by observing fluctuations in the kinematic properties of their actions. At the neural level, activity in the human motion complex (hMT+) and posterior superior temporal sulcus (pSTS) has been implicated in this relationship. However, previous neuroimaging studies have largely utilized brief, diminished stimuli, and the role of relevant kinematic parameters for the processing of human action remains unclear. We addressed this issue by showing extended-duration natural displays of an actor engaged in two common activities, to 12 participants in an fMRI study under passive viewing conditions. Our region-of-interest analysis focused on three neural areas (hMT+, pSTS, and fusiform face area) and was accompanied by a whole-brain analysis. The kinematic properties of the actor, particularly the speed of body part motion and the distance between body parts, were related to activity in hMT+ and pSTS. Wholebrain exploratory analyses revealed additional areas in posterior cortex, frontal cortex, and the cerebellum whose activity was related to these features. These results indicate that the kinematic properties of peoples' movements are

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continually monitored during everyday activity as a step to determining actions and intent.

Keywords Biological motion · fMRI · Natural events · Kinematic properties · Perception

The world is a fluid, ever-changing stream of ongoing activity and movement that the brain must transform into an understanding of intent. How this transformation takes place is a complex problem that can be approached in a bottom-up fashion by exploring the kinematic properties of actions and the brain areas responsive to these properties. The actions in question are the actual physical movements that people perform in order to achieve their intent or goal (Baldwin, Andersson, Saffran, & Meyer, 2008). Much of the research in this area has taken the approach of measuring perceptual judgments or brain activity while presenting contrasting classes of simple elemental movements (e.g., walking and running), utilizing brief video displays or impoverished representations of actions in the form of point-light displays and geometric shapes (cf. Grosbras, Beaton, & Eickhoff, 2012, for a recent meta-analysis). Only a handful of studies have examined the processing of an on-going stream of activity over longer durations (Baldwin et al., 2008; Baldwin, Baird, Saylor & Clark, 2001; Zacks, Kumar, Abrams, & Mehta, 2009) and related this observation to brain activity (Schubotz, Korb, Schiffer, Stadler, & von Cramon, 2012; Zacks, Swallow, Vettel, & McAvoy, 2006). However, these studies neglected to investigate how cortical areas respond to relevant kinematics while viewing human activity. In the present research, we directly explored how the kinematics of observed continuous actions relates to brain activity in cortical regions previously established as areas for the general processing of human action and motion. Our approach closely approximated the processes involved in natural viewing.

Studies comparing different classes of elemental actions with differing kinematics have provided insight into what motion properties relate to judgments in behavioral experiments. For example, studies of male versus female pointlight walking movements have revealed the relative contributions of form and motion in judging gender from pointlight walkers (Kozlowski & Cutting, 1977; Mather & Murdoch, 1994; Pollick, Kay, Heim, & Stringer, 2005; Troje, 2002). In addition, studies of affective doorknocking movements have shown how the velocity of the wrist can explain the structure of affective judgments from point-light arms (Johnson, McKay, & Pollick, 2011; Pollick, Paterson, Bruderlin, & Sanford, 2001). Examination of ongoing activity has been explored in the context of animacy displays (Heider & Simmel, 1944) that investigated what motion properties inform the recognition of intent from two geometric objects interacting. Blythe, Todd, and Miller (1999) used a computational analysis to show that seven kinematic features distilled from the trajectories were sufficient to categorize the type of interaction between the two objects. These cues were velocity, relative distance, relative angle, relative heading, absolute velocity, absolute vorticity (change in heading), and relative vorticity. Similarly, Zacks (2004) showed that kinematic properties could be related to the way in which observers perceived event boundaries in an animacy display. Event boundaries have been proposed as a means for understanding ongoing activity, first developed in infancy (Baldwin et al., 2001; Newtson, 1976; Zacks, Tversky, & Iyer, 2001; Zacks, 2004). Movement features, including velocity and acceleration of the animated shapes, predicted when observers perceived event boundaries and influenced action comprehension (see also Hard, Recchia, & Tversky, 2011).

Zacks, Kumar, Abrams, and Mehta (2009) explored key motion properties for event boundary perception in natural scenes, using video displays (mean duration = 370 s) of an actor performing common actions: for instance, a man sitting at a desk paying bills. On the basis of previous regression analyses from simplified motion displays (Zacks, 2004; Zacks et al., 2006), they investigated motion properties including changes in the speeds, positions, and acceleration of the actor's two arms and head, and the relative changes between the pairwise combinations. Motion properties were indeed correlated with the event boundaries perceived by the observer: The most significant predictors of event boundaries were the speed and acceleration of body parts and the relative distances between the left hand and other body parts. This left-hand bias was partially explained by the saliency of the vision of that hand: The actor was left-handed, and the hand was always closer to the viewer. This study showed that, behaviorally, in natural displays, the perception of event boundaries is predictable via changes in the bottom-up processing of the low-level motion properties.

Studies of brain activity during human motion observation have revealed a variety of brain regions specialized for this purpose. Research into how we obtain meaning and intention from observed action have revealed two networks involving substantial frontal, parietal, and temporal regions (Van Overwalle & Baetens, 2009). One of these networks has been indicated to be involved in theory of mind (ToM) and involves medial prefrontal cortex and temporo-parietal cortex (Amodio & Frith, 2006; C. D. Frith & Frith, 1999). The other network has been associated with mirror neurons and involves the inferior frontal gyrus and the inferior parietal cortex (Rizzolatti & Sinigaglia, 2010). Although these two networks appear to be involved with more complex processing of actions, other regions in temporal cortex have been shown to be involved with processing aspects of the form and motion of an action (Grosbras et al., 2012). The areas associated with selectivity to processing of form include the extrastriate body area (EBA; Downing, Jiang, Shuman, & Kanwisher, 2001) and the fusiform body area (FBA; Peelen & Downing, 2005). These regions respond to photorealistic displays of bodies and body parts, with evidence showing that the representation is more part-based in EBA than in FBA (Downing & Peelen, 2011). Areas associated with processing motion include the human motion complex (hMT+), and the posterior region of the superior temporal sulcus (pSTS), which has been demonstrated to be more active when viewing intact displays of biological motion than when viewing scrambled displays (Beauchamp, Lee, Haxby, & Martin, 2002; Grossman & Blake, 2002). It is important to point out, though, that the relationship between individual brain areas and larger networks is not fully clear: For example, pSTS is largely considered part of the ToM network (Castelli, Happé, Frith, & Frith, 2000; U. Frith & Frith, 2010), whereas it is also considered the visual input of the mirror neuron network (see Iacoboni & Dapretto, 2006). Likewise, recent evidence has pointed to considerable overlap of hMT+ with EBA (Ferri, Kolster, Jastorff, & Orban, 2013; Weiner & Grill-Spector, 2011), suggesting that hMT+ may be more attuned to the integration of human motion and form than had previously been thought (Ferri et al., 2013; Gilaie-Dotan, Bentin, Harel, Rees, & Saygin, 2011). Ultimately, however, research has collectively suggested that cognitive aspects of human motion and action interpretation are performed by fronto-parietal networks, whereas early visual processing of human movement comprises dorsal regions sensitive to motion and ventral regions sensitive to form. This role of frontal areas was furthered explored by Schubotz et al. (2012) using extended natural displays of human activity (mean duration = 81 s). Comparing intention-driven displays (e.g., laundry) with purely human motion displays (e.g., tai chi movements), and using scrambled point-light versions as controls, they found that only when displays allowed previous knowledge of intent, as opposed to knowledge of movement (i.e., laundry > tai chi), were fronto-parietal networks invoked, suggesting top-down modulation in order to comprehend intent (Schubotz et al., 2012; Zacks, 2004). However, as expected, the perception of human movement did show activation in hMT+ relative to the control stimuli.

To move beyond simply identifying activated cortical regions, studies using long display durations have examined the relationship of the kinematic properties of animated movement to brain activity. For example, Dayan et al. (2007) investigated how brain activity is modulated by viewing the different relationships between the speed and shape of 9-s movements. Dayan et al. produced displays of a cloud of points moving in an elliptical trajectory, in which the cloud of points either did or did not move with the natural covariation of speed and shape suggested by the 1/3 power law between speed and local curvature. The researchers found that, regardless of the speed-shape relation, a bilateral fMRI signal increase was apparent in posterior visual areas, including occipito-temporal cortex and bilateral inferior parietal lobe. However, when the speed-shape relation was natural, they found activation in bilateral STS/superior temporal gyrus and in bilateral posterior cerebellum. Using simple animations of two interacting geometric objects, Zacks, Swallow, Vettel, and McAvoy (2006) reported that speed, the distance between objects, and relative speed were related to the fMRI response in areas including hMT+. They also showed that activity in hMT+ and pSTS increased at times that observers identified event boundaries. Similarly Jola et al. (2013) found that fMRI activity in these regions was correlated among a group of observers when they watched a 6-min-long solo dance. Jola et al. suggested that this activity might result from observers synchronizing their brain activity to the motion of the dancer. One possibility is that hMT+ and pSTS both perform human motion analyses and play a bottom-up role in action perception. However, Zacks et al. (2006) used simple geometric stimuli that were quite impoverished relative to live-action movies of human activity. Everyday activity incorporates much additional information, such as nonrigid articulation, and it may be that the relationship between hMT+, pSTS, and observed kinematics may dissipate when such additional information is freely available, despite the behavioral percept remaining largely intact (Zacks et al., 2009).

The present study extends these previous results by exploring the relationship between a set of kinematic properties of a viewed naturalistic movement and brain activity as revealed via fMRI. Our visual stimuli consisted of two extended live-action movies, taken from Zacks et al. (2009), of an actor performing two activities: (a) "playing with Duplo (Lego)" and (b) "paying bills." We conducted analyses at both the whole-brain level and the region-of-interest (ROI) level, focusing on areas previously

highlighted: pSTS and hMT+. Furthermore, an additional ROI, the fusiform face area (FFA), was studied. The FFA is specialized for the processing and recognition of faces (Kanwisher, McDermott, & Chun, 1997; Sergent, Ohta, & MacDonald, 1992), and thus would not be expected to be greatly influenced by motion. We proposed that in regions relating to motion processing, BOLD activity would be predicted by changes in the speed and acceleration of the actor's limbs. Furthermore, we expected this relationship to be found in both the ROI and whole-brain analyses, with the whole-brain analysis revealing additional areas that might be involved in processing observed natural actions. No change in neural activation of the FFA related to the motion properties of the actor was expected.

Method

Participants

A group of 12 participants (six male, six female; mean age = 22.25, SD = 2.83) were recruited from the University of Glasgow Subject Pool. All participants self-reported being right-handed and neurologically healthy. They were paid £30 in total for their participation. Ethics permission was granted from the Ethics Board of the Faculty of Information and Mathematical Sciences, University of Glasgow.

Stimuli

The stimuli for the functional scan consisted of two movies taken from the set previously described by Zacks et al. (2009). In brief, both movies depicted one man performing common activities at a table: (a) the actor paid a set of bills (Fig. 1a, "Bills"); (b) the actor built model figures using Duplo blocks (www.lego.com) (Fig. 1b, "Duplo"). The displays lasted 371 and 388 s, respectively. Three markers for motion tracking were visible on the head and hands of the actor during the displays. These allowed for magnetic motion tracking (www.ascension-tech.com) of the actor's movements for later analysis of their kinematic properties in a three-dimensional (3-D) space.

Image acquisition

The participants were scanned using a 3-T Siemens TimTrio MRI scanner (Erlangen, Germany). They completed two scanning sessions lasting approximately 1 h each, separated by a break period of ~30 min, during which the participant was removed from the scanner. Both sessions contained anatomical image acquisition of the whole-brain structure via a 3-D magnetization prepared rapid acquisition gradient recalled echo (MP-RAGE) T1-weighted sequence (192

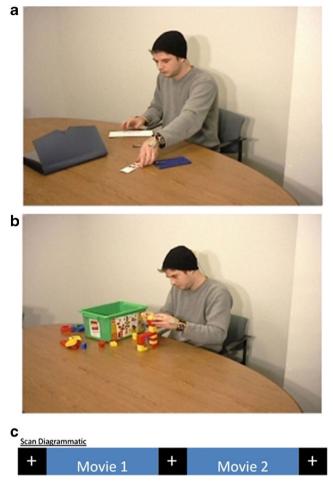


Fig. 1 One frame from each of the displayed experimental movies. **a** Taken from the display showing the actor paying bills. **b** Taken from the display showing the actor building a model with Duplo blocks

slices, 1-mm³ isovoxel, TR = 1,900 ms, TE = 2.52, 256 \times 256 image resolution). The sessions included the functional scans described here as well as others that comprised a separate experiment.

Functional and localizer scans were divided up between sessions: Session 1 consisted of the functional scan for seeing the two movies (echo-planar 2-D imaging: PACE-MoCo, TR = 2,000 ms, TE = 30 ms, 32 sagittal slices (near whole-brain), 3-mm³ isovoxel, 70 × 70 matrix, 391 volumes), as well as an hMT+ localizer (like the previous scan; 182 volumes) and a pSTS localizer (like the previous scan; 245 volumes). Session 2 consisted of two unreported functional scans and the FFA localizer (like the previous scan, except TR = 3,000 ms, TE = 30 ms; 152 volumes).

Functional scan

The two displays ("Bills" and "Duplo") were presented to participants in the scanner via NordicNeuroimagingLab presentation goggles (www.nordicneuroimgaginglab.com). The goggles had a viewing area of 800 (width) \times 600 (height) pixels, covering 30 \times 22.5 deg of visual angle. Both displays were presented in one functional scan with 10 s of fixation (white cross on a uniform black background) separating the displays. A further 10 s of fixation was presented immediately prior to the onset of the first display and immediately postoffset of the second display. The order of the displays within the run was pseudorandomized across participants: Four participants saw "Duplo" first in the sequence. Timing and display presentation were controlled via Presentation (www.neurobs.com). The participants viewed all displays passively.

Functional localizers

hMT+ hMT+ is defined as a region in the lateral posterior cortex where brain activation is stronger to dynamic than to static displays (Tootell et al., 1995) and is neither shapesensitive (Albright, 1984; Zeki, 1974) nor contrast-sensitive (Beauchamp et al., 2002; Huk & Heeger, 2002; Zacks et al., 2006). To identify hMT+, a block-design paradigm, in line with previous reports (Beauchamp et al., 2002; Swallow, Braver, Snyder, Speer, & Zacks, 2003; Zacks et al., 2006), was used with stimuli that alternated between a high-contrast static black-and-white circular checkerboard pattern, and a low-contrast dynamic circular dot display constructed from alternating concentric circles of black and white dots. The static checkerboard subtended 21.6 deg of visual angle and alternated between two versions of the same image 15 times over 30 s, with the black and white segments of the checkerboard switching locations across images. The total span of the moving dot display was equivalent to that of the static display. Each dot within the moving display was 2×2 pixels. The dynamic display contracted and expanded every 1.5 s, with each block of dynamic display lasting 30 s. In total, five blocks of both dynamic and static images were shown, with periods of baseline before and after the initial and final blocks. The block order was fixed across participants and always alternated from static to dynamic. All images were presented on a uniform gray background. No task was given other than to attend the displays and maintain fixation. Participants completed two runs of this 400-s hMT+ localizer. Prior to starting, participants were asked to confirm that they could indeed perceive the low-contrast dynamic display.

The localization analysis was carried out at the singlesubject level using BrainVoyager QX (2.1) in a standardized atlas space (Talairach & Tournoux, 1988). hMT+ was defined as voxels that (a) survived the contrast of dynamic greater than static (p < .005 uncorrected), (b) had a continuous area greater than 108 mm² (3 mm isotropic voxels), and (c) were within a restricted anatomical region (Zacks et al., 2006). *pSTS* pSTS was defined as a region located in the lateral posterior cortex that responded more strongly to coherent than to scrambled biological motion. A block-design paradigm was used to localize pSTS, alternating blocks of coherent and scrambled biological motion with periods of fixation (Beauchamp et al., 2002; Grossman & Blake, 2002; Grossman et al., 2000; Zacks et al., 2006). Coherent biological motion displays (black dots on a uniform gray background) were created using 12 marker points on virtual actors as they performed actions such as walking and jumping; scrambled biological motion displays were created by perturbing the initial point positions. The images subtended a viewing angle of 9.45 (width) \times 15 (height) deg. During the fixation intervals, participants viewed a black cross on a uniform gray background. Each motion stimulus block lasted 16 s, consisting of eight pairs of a 1-s display followed by a 1-s blank screen, with ten repetitions per condition. The block orders within runs were fixed: Run 1 was in the order coherent-scrambled-baseline, and Run 2 was in the reverse order. Blocks were separated by 2 s of blank screen, with 10 s of fixation before commencing the first block. A fixation cross was displayed centrally throughout. No task was given other than to attend the displays and maintain fixation. Participants completed two runs of this 490-s pSTS localizer.

pSTS was defined as voxels that (a) survived the contrast of coherent greater than scrambled motion (p < .005uncorrected), (b) had a continuous area greater than 108 mm² (3-mm isotropic voxels), and (c) were within a restricted anatomical region (Zacks et al., 2006). Given the proximity of pSTS and hMT+, any overlapping voxels were removed from both regions to achieve region-specific voxels.

FEA A final block-design paradigm was incorporated in order to localize cortical regions sensitive to face perception. Participants viewed alternating blocks of faces, houses, and noise; the noise patterns were constructed from the two other conditions (Vizioli, Smith, Muckli, & Caldara, 2010). All images were shown as uniform gray presented on a white background, and measured 11.25 deg of visual angle: Faces were cropped using an elliptical annulus in order to remove neck, ears, and hairline from the images.

Blocks of the three categories lasted for 18 s and were made up of 20 image presentations lasting 750 ms, separated by 250 ms of blank white screen. Five blocks of each category were shown. A fixation cross on a uniform background was displayed for 12 s at the commencement of each run, and also separated each condition block. Participants completed two runs of the FFA localizer, each lasting 456 s, using a fixed order: (1) faces–noise–houses and (2) the reverse order. No task was given other than to attend the displays and maintain fixation. FFA was defined as voxels that (a) survived the contrast of faces greater than houses (p < .005 uncorrected), (b) had a continuous area greater than 108 mm² (3-mm isotropic voxels), and (c) were located around the mid-fusiform-gyrus (Kanwisher et al., 1997; McCarthy, Puce, Gore, & Allison, 1997).

A summary of the locations and extents of the ROIs in the 12 participants can be seen in Table 1, and a schematic depiction of all localizer stimuli and regions of activation can be seen in Fig. 2.

fMRI data analysis

Two separate analyses were performed to characterize the relations between movement features and brain activity, one using the functionally localized regions of interest, and the other using a voxel-wise whole-brain approach.

ROI All functional and anatomical images were analyzed using BrainVoyager QX 2.1 (Brain Innovations, Maastricht, Netherlands). Functional images were initially preprocessed via slice scan-time correction (cubic-spline interpolation) and temporal high-pass filtering in order to remove low-frequency nonlinear drifts. An additional 3-D motion correction (trilinear interpolation) was used to remove head motion: The translation correction never exceeded 3 mm. All images were transformed into Talairach stereotaxic space (Talairach & Tournoux, 1988) by initially coaligning all functional images to the first volume of the functional run closest to the relevant anatomical run. The two session anatomical scans were then coaligned via intersession alignment methods within BrainVoyager, resulting in all functional images being registered to the stereotaxic space.

For each ROI, in all participants, the mean time course of the region during each display was extracted and a linear model predicting brain activity from four movement variables was fitted. Four variables were selected, in order to minimize multicollinearity and degrees of freedom while retaining as much as possible of the variance in the movement signals. The 3-D positional coordinates of the actor were tracked using magnetic sensors attached to the actor's hands and head. On the basis of stepwise regression models from previous research informing the most relevant parameters for anthropomorphized motion analysis (Zacks, 2004; Zacks et al., 2009; Zacks et al., 2006), the selected variables were:

- 1. the *distance* between each pair of body parts (i.e., left hand, right hand and head),
- 2. the *speed* of each body part (the norm of the first derivative of position),
- 3. the *relative speed* of each pair of body parts (the first derivative of distance), and

Table 1 Localizer summary: Summary positional coordinates and						
cluster sizes of group activation from the three functional localizer						
scans. pSTS, posterior superior temporal sulcus; hMT+, human motion						

complex; FFA, fusiform face area; n, number of participants who showed activation at given contrast

	Right Hemisphere					Left Hemisphere				
	n	x	у	Ζ	No. of Voxels	n	x	у	Ζ	No. of Voxels
pSTS (t485)	11/12	43.4 (6.1)	-51.7 (6.8)	11.4 (7.5)	524 (261.1)	9/12	-48.2 (6.9)	-58 (10.1)	13 (6.9)	281 (146.3)
hMT+ (t360)	11/12	41.5 (4.8)	-65.6 (4.5)	4.8 (5.7)	908 (490.1)	10/12	-41.1 (5.3)	-69.4 (4.7)	5.8 (6.8)	811 (376.4)
FFA (t295)	8/12	34.5 (2.8)	-46.8 (10.5)	-12.0 (8.1)	406 (222)	7/12	-36.4 (3.6)	-52 (13.1)	-12.3 (3.8)	358 (263.1)

Average Talairach coordinates and voxels in ROI coordinates in Talairach space at p < .0005; K > 5; voxels = 3 mm³. Standard deviations are in parentheses

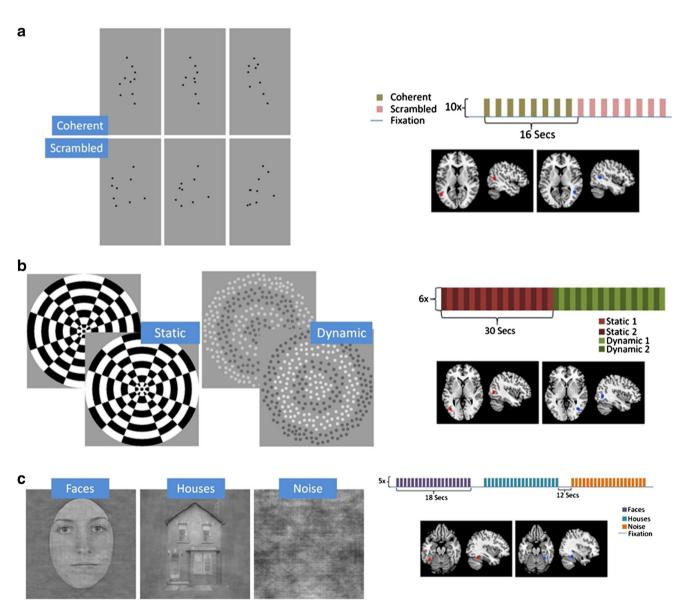


Fig. 2 Frames from each condition of the three functional localizers, with a schematic diagram of the paradigm and diagrams of the locations of mean activation on a generic normalized brain atlas. **a** Posterior

superior temporal sulcus (pSTS) paradigm. **b** human motion complex (hMT+) paradigm. **c** Fusiform face area (FFA) paradigm. Talairach coordinates are as in Table 1

4. the *relative acceleration* of each pair of body parts (the second derivative of distance).

For example, if the actor were to have his left hand resting on his head and then reach for a pen on the table, the movement variables would change as follows. The distance between the hand and head would increase. The speed of the left hand would increase from zero, and then decrease as the hand approached the pen. The relative speed between the left hand and the head would likewise increase from zero, then decrease. The relative acceleration of the left hand and head would initially be zero, then would be positive as the hand sped up, and then would turn negative as the hand slowed, approaching the pen.

The left hand, right hand, and head each had a speed feature, and each of the three pairs of body parts had distance, relative speed, and relative acceleration features. Thus, 12 movement features were tracked in total. Each movement feature was averaged over the duration of each image acquisition frame (29.97 fps) and convolved with a model hemodynamic response function (Boynton, Engel, Glover, & Heeger, 1996) to produce a set of predictor variables. These variables were entered into linear models, together with variables coding for effects of no interest: the presence of the movies and the linear trend across the scan. The dependent measure was the preprocessed blood oxygen dependent (BOLD) signal for each participant for each ROI. Mean regression weights per participant for distance, speed, relative speed, and relative acceleration were calculated by averaging the regression weights across body parts (for speed) or pairs of body parts (for distance, relative speed, and relative acceleration). To provide significance tests with participants as a random effect, the averaged regression weights from each participant's linear models were subjected to one-sample t tests. Only participants who showed, at minimum, unilateral localization of the ROIs were included in this analysis. Furthermore, in order to compare relationships between the motion parameters within and across the two main experimental ROIs (i.e., pSTS and hMT+), a twoway mixed-design analysis of variance (ANOVA: betweensubjects variables, hMT+ and pSTS; within-subjects variables, speed, distance, relative speed, and relative acceleration) was conducted for participants who correlated at least unilaterally in both ROIs. Finally, interhemispherical differences were not considered, due to the reduced power of this test from unilateral localization in a number of participants (see Table 1). All tests were corrected for multiple comparisons using Bonferroni correction.

Whole brain Brain activity also was analyzed at the singlevoxel level across the whole brain. The raw BOLD data were preprocessed to remove artifacts due to slice timing, were corrected for participant motion, and were mapped into a standard atlas space (see Speer, Reynolds, & Zacks, 2007, and Yarkoni, Speer, Balota, McAvoy, & Zacks, 2008, for the details of the procedure). Linear models were fitted, and *t* tests were conducted as for the ROI analysis. The results were corrected for multiple comparisons by converting the *t* statistics to *z* statistics, selecting a threshold of z = 3.5 and a cluster size of nine in order to control the overall map-wise false-positive rate at p = .05, on the basis of the Monte Carlo simulations of McAvoy, Ollinger, and Buckner (2001).

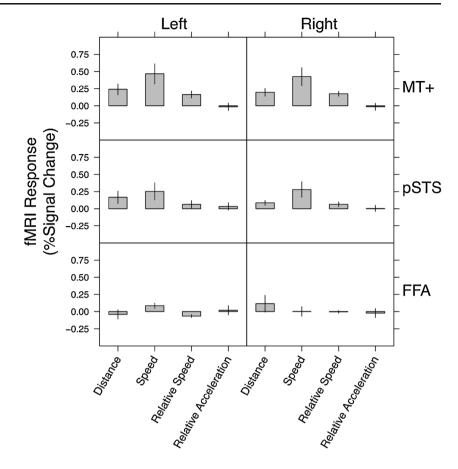
Results

ROI analysis

The localized ROIs were consistent with previous research on these areas: hMT+ (Beauchamp et al., 2002; Zacks et al., 2006), pSTS (Grossman & Blake, 2002; Zacks et al., 2006), and FFA (Grill-Spector, Knouf, & Kanwisher, 2004). The strengths of the relations between movement features and brain activity in hMT+, pSTS, and FFA are depicted in Fig. 3. To contain the number of multiple comparisons, and due to unilateral localization in a number of participants, statistical tests were conducted after averaging the effects across the two hemispheres. In hMT+, the distance between body parts, the speed of body parts, and their relative speed were all significantly related to brain activity [smallest t(10)] = 3.58, corrected p = .02]. Relative acceleration was not [t(10) = -0.24, n.s.]. In pSTS, speed was significantly related to activity [t(10) = 2.98, corrected p = .04]. The relation for distance was significant before correcting for multiple comparisons, but it did not survive the correction [t(10) = 2.36], corrected p = .12]. Neither relative speed nor relative acceleration was significantly related [largest t(10) = 1.80, n.s.]. In FFA, no movement features were significantly related to brain activity [largest t(9) = -2.02, n.s.].

To compare the strengths of the relationships of the motion parameters across the two main experimental ROIs (i.e., pSTS and hMT+), a two-way mixed-design ANOVA (between-subjects variables, hMT+ and pSTS; within-subjects variables, speed, distance, relative speed, and relative acceleration) was conducted using all participants for whom both regions were activated (n/ROI = 10). After Bonferroni correction for multiple comparisons, no significant interaction between ROI and kinematics was found, F(3, 54) = 0.3, n.s., nor did we observe a significant main effect for the ROI variable, F(1, 18) = 1.7, n.s. Finally, a significant main effect of kinematics was found, F(3, 54) = 11.24, p < .01: Post-hoc comparisons revealed a significant difference between the mean regression weights for speed being higher than those of distance, relative speed, and relative acceleration. Two similar follow-up ANOVAs comparing FFA to the two main

Fig. 3 Strengths of the relations between movement features and brain activity in independently identified functional regions of interest. The units are percentages of signal change per unit of distance (pixels), speed (pixels/s), relative speed (pixels/s), and relative acceleration (pixels/s²). Error bars indicate standard errors



experimental ROIs (n/ROI = 9) showed a similar pattern of results, except this time the between-subjects comparison of ROIs was significant: Activation was greater in hMT+ than in FFA [F(1, 16) = 8.0, p < .05], as was activation greater in pSTS than in FFA [F(1, 16) = 5.3, p < .05].

Finally, to understand the collinearity between the kinematic variables, we considered the correlation between each kinematic variable after it was convolved with the hemodynamic response function. A moderate positive correlation emerged between speed and distance (r = .68, p < .01), as well as weak negative correlations between relative acceleration and distance (r = ..18, p < .05) and relative acceleration and speed (r = ..16, p < .05). No other relationships were significant.

Whole-brain analysis

Using an analytical method similar to that in the ROI analysis, the whole-brain analysis revealed a number of regions whose neural activity was predicted by movement features in the posterior cortex, and one region each in the frontal cortex and cerebellum. These areas are listed in Table 2, and the cortical regions are depicted in Fig. 4. The distance between the head and hands of the actor was positively related to activity in a number of regions in the superior parietal cortex, to another cluster at the juncture of the parietal, temporal, and occipital lobes, and to small regions in the medial temporal lobes and the cerebellum. No regions showed activity that was negatively related to the distance between the head and hands of the actor. The speed of the same body parts was positively related to activity in a pair of temporoparietal regions situated proximally to hMT+. This was also true in an early visual area in the left lingual gyrus (likely corresponding to V2/V3) and in the left cuneus. No regions showed activity that was significantly negatively related to speed. The relative speed with which the body parts moved was positively related to activity in small clusters in the left superior parietal cortex, and in the right somatosensory cortex and premotor cortex. No regions showed activity that was negatively related to the relative speeds of the body parts, and we found no significant clusters relating to changes in relative acceleration.

Discussion

When observers viewed extended natural displays of human movement, the brain activity in motion processing areas was related to the kinematics of the actor's hands and head. This relationship was shown in both a focused ROI analysis and

Table 2 Neural regions from the whole-brain analysis that were significantly correlated with movement features

x (peak)	y (peak)	z (peak)	Description	BA	Volume (cm ³)	Z Statistic at Peak	
Distance							
26	-27	-27	R. medial temporal	28/36	0.73	4.91	
-22	-39	-21	L. medial temporal	28/34	0.24	3.94	
20	-78	-21	R. cerebellum		0.41	4.1	
-46	-54	-15	L. fusiform gyrus	20/37	1.08	4.54	
38	-51	-12	R. fusiform gyrus	20/37	1	4.48	
-22	-54	-15	L. fusiform gyrus	20/37	0.59	4.6	
28	-69	-18	R. fusiform gyrus	19	0.3	4.05	
46	-69	-3	R. occipitotemporal junction	19/37	2.02	4.88	
32	-84	6	R. lateral occipital	19	0.89	3.95	
-40	-81	12	L. lateral occipital	19	0.49	3.8	
-26	-81	15	L. temporoparietal junction	19/39	0.27	4.01	
26	-66	45	R. inferior parietal lobule	7	0.65	4.47	
-22	-57	48	L. inferior parietal lobule/superior parietal lobule	7	0.35	3.94	
26	-60	57	R. superior parietal lobule	7	1.05	4.33	
Speed							
-10	-93	-9	L. lingual gyrus	18	0.81	4.59	
-40	-69	6	L. middle temporal gyrus (hMT+)	37	0.62	4.13	
-14	-96	9	L. cuneus	18	0.54	4.16	
44	-63	12	R. middle temporal gyrus (hMT+)	37	0.68	3.97	
Relative S	peed						
28	-36	51	R. somatosensory cortex	4	0.32	4.98	
-20	-57	57	L. superior parietal lobule	7	0.89	4.48	
32	-12	57	R. premotor cortex	6	0.76	4.36	

R, right hemisphere; L, left hemisphere; BA, Brodmann's area

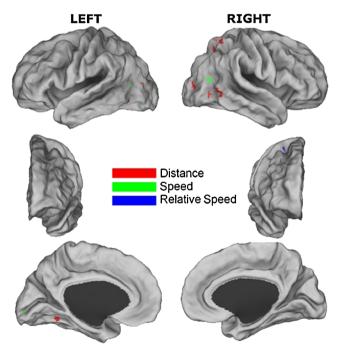


Fig. 4 Regions significantly correlated with movement features in the whole-brain analysis, with different colors/shading indicating the different variables

an unguided whole-brain analysis. The convergence of the two analytical methods highlights the association between limb movements and brain activity: Both methods showed a positive relationship between the speed of the actor's hands and head and BOLD activity in bilateral human motion complex (hMT+). In addition, the ROI analyses highlighted relationships between hMT+ and distance, between hMT+ and relative speed, and between pSTS and speed. Speed appeared to be the main predictor of brain activity in hMT+ and pSTS, though a moderate correlation between speed and distance was found, which may have blurred individual contributions. Finally, hMT+ and pSTS showed no significant difference in terms of how their activity was modulated by motion properties, but both regions showed stronger relationships to the kinematic parameters than did FFA. In turn, FFA showed no relationships with kinematic parameters. These results indicate that motion properties, and primarily the speed of human motion, are processed in a related fashion within pSTS and hMT+, and that the FFA is not involved in biological motion processing.

Overall, the findings advance current thinking on the relationship between brain activity and kinematic properties

for action understanding. Behaviorally, using the same displays as used in the present study, the kinematic parameters most strongly related to segmenting the actor's behavior into meaningful events were the speed and distance properties of an observed agent's limbs and head (Zacks et al., 2009). At the neural level, Zacks et al. (2006) showed that while passively viewing the activity of simple animated displays, BOLD changes in hMT+ and in pSTS were indicative of times in the displays that participants would later explicitly perceive to be the end of one event and the beginning of the next. In turn, Schubotz et al. (2012), using natural displays and an online segmentation task, found that hMT+, in general, was related to changes in human motion, but not to goals and intents: Goal comprehension appeared to be modulated by frontal memory networks. The present results advance the theory by showing that when passively observing extended natural displays of a human actor, as opposed to elemental or animated displays, the speed and motion properties proposed as being relevant for event comprehension are correlated to changes in brain activation in the previously highlighted occipital-temporal regions (Schubotz et al., 2012; Zacks et al., 2006). The full comprehension of ongoing activity may lie in the combination of bottom-up processing of motion parameters and top-down action knowledge and memory (Schubotz et al., 2012) or statistical learning of actions (Baldwin et al., 2008).

One caveat is that the present study did not show a direct behavioral correspondence between brain activity during movie viewing and our behavioral measures of action understanding. Instead, we linked activation associated with passive viewing in the present study to behavioral measures obtained previously by Zacks and colleagues (Zacks et al., 2009) using the identical stimuli. This link is consistent with a previous work in which brain activation in occipital-temporal regions obtained via passive viewing related to the role of kinematic parameters in event segmentation (Zacks et al., 2006). In future studies, researchers may consider maintaining direct tests between behavior and brain activation, giving consideration to activation due to task demands (cf. Grosbras et al., 2012).

The neural areas highlighted by the whole-brain analysis were wholly consistent with previous findings for biological motion perception. A relationship between the speed of movement and neural activation was observed in both hMT+ and pSTS, and in the whole-brain analysis, in bilateral occipital–temporal regions. Speed correlates were also witnessed in early visual cortex (V2/V3), with acceleration correlates witnessed proximal to hMT+. The distance between body parts was related to brain activity mostly in temporal and occipital regions, with some activation in the superior parietal cortex and cerebellum. Body part distance is an indicator of posture, in that larger distances occur when the hands are spread and far from the head. These results are

consistent with a distinction between the processing of form and motion (Giese & Poggio, 2003; Grosbras et al., 2012; Jastorff & Orban, 2009; Lange & Lappe, 2006), but crossover of regions is to be expected, given the correlation between the speed and distance parameters. The correlation of speed and distance in these stimuli may mask the unique contribution of each of these parameters to brain activation. Future studies could probe these relationships using stimuli that decorrelated the two sets of features. Finally, the relationship between distance and brain activity in parietal regions likely reflects activity in body-part-centered neurons for the encoding of hand and head positions (Calvo-Merino, Glaser, Grèzes, Passingham, & Haggard, 2005; Caspers et al., 2010; Colby, 1998; Graziano & Gross, 1998; Wagner, Dal Cin, Sargent, Kelley, & Heatherton, 2011; Willems & Hagoort, 2009).

Activations in right premotor and inferior parietal regions are consistent with the existence of a fronto-parietal mirror neuron circuit (Fogassi et al., 2005; Gallese, Fadiga, Fogassi, & Rizzolatti, 1996; Rizzolatti & Sinigaglia, 2010). Similarly, activation in the right somatosensory cortex is consistent with findings of areas with mirror function in this area (Keysers, Kaas, & Gazzola, 2010). These activations were suggested to be driven by the actor being left-handed and the prominence of this hand in the video display: An influence of the left hand in these displays was previously shown on event perception (Zacks et al., 2009).

Finally, given the lack of a relationship between motion parameters and activation to the FFA, activation witnessed in the fusiform gyrus/lateral occipital cortex likely relates in part to general face perception of the actor (Kanwisher et al., 1997; Sergent et al., 1992) or to object recognition (Grill-Spector, Kourtzi, & Kanwisher, 2001) as the viewer recognizes what the actor is manipulating (Grosbras et al., 2012). For example, this may have occurred in the "Duplo" scenario, in which recognition of the object changes as the video progresses.

In conclusion, the ROI analysis showed that fMRI activity in areas associated with biological motion perception is indeed modulated by the specific kinematic properties of actors in continuous natural-motion displays. The dominant parameters appear to be the moving speeds of the hands and head of the observed actor, though a further distinction of the roles of speed and distance is required. A secondary wholebrain analysis supported these findings in hMT+ and showed the involvement of neural areas expected from previous findings for human perception. This study moves beyond mere extrapolation of a relationship between kinematics and neural activation, when observing constrained or animated displays, to firmly establishing that this relationship exists when viewing actual human motion over long durations. The monitoring of motion parameters, such as the speed and distance of limbs, by areas including hMT+ and pSTS is

proposed as a key bottom-up process through which the brain processes the ongoing streams of activity that make up our environment.

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References

- Albright, T. D. (1984). Direction and orientation selectivity of neurons in visual area MT of the macaque. *Journal of Neurophysiology*, 52, 1106–1130.
- Amodio, D. M., & Frith, C. D. (2006). Meeting of minds: The medial frontal cortex and social cognition. *Nature Reviews Neuroscience*, 7, 268–277.
- Baldwin, D., Andersson, A., Saffran, J., & Meyer, M. (2008). Segmenting dynamic human action via statistical structure. *Cognition*, 106, 1382–1407.
- Baldwin, D. A., Baird, J. A., Saylor, M. M., & Clark, M. A. (2001). Infants parse dynamic action. *Child Development*, 72, 708–717.
- Beauchamp, M. S., Lee, K. E., Haxby, J. V., & Martin, A. (2002). Parallel visual motion processing streams for manipulable objects and human movements. *Neuron*, 34, 149–159.
- Blythe, P. W., Todd, P. M., & Miller, G. F. (1999). How motion reveals intention: Categorizing social interactions. In G. Gigerenzer, P. M. Todd, & the ABC Research Group (Eds.), *Simple heuristics that make* us smart (pp. 257–285). New York, NY: Oxford University Press.
- Boynton, G. M., Engel, S. A., Glover, G. H., & Heeger, D. J. (1996). Linear systems analysis of functional magnetic resonance imaging in human V1. *Journal of Neuroscience*, 16, 4207–4221.
- Calvo-Merino, B., Glaser, D. E., Grèzes, J., Passingham, R. E., & Haggard, P. (2005). Action observation and acquired motor skills: An fMRI study with expert dancers. *Cerebral Cortex*, 15, 1243– 1249. doi:10.1093/cercor/bhi007
- Caspers, S., Zilles, K., Laird, A. R., & Eickhoff, S. B. (2010). ALE meta-analysis of action observation and imitation in the human brain. *NeuroImage*, 50, 1148–1167. doi:10.1016/j.neuroimage. 2009.12.112
- Castelli, F., Happé, F., Frith, U., & Frith, C. (2000). Movement and mind: A functional imaging study of perception and interpretation of complex intentional movement patterns. *NeuroImage*, 12, 314–325.
- Colby, C. L. (1998). Action-oriented spatial reference frames in cortex. *Neuron*, 20, 15–24.
- Dayan, E., Casile, A., Levit-Binnun, N., Giese, M. A., Hendler, T., & Flash, T. (2007). Neural representations of kinematic laws of motion: evidence for action-perception coupling. *Proceedings of* the National Academy of Sciences, 104, 20582–20587.
- Downing, P. E., Jiang, Y. H., Shuman, M., & Kanwisher, N. (2001). A cortical area selective for visual processing of the human body. *Science*, 293, 2470–2473.
- Downing, P. E., & Peelen, M. V. (2011). The role of occipitotemporal body-selective regions in person perception. *Cognitive Neuroscience*, 2, 186–203.
- Ferri, S., Kolster, H., Jastorff, J., & Orban, G. A. (2013). The overlap of the EBA and the MT/V5 cluster. *NeuroImage*, 66, 412–425.
- Fogassi, L., Ferrari, P. F., Gesierich, B., Rozzi, S., Chersi, F., & Rizzolatti, G. (2005). Parietal lobe: From action organization to intention understanding. *Science*, 308, 662–667.

- Frith, C. D., & Frith, U. (1999). Interacting minds—A biological basis. Science, 286, 1692–1695. doi:10.1126/science.286.5445.1692
- Frith, U., & Frith, C. (2010). The social brain: Allowing humans to boldly go where no other species has been. *Philosophical Transaction of the Royal Society B*, 365, 165–176. doi:10.1098/rstb. 2009.0160
- Gallese, V., Fadiga, L., Fogassi, L., & Rizzolatti, G. (1996). Action recognition in the premotor cortex. *Brain*, 119, 593–609.
- Giese, M. A., & Poggio, T. (2003). Neural mechanisms for the recognition of biological movements. *Nature Reviews Neuroscience*, 4, 179–192. doi:10.1038/nrn1057
- Gilaie-Dotan, S., Bentin, S., Harel, M., Rees, G., & Saygin, A. P. (2011). Normal form from biological motion despite impaired ventral stream function. *Neuropsychologia*, 49, 1033–1043.
- Graziano, M. S. A., & Gross, C. G. (1998). Spatial maps for the control of movement. *Current Opinion in Neurobiology*, 8, 195–201.
- Grill-Spector, K., Knouf, N., & Kanwisher, N. (2004). The fusiform face area subserves face perception, not generic within-category identification. *Nature Neuroscience*, 7, 555–562.
- Grill-Spector, K., Kourtzi, Z., & Kanwisher, N. (2001). The lateral occipital complex and its role in object recognition. *Vision Research*, 41, 1409–1422.
- Grosbras, M. H., Beaton, S., & Eickhoff, S. B. (2012). Brain regions involved in human movement perception: A quantitative voxelbased meta-analysis. *Human Brain Mapping*, 33, 431–454.
- Grossman, E. D., & Blake, R. (2002). Brain areas active during visual perception of biological motion. *Neuron*, 35, 1167–1175.
- Grossman, E., Donnelly, M., Price, R., Pickens, D., Morgan, V., Neighbor, G., & Blake, R. (2000). Brain areas involved in perception of biological motion. *Journal of Cognitive Neuroscience*, 12, 711–720. doi:10.1162/089892900562417
- Hard, B. M., Recchia, G., & Tversky, B. (2011). The shape of action. Journal of Experimental Psychology. General, 140, 586–604.
- Heider, F., & Simmel, M. (1944). An experimental study of apparent behavior. *The American Journal of Psychology*, 57, 243–259.
- Huk, A. C., & Heeger, D. J. (2002). Pattern-motion responses in human visual cortex. *Nature Neuroscience*, 5, 72–75.
- Iacoboni, M., & Dapretto, M. (2006). The mirror neuron system and the consequences of its dysfunction. *Nature Reviews Neuroscience*, 7, 942–951. doi:10.1038/nrn2024
- Jastorff, J., & Orban, G. A. (2009). Human functional magnetic resonance imaging reveals separation and integration of shape and motion cues in biological motion processing. *Journal of Neuroscience*, 29, 7315–7329. doi:10.1523/JNEUROSCI. 4870-08.2009
- Johnson, K. L., McKay, L. S., & Pollick, F. E. (2011). He throws like a girl (but only when he's sad): Emotion affects sex-decoding of biological motion displays. *Cognition*, 119, 265–280.
- Jola, C., McAleer, P., Grosbras, M., Love, S. A., Morison, G., & Pollick, F. E. (2013). Uni- and multisensory brain areas are synchronized across spectators when watching unedited dance recordings. *Perception*, 4, 1–20.
- Kanwisher, N., McDermott, J., & Chun, M. M. (1997). The fusiform face area: A module in human extrastriate cortex specialized for face perception. *Journal of Neuroscience*, 17, 4302–4311.
- Keysers, C., Kaas, J. H., & Gazzola, V. (2010). Somatosensation in social perception. *Nature Reviews Neuroscience*, 11, 417–428.
- Kozlowski, L. T., & Cutting, J. E. (1977). Recognizing sex of a walker from a dynamic point-light display. *Perception & Psychophysics*, 21, 575–580. doi:10.3758/BF03198740
- Lange, J., & Lappe, M. (2006). A model of biological motion perception from configural form cues. *Journal of Neuroscience*, 26, 2894–2906.
- Mather, G., & Murdoch, L. (1994). Gender discrimination in biological motion displays based on dynamic cues. *Proceedings of the Royal Society B*, 258, 273–279.

- McAvoy, M., Ollinger, J. M., & Buckner, R. L. (2001). Cluster size thresholds for assessment of significant activation in fMRI. *NeuroImage*, 13, S198.
- McCarthy, G., Puce, A., Gore, J., & Allison, T. (1997). Face-specific processing in the human fusiform gyrus. *Journal of Cognitive Neuroscience*, *9*, 605–610.
- Newtson, D. (1976). Foundations of attribution: The perception of ongoing behavior. In J. H. Harvey, W. J. Ickes, & R. F. Kidd (Eds.), *New directions in attribution research* (pp. 223–248). Hillsdale, NJ: Erlbaum.
- Peelen, M. V., & Downing, P. E. (2005). Selectivity for the human body in the fusiform gyrus. *Journal of Neurophysiology*, 93, 603–608.
- Pollick, F. E., Kay, J. W., Heim, K., & Stringer, R. (2005). Gender recognition from point-light walkers. *Journal of Experimental Psychology, Human Perception and Performance*, 31, 1247–1265.
- Pollick, F. E., Paterson, H. M., Bruderlin, A., & Sanford, A. J. (2001). Perceiving affect from arm movement. *Cognition*, 82, B51–B61.
- Rizzolatti, G., & Sinigaglia, C. (2010). The functional role of the parieto-frontal mirror circuit: Interpretations and misinterpretations. *Nature Reviews Neuroscience*, 11, 264–274.
- Schubotz, R. I., Korb, F. M., Schiffer, A. M., Stadler, W., & von Cramon, D. Y. (2012). The fraction of an action is more than a movement: Neural signatures of event segmentation in fMRI. *NeuroImage*, 61, 1195–1205. doi:10.1016/j.neuroimage.2012.04.008
- Sergent, J., Ohta, S., & MacDonald, B. (1992). Functional neuroanatomy of face and object processing: A positron emission tomography study. *Brain*, 1, 15–36.
- Speer, N. K., Reynolds, J. R., & Zacks, J. M. (2007). Human brain activity time-locked to narrative event boundaries. *Psychological Science*, 18, 449–455.
- Swallow, K. M., Braver, T. S., Snyder, A. Z., Speer, N. K., & Zacks, J. M. (2003). Reliability of functional localization using fMRI. *NeuroImage*, 20, 1561–1577.
- Talairach, J., & Tournoux, P. (1988). Co-planar stereotaxic atlas of the human brain: 3-dimensional proportional system—An approach to cerebral imaging. Stuttgart, Germany: Thieme.
- Tootell, R. B. H., Reppas, J. B., Kwong, K. K., Malach, R., Born, R. T., Brady, T. J., & Belliveau, J. W. (1995). Functional analysis of human MT and related cortical areas using magnetic resonance imaging. *Journal of Neuroscience*, 15, 3215–3230.

- Troje, N. F. (2002). Decomposing biological motion: A framework for analysis and synthesis of human gait patterns. *Journal of Vision*, 2(5), 371–387. doi:10.1167/2.5.2
- Van Overwalle, F., & Baetens, K. (2009). Understanding others' actions and goals by mirror and mentalizing systems: A meta-analysis. *NeuroImage*, 48, 564–584.
- Vizioli, L., Smith, F., Muckli, L., & Caldara, R. (2010, June). Face encoding representations are shaped by race. Paper presented at the 16th Annual Meeting of the Organization for Human Brain Mapping, Barcelona, Spain.
- Wagner, D. D., Dal Cin, S., Sargent, J. D., Kelley, W. M., & Heatherton, T. F. (2011). Spontaneous action representation in smokers when watching movie characters smoke. *Journal of Neuroscience*, 31, 894–898.
- Weiner, K. S., & Grill-Spector, K. (2011). Not one extrastriate body area: Using anatomical landmarks, hMT+, and visual field maps to parcellate limb-selective activations in human lateral occipitotemporal cortex. *NeuroImage*, 56, 2183–2199.
- Willems, R. M., & Hagoort, P. (2009). Hand preference influences neural correlates of action observation. *Brain Research*, 1269, 90–104.
- Yarkoni, T., Speer, N. K., Balota, D. A., McAvoy, M. P., & Zacks, J. M. (2008). Pictures of a thousand words: Investigating the neural mechanisms of reading with extremely rapid event-related fMRI. *NeuroImage*, 42, 973–987. doi:10.1016/j.neuroimage.2008.04. 258
- Zacks, J. M. (2004). Using movement and intentions to understand simple events. *Cognitive Science*, 28, 979–1008.
- Zacks, J. M., Kumar, S., Abrams, R. A., & Mehta, R. (2009). Using movement and intentions to understand human activity. *Cognition*, *112*, 201–216.
- Zacks, J. M., Swallow, K. M., Vettel, J. M., & McAvoy, M. P. (2006). Visual motion and the neural correlates of event perception. *Brain Research*, 1076, 150–162.
- Zacks, J. M., Tversky, B., & Iyer, G. (2001). Perceiving, remembering, and communicating structure in events. *Journal of Experimental Psychology: General*, 130, 29–58. doi:10.1037/0096-3445.130.1.29
- Zeki, S. M. (1974). Functional organization of a visual area in the posterior bank of the superior temporal sulcus of the rhesus monkey. *The Journal of Physiology*, 236, 549–573.