

ScienceDirect



Changing our minds: the neural bases of dynamic impression updating

Peter Mende-Siedlecki

While a great deal of initial work in social neuroscience addressed the functional bases of our first impressions, our social evaluations of other people are anything but static. Just as our impressions can change, so too has our understanding of the neural underpinnings supporting this dynamic form of social learning. First, I review initial neuroimaging work on behavior-based impression updating, which observed that a distributed network of regions works in concert to revise trait representations in light of new behavioral information. Next, I discuss more recent research detailing how the updating process may be influenced by both bottom-up (e.g. experience) and top-down factors (e.g. motivation). Finally, I explore the contributions of more computational work studying similar processes via tasks that model social learning through repeated interactions and feedback-based reinforcement. Taken together, this work illustrates the expansion of our understanding of social impression formation, beyond static initial snapshots and towards a more dynamic process in which our representations of other people are continuously revised and reinterpreted in light of new information.

Address

University of Delaware, USA

Corresponding author: Mende-Siedlecki, Peter (pmendesiedlecki@psych.udel.edu)

Current Opinion in Psychology 2018, 24:72–76

This review comes from a themed issue on **Social neuroscience**

Edited by David Amodio and Christian Keysers

For a complete overview see the Issue and the Editorial

Available online 25th August 2018

https://doi.org/10.1016/j.copsyc.2018.08.007

2352-250X/© 2018 Elsevier Ltd. All rights reserved.

We rapidly form social impressions of other people, which, in turn, provide us with a means of making accurate predictions about their subsequent behavior. When we learn that a person is generous, for example, we may be more likely to place our trust in them in the future because we have some basis for inferring that they will not violate that trust. Such impressions are built up over time on the basis of a variety of direct interactions, passive observations, and third-person communication. Given the social importance of impression formation (e.g. [1,2]), it is perhaps not surprising that social neuroscience placed such an emphasis on this area of inquiry during its first decade. However, initial examinations into the neural bases of impression formation focused on relatively static 'first impressions,' whether formed based on facial appearance or behavior. This work yielded particularly consistent patterns of results: social evaluations gleaned from facial characteristics like trustworthiness recruit the amygdala (e.g. [3]), while behavior-based impression formation is critically dependent on the dorsomedial prefrontal cortex (dmPFC; e.g. [4]). However, despite the relative robustness [5,6], automaticity (e.g. [7,8]), and consequences [9] of such impressions, they only tell a fraction of the story.

The neural dynamics supporting impression updating

In our everyday experience, our impressions of others are anything but constant, and are rarely based on a single piece, or even a single channel of social evidence. Instead, we dynamically integrate across a continuous cascade of information (e.g. behaviors, appearances, preferences, social categorizations, prior knowledge) implying dispositional tendencies, each unit of which might interact with or contradict another. A subsequent wave of neuroimaging work on updating has sought to characterize the neural dynamics supporting our ability to *update* social impressions in light of behavioral inconsistencies.

In these studies, participants typically form first impressions in response to some piece of information implying a particular disposition (e.g. a trustworthy facial appearance or a positively valenced behavior), which are then contradicted by some subsequent piece of information implying the opposite disposition. For example, Mende-Siedlecki and colleagues conducted three experiments in which participants learned about a series of individuals over the course of five consecutive behaviors $[10,11,12^{\bullet\bullet}]$. Within inconsistent individuals, the first three behaviors were always internally consistent in terms of valence, while the last two behaviors violated that expectation, thus necessitating an updated impression.

This general approach has been used to examine the neural bases of impression updating across a variety of social inconsistencies, including behavior-appearance incongruities [13,14] and behavior-stereotype incongruities [15], as well as trait-related inconsistencies within an individual's behavior [16–18]. Taken together, this work

highlights a distributed network of supporting brain regions. For example, the dmPFC, which is associated with mentalizing and trait inference (e.g. [4,19,20]), has been consistently identified as responding to unexpected, update-provoking social information. Subsequent work employing transcranial magnetic stimulation (TMS) during updating has confirmed the dmPFC's causal role in combining multiple pieces of social information to form a cohesive trait impression [21,22]. However, the updating process also depends on the recruitment of other regions involved in social perception (e.g. superior temporal sulcus; STS), theory of mind (e.g. temporoparietal junction/inferior parietal lobule; TPJ/IPL), expectancy violation (e.g. dorsal anterior cingulate; dACC), and cognitive control (e.g. lateral prefrontal cortex; IPFC).

Bottom-up and top-down influences on the updating process

Having begun to establish the neural framework of impression updating, subsequent research has tackled fundamental questions regarding the underlying processes. For example, do updating-related changes in activity reflect altered trait representations elicited by attributionally meaningful changes in behavior, as opposed to mere moment-to-moment inconsistencies? Recent work suggests that different components of the network described above make separate contributions supporting updating [12^{••}]. For example, while left ventrolateral prefrontal cortex (vIPFC) and inferior frontal gyrus (IFG) are preferentially recruited during updates triggered by inconsistent immoral behaviors, others structures (e.g. dACC, PCC, TPJ/IPL) respond preferentially to more mundane inconsistencies.

What, then, makes a behavior meaningful in the context of impression updating? What kinds of behavior elicit the strongest, most resilient changes in impressions? Previous behavioral research dovetails with the results described above. When it comes to learning about another person's moral character, immoral behaviors are more heavily weighted than their positive counterparts [23], and lead to more substantial revisions of both explicit (e.g. [24]) and implicit impressions (e.g. [25,26]). However, when considering a person's ability, positive (e.g. competent) behaviors are more diagnostic than negative (e.g. incompetent) behaviors [23]. This apparent asymmetry in diagnosticity can be explained parsimoniously: immoral and competent behaviors are given more weight in our impressions because they carry greater informational value [27]. They are perceived as being comparatively statistically infrequent [10] and are thereby more diagnostic [28]. Furthermore, when updating impressions of individuals whose behavior varies in terms of either morality or ability, vIPFC and IFG also show preferential recruitment during diagnostic updates in either domain (e.g. updates triggered by highly immoral and highly competent behaviors [10]).

A wealth of research in social cognition suggests that not all incongruent behaviors are incorporated into impressions to the same degree [29,30]. Rather, the deployment of updating processes may be moderated by motivational and situational factors. For example, a perceiver's tendency to ignore or attend to unexpected information may be contingent on the degree to which a perceiver's goals depend on the individual they are learning about (e.g. outcome dependency), or as a function of that individual's group membership.

In one study employing a particularly rich, ecologically valid design, participants interacted with (and formed impressions of) two real people prior to scanning, during which they learned additional information about both partners [16]. Critically, outcome dependency was manipulated across the two individuals (via whether or not the participants' reward was tied to the partners' performance), as was social expectancy. Results revealed that dmPFC activity increased in response to expectancy-disconfirming information pertaining to outcome-*dependent* partners, but that this pattern was reversed for outcome-*independent* partners. Thus, depending on someone to produce a self-relevant outcome can flexibly shape whether unexpected behavior is interpreted as being diagnostic or erroneous.

In a related vein, other researchers have examined how group membership might exert its own top-down, motivational influence on updating processes. For example, perceivers might be motivated to discount undesirable information that reflects poorly on their own compatriots, or conversely, might display an exaggerated response to similarly negative reports about their rivals. In line with the former account, unexpected negative information about in-group members elicited less activation in subset of neural structures involved in updating (including dACC, IPFC, and TPJ), compared to out-group or control individuals [31**]. In turn, this diminished recruitment of updating-related regions led to biased (e.g. more positively skewed) impressions of in-group individuals. These results once again suggest that motivational factors exert an influence on the updating process: while participants reliably engaged the distributed network of regions involved in updating for out-group and control individuals, this effortful process was disrupted when learning unpleasant, unflattering information about the in-group, allowing for the potential maintenance of a selfserving evaluation of one's own group. (See also [32], which found that mPFC activity in response to new, individuating information was observed for same-race targets, but not for other-race targets.)

Forming and updating impressions via social reinforcement

A parallel literature on social decision-making has considered similar learning processes from a slightly different perspective. Using tasks that model the formation of trust through repeated economic interaction and exchange (see [33] for review), this research proposes a more computational account of dynamic impression formation. In general, this approach offers a host of theoretical and methodological advances. Such tasks sidestep issues of predictability and demand, but more importantly, they allow for the possibility of identifying computational contributions of specific regions involved in updating. Moreover, they move beyond the passive, observational form of learning used in prior work to capture the inherently interactive and feedback-based nature of dynamic impression formation. Given the nature of such paradigms-in which participants make choices and receive prediction-error eliciting feedback-this work heavily implicates structures involved in reinforcement and reward learning, such as the ventral striatum and ventromedial prefrontal cortex (for meta-analysis, see [34]).

Over time, these two approaches to updating have begun to converge. Initially, this took the form of work examining how trial-by-trial updating mechanisms are influenced by other sources of social information. For example, Delgado and colleagues tested whether setting priors regarding moral character would shape indices of interpersonal trust on both behavioral and neural levels. Although trust game payoff rates were held constant across partners described through initial vignettes as being 'bad,' 'neutral,' or 'good,' participants made more risky investments in the good partner. Moreover, feedback-related activity in the caudate nucleus regarding the good and bad partners was blunted, compared to the neutral partner, suggesting that strong social expectations can lessen reliance on moment-to-moment reinforcement [35]. Other work has considered similar top-down modulation of social decision-making processes as a function of facial trustworthiness [36,37], racial group membership [38], and familiarity or prior knowledge [39–41].

Since dynamic social learning in these tasks is typically modeled in the form of monetary gains and losses, do they truly characterize the updating of *trait* representations? More recent research has attempted to disentangle reward-based and trait-based updating mechanisms from one another [42^{••}]. When trait generosity and reward are orthogonalized, both attributes guide instrumental learning and are associated with feedback-related activity in ventral striatum. However, trait learning exerts a stronger influence on social choice behavior, and furthermore, elicits activity in the same distributed network of regions associated with behavior-based impression updating described above [10,11,12^{••}]. Nevertheless, while feedback-based trait learning seems especially well-suited to human social contexts, it may be recruited while developing representations of non-social agents, as well (though see [43], which observed socially specific prediction error activity in precuneus).

sense of others' social tendencies over time. For example, a growing body of literature has employed model-based techniques to study neural computations underlying the formation of representations of status and dominance (e.g. [44**,45,46**]). Other research has used this approach to examine our dynamic ability to learn about others' emotional expressivity [47] and the reliability of their advice [48,49], as well as complex phenomena like the formation of group-based stereotypes [50] and the propagation of inequality [51]. Ultimately, a model-based account of dynamic social learning appreciates and captures a core function of our impressions of others: to serve as the basis for making effective predictions about future behavior. **Conclusion**

Work in this vein continues to examine how we make

The past decade has enhanced our understanding of dynamic impression updating in both depth and nuance. While several core brain areas are critical to the formation of initial impressions (e.g. dmPFC, amygdala), their subsequent revision recruits a distributed network including areas implicated in reinforcement learning, cognitive control, and theory of mind. Future work should continue to investigate the interaction of these processes, with the goal of producing one comprehensive framework of dynamic social learning (e.g. akin to work on the multiple memory systems supporting implicit cognition [52]). Ideally, this framework would characterize the relationships between multiple channels of social information contributing to our impressions (e.g. appearance-based judgments, passive observation of behavior, third-person communication, direction interaction). For example, it's still unclear if our underlying social representations vary across these modalities (or if they share a common neural code; e.g. [53]), or whether the process of updating itself differs as a function of the type of incoming social information. Moreover, it remains to be seen whether interactions between channels are fixed (e.g. with one channel exerting dominance, if available), or if this interplay is flexible and contextually dependent. Subsequent work on impression updating should also address questions about updating across multiple contexts (e.g. [54]) — for example, discrepancies between impressions formed online and later updated face-to-face (e.g. [55]). Little work has addressed this particular form of updating, which makes for a particularly relevant and ecologically valid test of the prevailing models of social impression formation.

Moving forward, researchers should also continue to probe the dynamic nature of trait inference and representation [56], and in particular, should incorporate recent insights regarding neural representations of trait information that extend beyond classic two-dimensional models of person perception [57]. Finally, the next wave of research should examine updating across multiple, concentric levels of analysis, such that learning at the level of the individual influences representations of groups, contexts, and environments, in turn.

Conflict of interest statement

Nothing declared.

Acknowledgements

The author's research described within this article was supported by National Science Foundation grant BCS-0823749 (PI: Alexander Todorov) and National Science Foundation grant DGE-1148900 to PM-S.

References and recommended reading

Papers of particular interest, published within the period of review, have been highlighted as:

- •• of outstanding interest
- 1. Todorov A, Olivola CY, Dotsch R, Mende-Siedlecki P: Social attributions from faces: determinants, consequences, accuracy, and functional significance. *Annu Rev Psychol* 2015, 66.
- Uleman JS, Kressel LM: A brief history of theory and research on impression formation. Oxford Handbook of Social Cognition. 2013:53-73.
- Mende-Siedlecki P, Said CP, Todorov A: The social evaluation of faces: a meta-analysis of functional neuroimaging studies. Soc Cogn Affect Neurosci 2013, 8:285-299.
- Mitchell JP, Macrae CN, Banaji MR: Forming impressions of people versus inanimate objects: social-cognitive processing in the medial prefrontal cortex. NeuroImage 2005, 26:251-257.
- Falvello V, Vinson M, Ferrari C, Todorov A: The robustness of learning about the trustworthiness of other people. Soc Cogn 2015, 33:368-386.
- Bliss-Moreau E, Barrett LF, Wright CI: Individual differences in learning the affective value of others under minimal conditions. *Emotion* 2008, 8:479.
- Todorov A, Uleman JS: The efficiency of binding spontaneous trait inferences to actors' faces. J Exp Soc Psychol 2003, 39:549-562.
- Willis J, Todorov A: First impressions: making up your mind after a 100-ms exposure to a face. Psychol Sci 2006, 17:592-598.
- 9. Olivola CY, Funk F, Todorov A: Social attributions from faces bias human choices. *Trends Cogn Sci* 2014, **18**:566-570.
- Mende-Siedlecki P, Cai Y, Todorov A: The neural dynamics of updating person impressions. Soc Cogn Affect Neurosci 2013, 8:623-631.
- Mende-Siedlecki P, Baron SG, Todorov A: Diagnostic value underlies asymmetric updating of impressions in the morality and ability domains. J Neurosci 2013, 33:19406-19415.
- Mende-Siedlecki P, Todorov A: Neural dissociations between
 meaningful and mere inconsistency in impression updating. Soc Cogn Affect Neurosci 2016, 11:1489-1500.

These authors examined whether updating-related activity reflects attributionally meaningful changes in behavior, or mere surprise in response to moment-to-moment inconsistencies. While left ventrolateral prefrontal cortex (vIPFC) and inferior frontal gyrus (IFG) showed preferential responses during updates triggered specifically by immoral behaviors, other regions — including structures associated with expectancy violation (e.g. dACC, PCC) and theory of mind (bilateral TPJ) — were preferentially recruited in response to more moment-to-moment inconsistencies in behavior.

 Baron SG, Gobbini MI, Engell AD, Todorov A: Amygdala and dorsomedial prefrontal cortex responses to appearancebased and behavior-based person impressions. Soc Cogn Affect Neurosci 2010, 6:572-581.

- 14. Cassidy BS, Gutchess AH: Neural responses to appearancebehavior congruity. Soc Cogn 2015, 33:211-226.
- Cloutier J, Gabrieli JD, O'young D, Ambady N: An fMRI study of violations of social expectations: when people are not who we expect them to be. *NeuroImage* 2011, 57:583-588.
- Ames DL, Fiske ST: Outcome dependency alters the neural substrates of impression formation. *NeuroImage* 2013, 83:599-608.
- Bhanji JP, Beer JS: Dissociable neural modulation underlying lasting first impressions, changing your mind for the better, and changing it for the worse. J Neurosci 2013, 33:9337-9344.
- Ma N, Vandekerckhove M, Baetens K, Van Overwalle F, Seurinck R, Fias W: Inconsistencies in spontaneous and intentional trait inferences. Soc Cogn Affect Neurosci 2012, 7:937-950.
- Amodio DM, Frith CD: Meeting of minds: the medial frontal cortex and social cognition. Nat Rev Neurosci 2006, 7:268-277.
- Schiller D, Freeman JB, Mitchell JP, Uleman JS, Phelps EA: A neural mechanism of first impressions. Nat Neurosci 2009, 12:508-514.
- Ferrari C, Lega C, Vernice M, Tamietto M, Mende-Siedlecki P, Vecchi T, Todorov A, Cattaneo Z: The dorsomedial prefrontal cortex plays a causal role in integrating social impressions from faces and verbal descriptions. *Cereb Cortex* 2016, 26:156-165.
- Ferrari C, Vecchi T, Todorov A, Cattaneo Z: Interfering with activity in the dorsomedial prefrontal cortex via TMS affects social impressions updating. *Cogn Affect Behav Neurosci* 2016, 16:626-634.
- Wojciszke B: Morality and competence in person-and selfperception. Eur Rev Soc Psychol 2005, 16:155-188.
- 24. Ybarra O: When first impressions don't last: the role of isolation and adaptation processes in the revision of evaluative impressions. Soc Cogn 2001, 19:491-520.
- Cone J, Ferguson MJ: He did what? The role of diagnosticity in revising implicit evaluations. J Personal Soc Psychol 2015, 108:37.
- Mann TC, Ferguson MJ: Can we undo our first impressions? The role of reinterpretation in reversing implicit evaluations. J Personal Soc Psychol 2015, 108:823.
- Uhlmann EL, Pizarro DA, Diermeier D: A person-centered approach to moral judgment. Perspect Psychol Sci 2015, 10:72-81.
- Wojciszke B, Brycz H, Borkenau P: Effects of information content and evaluative extremity on positivity and negativity biases. J Personal Soc Psychol 1993, 64:327.
- Srull TK, Wyer RS: Person memory and judgment. Psychol Rev 1989, 96:58.
- Stangor C, McMillan D: Memory for expectancy-congruent and expectancy-incongruent information: a review of the social and social developmental literatures. *Psychol Bull* 1992, 111:42-61.
- Hughes BL, Zaki J, Ambady N: Motivation alters impression formation and related neural systems. Soc Cogn Affect Neurosci 2017, 12:49-60.

Participants learned a series of both negative and positive pieces of information about targets described as belonging to either their in-group or out-group (based upon college affiliation). While the amount of negative and positive information was consistent across conditions, participants emerged with more positive evaluations of in-group targets, a bias that was underscored by a failure to engage structures involved in cognitive control (e.g. dIPFC, dACC) and theory of mind (e.g. TPJ). The authors interpret this pattern of results in terms of an 'effortless bias' – we are motivated to maintain goal-consistent attitudes and thus, discount potentially disconfirming information, which would have to be effortfully integrated into existing representations.

 Freeman JB, Schiller D, Rule NO, Ambady N: The neural origins of superficial and individuated judgments about ingroup and outgroup members. *Hum Brain Mapp* 2010, 31:150-159.

- Rilling JK, Sanfey AG: The neuroscience of social decisionmaking. Annu Rev Psychol 2011, 62:23-48.
- Bellucci G, Chernyak SV, Goodyear K, Eickhoff SB, Krueger F: Neural signatures of trust in reciprocity: a coordinate-based meta-analysis. *Hum Brain Mapp* 2017, 38:1233-1248.
- Delgado MR, Frank RH, Phelps EA: Perceptions of moral character modulate the neural systems of reward during the trust game. Nat Neurosci 2005, 8:1611-1618.
- Chang LJ, Doll BB, van't Wout M, Frank MJ, Sanfey AG: Seeing is believing: trustworthiness as a dynamic belief. Cogn Psychol 2010, 61:87-105.
- Kim H, Choi MJ, Jang IJ: Lateral OFC activity predicts decision bias due to first impressions during ultimatum games. J Cogn Neurosci 2012, 24:428-439.
- Stanley DA, Sokol-Hessner P, Fareri DS, Perino MT, Delgado MR, Banaji MR, Phelps EA: Race and reputation: perceived racial group trustworthiness influences the neural correlates of trust decisions. Philos Trans R Soc Lond B: Biol Sci 2012, 367:744-753.
- **39.** Fareri DS, Chang LJ, Delgado MR: **Effects of direct social experience on trust decisions and neural reward circuitry**. *Front Neurosci* 2012, **6**.
- Fareri DS, Chang LJ, Delgado MR: Computational substrates of social value in interpersonal collaboration. J Neurosci 2015, 35:8170-8180.
- 41. Fouragnan E, Chierchia G, Greiner S, Neveu R, Avesani P, Coricelli G: **Reputational priors magnify striatal responses to** violations of trust. *J Neurosci* 2013, **33**:3602-3611.
- 42. Hackel LM, Doll BB, Amodio DM: Instrumental learning of traits
 versus rewards: dissociable neural correlates and effects on choice. *Nat Neurosci* 2015, 18:1233-1235.

These authors devised a novel task to simultaneously examine traitbased and reward-based learning instrumental learning. Computational modeling revealed that participants' choices were driven by both trait and reward information, but that participants relied more heavily on traits. Moreover, even in this highly parameterized task, trait-based instrumental learning was associated with activity in areas previously linked to social impression updating.

- Stanley DA: Getting to know you: general and specific neural computations for learning about people. Soc Cogn Affect Neurosci 2015, 11:525-536.
- 44. Kumaran D, Banino A, Blundell C, Hassabis D, Dayan P:
- Computations underlying social hierarchy learning: distinct neural mechanisms for updating and representing selfrelevant information. *Neuron* 2016, **92**:1135-1147.

In an effort to understand the neural computations supporting updating representations of one's own position in a social hierarchy, these authors pit two models against each other: a reinforcement-learning model versus a Bayesian inference scheme. The Bayesian inference scheme was ultimately a better fit for both behavioral and neural indices of updating.

Moreover, mPFC activity subserved updating of one's own hierarchical position, while amygdala and hippocampus were involved in domaingeneral rank coding.

- Ligneul R, Obeso I, Ruff CC, Dreher JC: Dynamical representation of dominance relationships in the human rostromedial prefrontal cortex. *Curr Biol* 2016, 26:3107-3115.
- 46. Tavares RM, Mendelsohn A, Grossman Y, Williams CH, Shapiro M,
 Trope Y, Schiller D: A map for social navigation in the human brain. *Neuron* 2015. 87:231-243.

Participants interacted with and learned about other people in the context of a role-playing game. The authors observed that updating representations of in-game relationships was captured by a two-dimensional model of social space, encompassing power and affiliation. In turn, movement through this space was predicted by hippocampal activity, and this relationship was moderated by self-reported social skills.

- Zaki J, Kallman S, Wimmer GE, Ochsner K, Shohamy D: Social cognition as reinforcement learning: feedback modulates emotion inference. J Cogn Neurosci 2016, 28:1270-1282.
- Leong YC, Zaki J: Unrealistic optimism in advice taking: a computational account. J Exp Psychol: Gen 2018, 147:170-189.
- Diaconescu AO, Mathys C, Weber LA, Kasper L, Mauer J, Stephan KE: Hierarchical prediction errors in midbrain and septum during social learning. Soc Cogn Affect Neurosci 2017, 12:618-634.
- Spiers HJ, Love BC, Le Pelley ME, Gibb CE, Murphy RA: Anterior temporal lobe tracks the formation of prejudice. J Cogn Neurosci 2017, 29:530-544.
- 51. Hackel LM, Zaki J: Propagation of economic inequality through reciprocity and reputation. *Psychol Sci* 2018, **29**:604-613.
- 52. Amodio DA, Ratner KG: A memory systems model of implicit social cognition. *Curr Dir Psychol Sci* 2011, 20:143-148.
- Wang U, Collins JA, Koski J, Nugiel T, Metoki A, Olson IR: Dynamic neural architecture for social knowledge retrieval. Proc Natl Acad Sci U S A 2017, 114:E3305-E3314.
- Brannon SM, Gawronski B: A second change for first impressions? Exploring the context-(in)dependent updating of implicit evaluations. Soc Psychol Personal Sci 2017, 8:275-283.
- 55. Weisbuch M, Ivcevic Z, Ambady N: On being liked on the web and in the "real world": consistency in first impressions across personal webpages and spontaneous behavior. *J Exp Soc Psychol* 2009, **45**:573-576.
- Stolier RM, Hehman E, Freeman JB: A dynamic structure of social trait space. Trends Cogn Sci 2018, 22:197-200.
- 57. Thornton MA, Mitchell JP: Theories of person perception predict patterns of neural activity during mentalizing. *Cereb Cortex* 2017 http://dx.doi.org/10.1093/cercor/bhx216.