Quantifying co-evolution of socio-economic activities with geo-historical data

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 \rightarrow Contemporary intra-urban dynamics are better and better characterised through the emergence of urban data and urban analytics [Kandt and Batty, 2021]; more difficult with past dynamics.

 \rightarrow Interdisciplinary approaches to the modeling of settlement systems transitions: qualitative or very sparse data, stylised models (Transmondyn project) [Sanders, 2018]

 \rightarrow Stylised models for systems of cities on long time scales [Pumain and Reuillon, 2017]

 \rightarrow Difficulty to build geo-historical data: geocoding [Cura et al., 2018], vectorisation [El Gouj et al., 2022]

 \rightarrow Multi-dimensionality of urban systems is one aspect of their complexity, strongly present in the co-evolution of economic activities locations.

 \rightarrow Understanding past processes better inform urban theories and models for future sustainable planning.

Research objective of this contribution (partly WP3):

Use geo-historical data to quantify the co-evolution of economic activities in Paris during the 19th century; methodological aspects on the issues linked to the exploitation of such data.

LISTE GÉNÉRALE ADRESSES DE PARIS,

ET DES PRINCIPAUX ÉTABLISSEMENTS DE CETTE CAPITALE.

Abadie, prehitoeto, Marais-du-Temple, 60. Abadie (P.), peintre, Faub, -St-Martin, 56. Abadie, tabac, Menilmentant, 122. Abadie , taillear, Bons-Enfants, 26. Abancourt (Vte d'), C. & , poir , présid. à la cour des comptes, Assas, 3 bis. Abancourt (Vto) 48 , messager d'Etat , Cornei le, 5. Abaffeirs : Grenello, - Ménilmontant, -Miroménil. --- Montmartre. --- Villejnif. Abault. charpentier, Corbenn, 15. Abazaer et Cie, commiss., Petites-Ecuries, 24. Abbadie (H.), pharmaciea, Stc-Appoline, 23 35. Abbat, tailleur, St-Honoré, 262 Abbatucci Ø, député, Caumartin, 41. Abbatucci Ø, député, Caumartin, 41. cursale de St-Thomas-d'Aquin , Sevres, 16. Abb-spe (1'), prison militaire, pl. Ste-Margaerite_St.Germ Abbey (John), fact. d'orgues, Faub.-Poissonnière, 40. Abeil, vicaire général honoraire, St-Louis-en-1'De, 22. Abeillo, propriét. , Basse-da-Rempart, 36. Abel, coutelier, Paradis-Poissonnière, 51. Abel, tapissier, Colysée, 10, Abel, tailleur, Notre-Dame-de-Loretty, 25. Abel-Laroche, papet. fine, dessins, peintures, tableaux, Hapoyre, 5.

Abel de l'ujol \$ (de l'Institut), peintre d'hist., Albony, 18

Acart, libraire, Cassette, 23. Adam (H.), peintre, Matigaon, 3. Accault et Gallepie, pharmaciens, Paix, 19. Adam, peint. vitr., St-Germain-dez-Prés. 3. Adam , plåtrier et magon , Descartes , 24. Accouchements (école et maison d'), Bourbo, 3. Acerro alné , commiss. en quinc., Charlot, 41. Adam (H. E.), propr. , Nve-des-Petits-Ch., 6. Adam, satineur, quai des Augustins, 55. Achard, ébéniste, Moreou, 62. Achard, glaceur de papier, St-Saureur, 30. Achard , bitel du Due de Clarence, Grenelle-Adam, tabac, Novers, 10, St-Germain, 26. Achard (Ch.), lapidaire, Palais-Royal, galerie Montpensier, 23, et rue Montpensier, 18. Ac ard(J.-P.), jeaillier, Monnaše, 11. Achard, meubles, Bourbon-Villeneuve, 57. Achard, meubles, Ste-Appoline, 22. Achard, fab. de parapluies, enclos de la Tri-Achard Mme), fab. de poupées, St-Martin, 217. Achart et Cie, épuration de literie, Boaurepaire, 13 [4]. Acheniq, lapidaire, Pastourelle, 24. Achilles Guillaume (\$, caissier de la compagnie du chemin de fer de St-Etienne à Lyon, Lille, 105. Acivr. conteller. Ecrivaias, 3. Ackermann, sellier, Faub, -St-Denis, 53. Acklin, herberiste, OrleanseSt-Marcel, 28. Arloque fils, avocat, Condé, 10. Acudon alné, cordier et march. de chanvre, Ferronnerie, 27. Acquary Kervers, ancien notaire , boul. Poissennière, 14.

Acres (Baronne des), Bac, 36 bis.

Adam, tourneur sur métaux, Henry, 2, Adam, vins, Prouvaires, 22. Adam of Lespart, layetions, Quincampoix, 64 [5] Adam-Zellers, serrur. en voit. , Cadet, 20. Adamini, peintre-vitrier, Faub. -Saint-Denis, 105 lis Adde, iardinier-fleuriste, pl. de la Madeleine, Adde, libraire, bouley. Poissonnière, 17. Addo-Margras, med., Faub,-Poissonnière, 4. Adde, prof. au collège Henri IV, Copenu, Addener (R. F.), prop. , Bretagne, 6. Addes jeune, maçon-plåtrier, Jour, 4. Adelino, prop. , Victoire, 4. Adeline, rouennerie, St-Martin, 145. Adelmann, gardien des collections à l'Ecole des Mines, Enfer, 34. Adelon @, médecin, Four-St-Germain, 47. Adelswaerd (baron G. d'), scorétaire à la légation de Suède, Aniou-St-Honoré, 58, Adelt (Mme), lingeries, St-Martin, 179 Adeais de la Roserie, Borgère, 2.

Adam, sons-chef à l'enregiste., Gros-Chenet, 9,

Adet de Roseville, médecin, Paradis-Poiss,

Several commercial economic activities repertoires, archived and digitalised: cf previous seminars.

Processing by other WPs of the SoDUCo project:

- Document segmentation, OCR
- Named Entity Recognition to extract names. adresses. activities
- Historical geocoding

 \rightarrow Work on *Didot-Bottin*. covering most of 19th century (to avoid multi-source bias for now)

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 \rightarrow Data covering 1857-1908: 4,218,048 entries, 80.32% with coordinates and a defined activity.

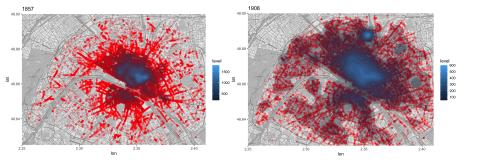
 \rightarrow Natural Language Processing: stop-words removal and stemming to descriptions of activities.

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 \rightarrow Stems with more than 100 occurrences (996) coded for broad activities (food, craftsmanship, art and literature, health, law and governance, service, teaching)

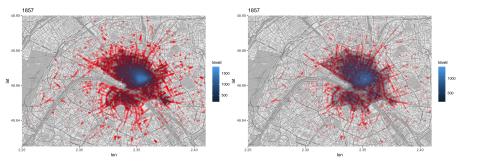
 \rightarrow 1,990,222 entries with coordinates and classified activities

Location of activities



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Location of activities



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Left: craftsmanship; Right: food.

Objects: Cities and territories (*Evolutionary Urban Theory* [Pumain, 2018]) co-evolving with transport networks (*Territorial Theory of Networks* [Dupuy, 1987])

Processes:

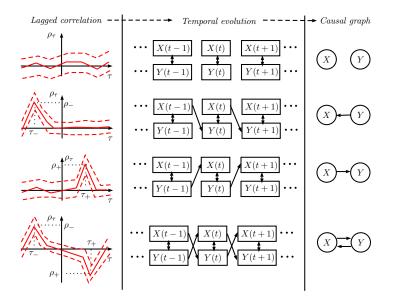
A multi-level definition of co-evolution:

- agents level
- agent populations level (niches)
- global system level
- Corresponding approaches:
 - Empirical approach (microscopic level)
 - Ø Morphogenesis approach (niche level)
 - Seventionary theory approach (global level)

Raimbault, J. (2019). Modeling interactions between transportation networks and territories: a co-evolution approach. arXiv preprint arXiv:1902.04802.

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Method to characterise co-evolution



Raimbault, J. (2017). Identification de causalités dans des données spatio-temporelles. In Spatial Analysis and GEOmatics 2017.

 \rightarrow Activity counts $N_{a,r}$ within raster cells: 10x10 grid to split the covered area into zones.

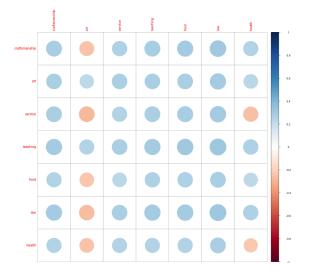
ightarrow Variation of activity counts in time $\Delta N_{a,r}(t) = N_{a,r}(t+\Delta t) - N_{a,r}(t)$

 \rightarrow Lagged correlations in time between activities

$$\rho_{a_1,a_2}(\tau) = \rho \left[\Delta N_{a_1,r}(t), \Delta N_{a_2,r}(t-\tau) \right]$$

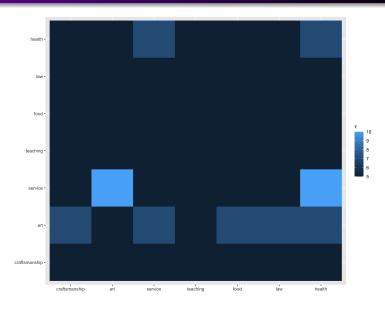
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Results: lagged correlations



Optimal lagged correlations between variations of activity counts

Results



Corresponding delays

 \rightarrow Micro insights into historical intra-urban economic processes.

 \rightarrow Existence of a co-evolution between some activities (circular causality in location dynamics).

 \rightarrow In discussion with historians in the project: capture qualitative knowledge (e.g. "fabrique urbaine")?

Current and future work:

 \rightarrow Sensitivity analysis to classification, meta-parameters; null model with random activities.

 \rightarrow Endogenous spatial neighbourhoods to estimate correlations, using a GWR-like approach [Brunsdon et al., 1998]; temporal moving-window.

 \rightarrow Benchmark of methods to measure co-evolution (instrumental variables, causal machine learning, transfer entropy).

 \rightarrow Geo-historical data is new data; quantification of past intra-urban processes; many consistence and processing issues.

 \rightarrow Opening for interdisciplinary discussions and collaborations: actual new knowledge and its validation depends on disciplines.

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Models and results open at https://github.com/JusteRaimbault/HistoricalData

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