

Behavioral Landmarks: Inferring Interactions from Data

Marilena Lemonari¹, Panayiotis Charalambous², Andreas Panayiotou^{1,2}, Yiorgos Chrysanthou², Julien Pettré³ ¹University of Cyprus, ²CYENS – Centre of Excellence, ³Inria, Univ Rennes, CNRS, IRISA

Contact: lemonari.marilena@ucy.ac.cy

OBJECTIVE & RELATED WORK

We aim to understand how agents move according to environmental cues e.g., timed events and area constraints. So far, there were several attempts to infer simulation parameters from trajectories ([KSH*12, KSHG18, WJGO*14]). However, our attention is on *complex behaviors*, not limited to navigation parameters e.g.., *people in a train station also interact with vending machines and shops, apart from just going from the entrance to the train.* This knowledge implies the distribution of simulation parameters in a spatially and temporally discretized environment.



PROPOSITION

We attempt to understand agent-environment interactions by disentangling trajectory images into combinations of basic behaviors i.e., pre-defined Interaction Fields ([CvTH*20]), thus knowing how agents move in *space* and *time*.



TERMINOLOGY

We define points of environment-driven behavior changes as "Landmarks", distinguishing as temporal/spatial, based on the reason of change i.e., temporal switch or entering another area.



Annotated Environment

CASE STUDIES

Park Sketch



 T=4
 T=5

 Wander
 Timed termis

 T=4
 T=3

CYENS (nría cligo

ed Environmen

Synthesia

We conduct scenario-specific case studies for plausibility. We collect 5 sketches from an experienced and an inexperienced user. We apply our model, yielding discretization that suggests a new synthesized environment.



PIPELINE



We design a model to detect the existence and type of landmarks, and train on synthetic trajectory images simulated using Interaction Fields and UMANS ([CvTH*20, vTGG*20]).





- The detector finds the location of spatial and temporal landmarks.
- Given the detection of uniform behavior, we train an *identifier* to find the behavior from the set of predefined bases.
- Given the detection of temporal landmark, we train a *temporal classifier* to find the time of the switch.
 Detector Auxiliary Model





Identifier "Circle Around"



²User Control

- Users can arbitrarily sketch crowd flow(s); our interface is built to comply with the training data.
- The detector finds the landmarks; heuristically discretizing the environment spatially, and the classifier finds the time switches discretizing temporally.

We obtain temporal and spatial landmark sketch prefabs, which we distribute guided by the synthesized environment, hence authoring a new simulation with different flows based on the behavior areas implicitly defined by the user.



FUTURE WORK

We aim to improve the generalizability of our framework by training on data from multiple-sized patches and strengthen the evaluation of our framework starting by evaluating on real data, even though it is difficult to obtain the respective ground truths.

It is also interesting to extend this framework to investigate social interactions between agents, and specified environment-agent interactions e.g., ticket machines. Understanding social and environment interactions, and obtaining a way to replicate them, will enable behavior analysis and authoring of novel crowds.

REFERENCES

[CvTH+20] COLAS A., VAN TOLL W., HOYET L., PACCHIEROTTI C., CHRISTIE M., ZIBREK K., OLIVIER A.-H., PETTRÉ J.: Interaction fields: Sketching collective Behaviors. In MIG 2020: Motion, Interaction, and Games (2020). 1

[KSH*12] KAPADIA M., SINGH S., HEWLETT W., REINMAN G., FALOUTSOS P.: Parallelized egocentric fields for autonomous navigation. The Visual Computer 28 (2012), 1209–1227. 1 [KSHG18] KARAMOUZAS I., SOHRE N., HU R., GUY S. J.: Crowd space: a predictive crowd analysis technique. ACM Transactions on Graphics (TOG) 37, 6 (2018), 1–14. 1

VTGG+20] VAN TOLL W., GRZESKOWIAK F., GANDÍA A. L., AMIRIAN J., BERTON F., BRUNEAU J., DANIEL B. C., JOVANE A., PETTRÉ J.: Generalized microscropic crowd simulation using costs in velocity space. In Symposium on Interactive 3D Graphics and Games (2020), pp. 1–9. 2

[WJGO*14] WOLINSKI D., J. GUY S., OLIVIER A.-H., LIN M., MANOCHA D., PETTRÉ J.: Parameter estimation and comparative evaluation of crowd simulations. In Computer Graphics Forum (2014), vol. 33, Wiley Online Library, pp. 303–312. 1



ACKNOWLEDGEMENTS



This work has received funding from the European Union's Horizon 2020 research and innovation programme under the Marie Skłodowska Curie grant agreement No 860768 (CLIPE project).