

Copula 熵的多学科应用

马健 博士

majian03@gmail.com

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Copula 熵

- Jian Ma and Zengqi Sun. Mutual information is copula entropy. *Tsinghua Science & Technology*, 16(1):51–54, 2011. See also arXiv preprint arXiv:0808.0845 (2008).

$$H_c(\mathbf{x}) = - \int_{\mathbf{u}} c(\mathbf{u}) \log c(\mathbf{u}) d\mathbf{u}.$$

综述论文

- 马健 . Copula 熵：理论和应用 . ChinaXiv:202105.00070, 2021.

统计独立性是统计学和机器学习领域的基础性概念，如何表示和度量统计独立性是该领域的基本问题。Copula 理论提供了统计相关关系表示的理论工具，而 Copula 熵理论则给出了度量统计独立性的概念工具。本文综述了 Copula 熵的理论和应用，概述了其基本概念定义、定理和性质，以及估计方法。介绍了 Copula 熵研究的最新进展，包括其在统计学的六个基本问题（结构学习、关联发现、变量选择、因果发现、域自适应和正态性检验等）上的理论应用。讨论了前四个理论应用之间的关系，以及其对应的深层次的相关性和因果性概念之间的联系，并将 Copula 熵的（条件）独立性度量框架与基于核函数和距离相关的同类框架进行了对比。简述了 Copula 熵在理论物理学、理论化学、化学信息学、水文学、气候学、气象学、环境学、生态学、动物形态学、农学、认知神经学、运动神经学、计算神经学、心理学、系统生物学、生物信息学、临床诊断学、老年医学、精神病学、公共卫生学、经济学、管理学、社会学、教育学、计算语言学、新闻传播学、法学、政治学、军事学，以及能源工程、食品工程、土木建筑、交通工程、制造工程、可靠性工程、化学工程、航空航天、车辆工程、电子工程、通信工程、高性能计算、测绘工程和金融工程等领域的实际应用。

理论物理学

- 相关粒子系统
 - 平衡态相关粒子系统中熵的推导和计算 [Ma2021b]

理论化学

- 变构效应研究
 - 变构效应配位点和激活点热力学耦合模型 [Cudndet2016]
 - 丙氨酸二肽的 C 端和 N 端

化学信息学

- 分子设计
 - 设计具有特定属性的分子结构 [Wieser2020]
 - 有机分子属性 QM9 数据库

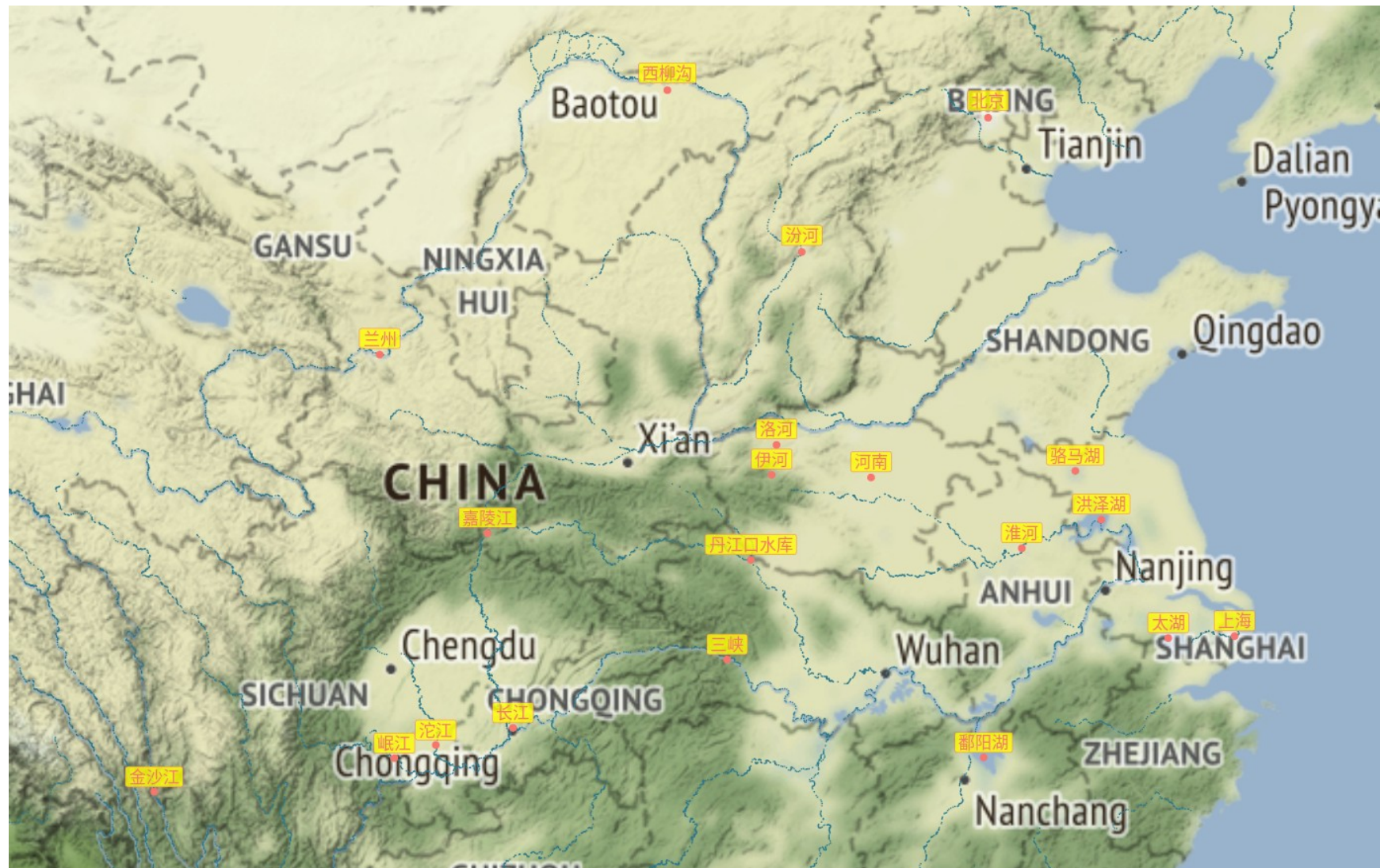
水文学（1）

- 洪水预报
 - 金沙江流域洪水预报 [Chen2013, Chen2014]
- 河流相关性
 - 长江上游河段（金沙江、岷江、沱江、嘉陵江）相关性 [Chen2019]
- 水沙关系分析
 - 黄河西柳沟河流域径流量和输沙量数据分析 [Qian2022]
- 干旱研究
 - 黄河流域（河南和甘肃）干旱分析和预测 [温 2019, Huang2019, 黄 2021b]
 - 印度达布蒂（Tapti）河流域干旱指数设计 [Kanthavel2022]
 - 伊朗城市（扎黑丹、恩泽利和马什哈德）干旱数据分析 [Mohammadi2021]
- 水文事件风险建模
 - 黄河流域干旱事件识别 [Ni2020]
- 中长期径流预报
 - 长江上游水文站月径流预测 [Li2022]
 - 南水北调工程丹江口水库入库径流预报 [黄 2021]
 - 洪泽湖和骆马湖长期径流预报 [Mo2023]

水文学（2）

- 水文观测网络选址和优化
 - 上海雨量观测网 [Xu2017]
 - 伊洛河流域水文观测网 [王 2019]
 - 汾河流域观测网 [Li2020]
 - 北京市区水文观测网 [Li2020]
 - 太湖盆地流域雨量观测网 [Li2020]
 - 淮河流域雨量观测网 [徐 2022]
 - 美国查克托哈奇（Choctawhatchee）河流域水文观测网 [杨 2019]
- 流域分区
 - 鄱阳湖流域 [刘 2022]
- 多站点径流生成
 - 巴西雅瓜拉比 - 大都市水库系统 [Porto2021]

水文学 - 国内应用地图



气候学

- 气候变化对水文气象变量相关性的影响
 - 美国德州达拉斯地区降水和气温相关性关系分析 [Hao2015]
 - 达拉斯市沃斯堡（Fort Worth）地区降水和气温观测数据
- 气候评估
 - 欧洲城市气候分类 [Condino2009]
 - 欧洲 25 座城市气温和降水数据

气象学

- 大气污染气象成因分析
 - 北京地区气象因素对 PM2.5 浓度的因果关系分析 [Ma2019a]
 - 北京地区 PM2.5 和气象观测数据
 - 上海和广州大气污染预测预警 [Wang2022]
 - 上海和广州 PM2.5 和气象观测数据
- 气象灾害预测
 - 广西地区台风灾情预测 [陈 2019]
 - 广西地区台风灾害数据

环境学

- 大气污染传播路径分析
 - 兰州市大气污染传播路径预测 [吴 2022]
 - 兰州市环境气象检测网络 2017 年 PM2.5 观测数据
- 火电厂排放污染物管控
 - 火电厂氮氧化物排放浓度预测 [金 2023]
 - 宁夏某燃煤电厂运行数据

生态学

- 动物运动轨迹分析
 - Cylcop 算法包 [Hodel2021]

动物学

- 动物形态学
 - 鱼类形态相似度研究 [Escolano2017]
 - GatorBait 海洋鱼类外形数据库
 - 鲍鱼生长过程的形态学研究 [Purkayastha2022]
 - UCI 鲍鱼数据集

农学

- 作物产量预测
 - 气候变化对我国南方两季稻产量的影响及对策 [Zhang2023]
 - 南方（江南和华南） 54 个地点未来气候变化数据和作物数据

神经科学

- 认知神经学
 - 分析大脑认知活动的多模态数据 [Kayser2015, Ince2016, Ince2017, Combrisson2022]
 - 人脸检测任务 EEG 数据
 - 听觉语音刺激任务 MEG 数据
 - 认知行为映射任务 MEG 数据
 - 奖惩学习任务前脑岛 (anterior Insula) S EEG 数据
 - 语音信息的编码和解析 [DeClercq2022]
 - 故事讲述语音及相应的 EEG 数据
 - 因果关系脑连接网络分析 [Redondo2023, 汪 2023]
 - 注意缺陷多动障碍患者 EEG 数据
 - 葡萄牙老年人静息态 fMRI 数据
- 运动神经学
 - 分析运动的肌肉组合协同策略 [吴 2021, Wu2022a, Reilly2022, Zhu2022, 金 2022]
 - 伸手运动时肌肉 sEMG 数据
 - 自主运动肌肉疲劳状态 sEMG 数据
- 计算神经学
 - 神经元可塑性建模 [Leugering2018]
 - 神经网络信息传输关系分析 [Parman2021]

心理学

- 生物心理学
 - 情绪刺激下心跳诱发脑电位的时间交互现象 [Ravijts2019]
 - 用于情绪分析的生理信号 DEAP 数据集

生物学

- 系统生物学
 - 生物信号调控和传导 [Charzynska2015]
 - 癌症分子机制数据
 - 生物现象动态网络结构和功能 [Farhangmehr2013]
 - 酵母细胞周期数据
- 生物信息学
 - 分析基因数据，研究生命和疾病机理 [Wieczorek2016]
 - 肝炎病毒感染治疗基因表达谱数据
 - 筛选与癌症有关的变异基因 [Wu2022b]
 - cBioPortal 癌症基因组数据
 - 亚利桑那州立大学癌症基因组数据

医学（1）

- 临床医学
 - 心脏病诊断 [Ma2021a]
 - UCI 心脏病数据
 - 糖尿病病情管理 [Mesiar2021]
 - 美国 Health Facts 糖尿病救治网络数据
 - 癌症预后 [Ma2022b]
 - UCI 肺癌数据
 - 白内障术后角膜水肿风险预测 [Luo2023]
 - 临床白内障超声乳化手术患者数据
 - 主动脉瓣置换手术射血分数分析 [Sunoj2023]
 - 临床主动脉瓣置换手术前后射血分数数据
- 认知医学
 - 认知能力评估 / 痴呆症筛查 [Ma2019b]
 - 北京和天津痴呆症老年人数据

医学（2）

- 运动医学
 - 运动能力评估 / 跌倒风险预测 [Ma2020a, Ma2020b, Ma2022]
 - 天津和成都跌倒人群老年人数据
 - 重复经颅磁刺激对帕金森病改善神经机制分析 [李 2023]
 - 帕金森患者经颅磁刺激前后 EEG 数据
- 精神病学
 - 抑郁症患者识别 [张 2022a]
 - 江苏常州抑郁症青少年患者 EEG 数据

公共卫生学

- 新冠肺炎流行病 (COVID19)
 - 发热症状疑似病人筛查诊断 [Mesiar2021]
 - 新冠临床数据
- 高血压
 - 高血压关联基因研究 [Purkayastha2022]
 - ELEMENT 数据集

社会科学（1）

- 经济学

- 扶贫政策效果评估，用于政策目标人口鉴别 [Shan2020, 罗 2022]
 - 2018 年政府贫困家庭状况普查数据（四川省）
- 议价机制中的互惠行为和时间效应 [Bossemeyer2021]
 - eBay 的 Best Offer 平台数据
- 产业链内部相关性分析 [韦 2021]
 - 国内畜禽养殖产业链主要上市企业股票价格数据
- 投资者情绪分析 [Han2022]
 - 中国新能源汽车上市公司的百度搜索数据

- 管理学

- 商品期货价格预测 [An2023]
 - 国家统计局猪肉价格数据和大连商品交易所大豆期货价格数据
- 单周期库存管理 [Tian2023]
 - 大众朗逸汽车销售数据

社会科学（2）

- 社会学
 - 分析教育、职业和收入上的性别不平等问题 [Ma2022a]
 - 美国国家成年人收入调查数据（1994 年）
- 教育学
 - 高中数学成绩与其他学科成绩相关性分析 [柳 2018]
 - 某市 2013 级理科学生高一、高二期末成绩和高三两次模考成绩
- 计算语言学
 - 城市热线派单系统知识图谱构建 [陈 2023]
 - 济南市民热线数据
- 新闻传播学
 - 上海新冠疫情下的公众情绪变化 [Zhang2022]
 - 微博平台“上海疫情”主题数据

社会科学（3）

- 法学
 - 社区属性与社区犯罪关系分析 [Wieser2020]
 - 美国社区与犯罪数据集
- 政治学
 - 分析政权领导力因素和政权危机之间关系 [Card2011]
 - 雪城大学莫伊尼汉全球事务研究所国际政治领导力数据集
- 军事学
 - 目标意图识别 [张 2022b]
 - 空中飞行目标示例

工程 (1)

- 能源工程
 - 能源网络管理，研究天气因素与能源网络的耦合 [Fu2017]
 - 北方某地区能源系统运行数据
 - 光伏发电功率预测 [朱 2022a]
 - 澳大利亚 Yulara 地区光伏电站数据
 - 风电机组工况划分 [崔 2022]
 - 广东某海上风电场 SCADA 数据
 - 电力负荷预测 [Ma2023]
 - 摩洛哥缔头万城电力消费数据
 - 风光储协同规划 [董 2022]
 - 某工业园区风光火储联合发电系统
 - 电网频率稳定性预测 [Liu2022]
 - 贵州电网数据
 - 电力系统宽频振荡影响因素和传播路径分析 [冯 2022]

工程 (2)

- 能源工程
 - 用户线损贡献分析 [Hu2022]
 - 辽宁电网数据
 - 电价预测 [Xiong2022]
 - 2017 年美国 PJM 电力市场电价数据
 - 锂电池容量估计 [Hu2023a]
 - NASA 锂电池退化数据
- 食品工程
 - 葡萄酒质量与理化成分关系分析 [Lasserre2021,Lasserre2022]
 - 葡萄牙绿酒葡萄酒理化成分与质量评价数据
- 土木建筑
 - 建筑能源系统节能技术 [Li2022]
 - 大连某教学楼供热监测数据
 - 工程变形监测 [Cao2023]
 - 某隧道工程施工段围堰监测数据

工程 (3)

- 交通工程
 - 大件货物运输方案制定 [黄 2021c]
 - 大件货物运输案例数据
 - 航空和高铁票价影响因素分析 [许 2023]
 - 京沪高铁和航空票价数据
- 制造工程
 - 制造质量管理, 研究优化制造过程参数, 预测产品质量 [Sun2021]
 - 富士康生产线制造过程数据
 - 装配质量控制 [王 2015]
 - 江淮汽车某型汽油发动机关键零部件装配过程数据
 - 工业过程故障监测 [Dong2023]
 - 鞍钢热轧带钢工艺过程数据
 - 钢铁工艺过程碳排放预测 [Hu2023b]
 - 某钢铁厂烧结过程数据

工程 (4)

- 可靠性工程
 - 系统退化过程建模 [Sun2019]
 - 微波电子组件数据
 - 风电机组健康状态评估 [齐 2019]
 - 内蒙古某风场的风机 SCADA 数据
- 化学工程
 - 化学过程故障监测和诊断 [Yin2022, Wei2022]
 - Tennessee Eastman 过程数据
 - 化工过程因果网络构建 [Bi2023]
 - 连续搅拌槽式反应器数据和 Tennessee Eastman 过程数据
- 电子工程
 - 集成电路封装材料物理性能预测 [刘 2022]
 - CuNi 合金体系材料强度和稳定性计算数据

工程 (5)

- 航空航天
 - 飞行器总体参数分析和优化 [Krishnankutty2020]
 - 美国喷气战斗机总体设计参数数据
 - 卫星在轨健康状态监测 [Liu2022, Zeng2022]
 - 真实卫星遥测数据
 - NASA 公开的 SMAP 和 MSL 数据集
 - 机场间航班延误因果关系分析 [吴 2020]
 - 民航信息系统
- 车辆工程
 - CAN 总线入侵检测 [Gao2023]
 - 现代汽车 YF 索纳塔 CAN 数据

工程 (6)

- 通信工程
 - 通讯网络加密技术研究 [Wang2016]
 - 6G 网络语义通信技术研究 [傅 2023]
 - ImageNet-1k 数据集和 VOC2012 数据集
- 高性能计算
 - 高性能计算能源效率优化 [Gocht-Zech2022]
- 测绘工程
 - 高光谱遥感数据分析 [Zeng2009]
 - 美国印第安纳 Indian Pine 高光谱遥感数据

金融工程

- 量化金融工具箱 MLFinLab
 - Hudson and Thames Quantitative Research [Hudson2021]
 - 非线性相关分析算法
- 投资组合优化
 - 股票资产相关性网络分析 [Wang2015]
 - 沪深 A 股指数、沪深 300 指数数据
 - ST 股票分类 [朱 2022b]
 - A 股市场 ST 股票数据
- 金融问题建模
 - Copula 函数模型选择 [Calsaverini2009]
 - 标普 500 指数数据
- 股票相关性建模
 - R-vine copula 结构建模 [Alanazi2021]
 - 德国 DAX 指数数据
- 信用风险评价
 - 信用风险卡模型建立 [孔 2021]
 - 信用卡客户数据



参考文献

- [Chen2013] Lu Chen, Vijay P. Singh, and Shenglian Guo. Measure of correlation between river flows using the copula-entropy method. *Journal of Hydrologic Engineering*, 18(12):1591–1606, 2013.
- [Chen2014] Lu Chen, Vijay P. Singh, Shenglian Guo, Jianzhong Zhou, and Lei Ye. Copula entropy coupled with artificial neural network for rainfall–runoff simulation. *Stochastic Environmental Research and Risk Assessment*, 28(7):1755–1767, 2014.
- [Ni2020] Lingling Ni, Dong Wang, Jianfeng Wu, Yuankun Wang, Yuwei Tao, Jianyun Zhang, Jiufu Liu, and Fei Xie. Vine copula selection using mutual information for hydrological dependence modeling. *Environmental Research*, 186:109604, 2020.
- [Xu2017] Pengcheng Xu, Dong Wang, Vijay P. Singh, Yuankun Wang, Jichun Wu, Lachun Wang, Xinqing Zou, Yuanfang Chen, Xi Chen, Jiufu Liu, Ying Zou, and Ruimin He. A two-phase copula entropy-based multiobjective optimization approach to hydrometeorological gauge network design. *Journal of Hydrology*, 555:228–241, 2017.
- [Li2020] Heshu Li, Dong Wang, Vijay P. Singh, Yuankun Wang, Jianfeng Wu, Jichun Wu, Ruimin He, Ying Zou, Jiufu Liu, and Jianyun Zhang. Developing a dual entropy-transinformation criterion for hydrometric network optimization based on information theory and copulas. *Environmental Research*, 180:108813, 2020.
- [Porto2021] Victor Costa Porto, Francisco de Assis de Souza Filho, Taís Maria Nunes Carvalho, Ticiana Marinho de Carvalho Studart, and Maria Manuela Portela. A GLM copula approach for multisite annual streamflow generation. *Journal of Hydrology*, 598:126226, 2021.
- [Ma2019a] Jian Ma. Estimating transfer entropy via copula entropy. arXiv preprint arXiv:1910.04375, 2019.
- [Hodel2021] Florian H. Hodel and John R. Fieberg. Cylcop: An R package for circularlinear copulae with angular symmetry. *bioRxiv*, page 2021.07.14.452253, 2021.
- [Wieser2020] Mario Wieser, Sonali Parbhoo, Aleksander Wieczorek, and Volker Roth. Inverse learning of symmetries. In *Advances in Neural Information Processing Systems*, volume 33, pages 18004–18015, 2020.
- [Ince2017] Robin A.A. Ince, Bruno L. Giordano, Christoph Kayser, Guillaume A. Rousselet, Joachim Gross, and Philippe G. Schyns. A statistical framework for neuroimaging data analysis based on mutual information estimated via a gaussian copula. *Human Brain Mapping*, 38(3):1541–1573, 2017.
- [Ince2016] Robin A. A. Ince, Katarzyna Jaworska, Joachim Gross, Stefano Panzeri, Nicola J. van Rijsbergen, Guillaume A. Rousselet, and Philippe G. Schyns. The deceptively simple N170 reflects network information processing mechanisms involving visual feature coding and transfer across hemispheres. *Cerebral Cortex*, 26(11):4123–4135, 2016.
- [Kayser2015] Stephanie J. Kayser, Robin A.A. Ince, Joachim Gross, and Christoph Kayser. Irregular speech rate dissociates auditory cortical entrainment, evoked responses, and frontal alpha. *The Journal of Neuroscience*, 35(44):14691–14701, 2015.
- [Leugering2018] Johannes Leugering and Gordon Pipa. A unifying framework of synaptic and intrinsic plasticity in neural populations. *Neural Computation*, 30(4):945–986, 2018.
- [Parman2021] Ari Pakman, Amin Nejatbakhsh, Dar Gilboa, Abdullah Makkeh, Luca Mazzucato, Michael Wibral, and Elad Schneidman. Estimating the unique information of continuous variables in recurrent networks. *Advances in Neural Information Processing Systems*, 2021.
- [Charzynska2015] Agata Charzyńska and Anna Gambin. Improvement of the k-NN entropy estimator with applications in systems biology. *Entropy*, 18(1):13, 2015.

参考文献

- [Farhangmehr2013] Farzaneh Farhangmehr, Daniel M. Tartakovsky, Parastou Sadatmousavi, Mano R. Maurya, and Shankar Subramaniam. An information-theoretic algorithm to data-driven genetic pathway interaction network reconstruction of dynamic systems. In 2013 IEEE International Conference on Bioinformatics and Biomedicine, pages 214–217, 2013.
- [Wieczorek2016] Aleksander Wieczorek and Volker Roth. Causal compression. arXiv preprint arXiv:1611.00261, 2016.
- [Ma2021a] Jian Ma. Variable selection with copula entropy. Chinese Journal of Applied Probability and Statistics, 37(4):405–420, 2021. See also arXiv preprint arXiv:1910.12389 (2019).
- [Mesiar2021] Radko Mesiar and Ayyub Sheikhi. Nonlinear random forest classification, a copula-based approach. Applied Sciences, 11(15), 2021.
- [Ma2019b] Jian Ma. Predicting MMSE score from finger-tapping measurement. bioRxiv, page 817338, 2019.
- [Ma2020a] Jian Ma. Predicting TUG score from gait characteristics based on video analysis and machine learning. bioRxiv, page 963686, 2020.
- [Ma2020b] Jian Ma. Associations between finger tapping, gait and fall risk with application to fall risk assessment. arXiv preprint arXiv:2006.16648, 2020.
- [Shan2020] Qingsong Shan and Qianning Liu. Binary trees for dependence structure. IEEE Access, 8:150989–150998, 2020.
- [Card2011] Stuart William Card. Towards an information theoretic framework for evolutionary learning. Master's thesis, Syracuse University, 2011.
- [Fu2017] Xueqian Fu, Hongbin Sun, Qinglai Guo, Zhaoguang Pan, Wen Xiong, and Li Wang. Uncertainty analysis of an integrated energy system based on information theory. Energy, 122(122):649–662, 2017.
- [Sun2021] Yan-Ning Sun, Yu Chen, Wu-Yin Wang, Hong-Wei Xu, and Wei Qin. Modelling and prediction of injection molding process using copula entropy and multi-output svr. In IEEE 17th International Conference on Automation Science and Engineering, 2021.
- [Sun2019] Fuqiang Sun, Wendi Zhang, Ning Wang, and Wei Zhang. A copula entropy approach to dependence measurement for multiple degradation processes. Entropy, 21(8):724, 2019.
- [Krishnankutty2020] Baby Alpettiyil Krishnankutty, Rajesh Ganapathy, and Paduthol Godan Sankaran. Non-parametric estimation of copula based mutual information. Communications in Statistics - Theory and Methods, 49(6):1513–1527, 2020.
- [Wang2016] Xu Wang, Liang Jin, Kaizhi Huang, Mingliang Li, and Yi Ming. Physical layer secret key capacity using correlated wireless channel samples. In 2016 IEEE Global Communications Conference (GLOBECOM), pages 1–6, 2016.
- [Zeng2009] Xuexing Zeng and T S Durrani. Band selection for hyperspectral images using copulas-based mutual information. In 2009 IEEE/SP 15th Workshop on Statistical Signal Processing, pages 341–344, 2009.
- [Hudson2021] Hudson and Thames. Machine learning financial laboratory (MLFinLab), 2021. URL: <https://github.com/hudson-and-thames/mlfinlab>.
- [Wang2015] Qiutong Wang. Social networks, asset allocation and portfolio diversification. Master's thesis, University of Waterloo, 2015.
- [Calsaverini2009] Rafael Calsaverini and Renato Vicente. An information-theoretic approach to statistical dependence: Copula information. EPL (Europhysics Letters), 88(6):68003, 2009.

参考文献

- [温 2019] 温云亮, 李艳玲, 黄春艳, and 张泽中. 基于 copula 熵理论的干旱驱动因子选择. 华北水利水电大学学报 (自然科学版), 40(4):51–56, 2019.
- [黄 2021b] 黄春艳. 黄河流域的干旱驱动及评估预测研究. 博士学位论文, 西安理工大学, 2021.
- [吴 2021] 吴亚婷, 余青山, 高云园, 谭同才, and 范影乐. 多尺度肌间耦合网络分析. 生物医学工程学杂志, 38(4):742–752, 2021.
- [Wu2022a] Yating Wu, Qingshan She, Hongan Wang, Yuliang Ma, Mingxu Sun, and Tao Shen. R-vine copula mutual information for intermuscular coupling analysis. In Proceedings of the 11th International Conference on Computer Engineering and Networks, pages 526–534, 2022.
- [Reilly2022] David ó' Reilly and Ioannis Delis. A network information theoretic framework to characterise muscle synergies in space and time. Journal of Neural Engineering, 19(1):016031, feb 2022.
- [Ma2021b] Jian Ma. On thermodynamic interpretation of copula entropy. arXiv preprint arXiv:2111.14042, 2021.
- [Ma2022a] Jian Ma. Causal domain adaptation with copula entropy based conditional independence test. arXiv preprint arXiv:2202.13482, 2022.
- [刘 2022] 刘磊, 高超, 王志刚, 王晓艳, 章四龙, and 陈娜. 基于非线性相关性和复杂网络的径流相似性分区. 水科学进展, 2022.
- [Wu2022b] Qiang Wu and Dongxi Li. CRIA: An interactive gene selection algorithm for cancers prediction based on copy number variations. Frontiers in Plant Science, 13, 2022.
- [Liu2022] Hao Liu, Dechang Pi, Shuyuan Qiu, Xixuan Wang, and Chang Guo. Data driven identification model for associated fault propagation path. Measurement, 188:110628, 2022.
- [Zeng2022] Zefan Zeng, Guang Jin, Chi Xu, Siya Chen, Zhelong Zeng, and Lu Zhang. Satellite telemetry data anomaly detection using causal network and feature-attention-based lstm. IEEE Transactions on Instrumentation and Measurement, 71:1–21, 2022.
- [Huang2019] C.Y. Huang and Y.P. Zhang. Prediction based on copula entropy and general regression neural network. Applied Ecology and Environmental Research, 17(6):14415–14424, 2019.
- [Wang2022] Jujie Wang, Wenjie Xu, Yue Zhang, and Jian Dong. A novel air quality prediction and early warning system based on combined model of optimal feature extraction and intelligent optimization. Chaos, Solitons & Fractals, 158:112098, 2022.
- [Combrisson2022] Etienne Combrisson, Michele Allegra, Ruggero Basanisi, Robin A. A. Ince, Bruno Giordano, Julien Bastin, and Andrea Brovelli. Group-level inference of information-based measures for the analyses of cognitive brain networks from neurophysiological data. bioRxiv, 2022.
- [Li2022] Zhiwei Li, Peng Wang, Jili Zhang, and Hua Guan. A model-free method for identifying time-delay characteristics of HVAC system based on multivariate transfer entropy. Building and Environment, 217:109072, 2022.
- [黄 2021a] 黄朝君, 贾建伟, 秦赫, 王栋. 基于 Copula 熵—随机森林的中长期径流预报研究. 人民长江, 2021, 52(11): 81-85.
- [罗 2022] 罗良清, 平卫英, 单青松, and 王佳. 中国贫困治理经验总结: 扶贫政策能够实现有效增收吗? . 管理世界, 38(2):70–83, 2022.

参考文献

- [Lasserre2021] Marvin Lasserre, Régis Lebrun, and Pierre-Henri Wuillemin. Learning continuous high-dimensional models using mutual information and copula bayesian networks. In Thirty-Fifth AAAI Conference on Artificial Intelligence, AAAI 2021, pages 12139–12146. AAAI Press, 2021.
- [Lasserre2022] Marvin Lasserre. Apprentissages dans les réseaux bayésiens à base de copules non-paramétriques. PhD thesis, Sorbonne Université, 2022.
- [王 2015] 王小巧. 复杂机械产品装配过程质量自适应控制方法及支持系统研究. 博士学位论文, 合肥工业大学, 2015.
- [齐 2019] 齐咏生, 景彤梅, 李永亭, 刘利强, and 刘月文. 一种基于多维度 SCADA 数据评估风电机组健康状态评估方法, 2019. CN110442833A.
- [吴 2020] 吴格, 陈旭, 傅之凤, 李忠虎, and 杨程屹. 一种因果关系分析方法及装置, 2020. CN110766314A.
- [孔 2021] 孔祥永, 王浩, 袁伟, and 蔡明. 一种自动化特征工程信用风险评价系统及方法, 2021. CN114049198A.
- [Cudndet2016] Michel A. Cuendet, Harel Weinstein, and Michael V. LeVine. The allosteric landscape: Quantifying thermodynamic couplings in biomolecular systems. *Journal of Chemical Theory and Computation*, 12(12):5758–5767, December 2016.
- [Escolano2017] Francisco Escolano, Edwin R. Hancock, Miguel A. Lozano, and Manuel Curado. The mutual information between graphs. *Pattern Recognition Letters*, 87:12–19, 2017.
- [董 2022] 董海艳, 赵炳文, 王运韬, 田宇, 傅彦博, 孟德群, and 张铁. 一种含源荷时序相似度约束的源储协同规划配置方法, 2022. CN110766314A.
- [徐 2022] 徐鹏程, 仇建春, 李帆, 刘赛艳, and 蒋新跃. 基于高维 Copula 熵和克里金的站网优化方法. 2022. CN114595556A.
- [王 2019] 王栋, 徐鹏程, 王远坤, and 吴吉春. 一种基于 Copula 熵的水文站网优化模型的优化方法. 2019. CN106897530B.
- [张 2022a] 张婷婷, 王楠, 周天彤, 王苏弘, and 邹凌. 基于 Couple 熵的抑郁症相干性反馈指标提取. *电子测量技术*, 45(9): 160-167, 2022.
- [Alanazi2021] Alanazi, F. A. Truncating Regular Vine Copula Based on Mutual Information: An Efficient Parsimonious Model for High-Dimensional Data. *Mathematical Problems in Engineering*, 2021, 4347957.
- [柳 2018] 柳琼. 基于 Copula 和 MI 理论的相关性度量及其应用研究. 硕士学位论文, 三峡大学, 2018.
- [Ravijs2019] Liesa Ravijs. Revealing temporal interactions around the heartbeat-evoked potential modulated by emotional perception. Master's thesis, Ghent Univeristy, 2019.
- [Bossemeyer2021] Leonie Bossemeyer. Machine Learning for Causal Discovery with Applications in Economics. Master's thesis, Ludwig-Maximilians-Universität München, 2021.
- [韦 2021] 韦颖璐. 基于 pair--copula 熵的相关性度量. 硕士学位论文, 苏州大学, 2021.
- [Wieser2020] Mario Wieser. Learning Invariant Representations for Deep Latent Variable Models. PhD thesis, University of Basel, 2020.
- [Li2022] Xiao Li, Liping Zhang, Sidong Zeng, Zhenyu Tang, Lina Liu, Qin Zhang, Zhengyang Tang, and Xiaojun Hua. Predicting monthly runoff of the upper Yangtze river based on multiple machine learning models. *Sustainability*, 14(18):11149, 2022.

参考文献

- [DeClercq2022] Pieter De Clercq, Jonas Vanthornhout, Maaïke Vandermosten, and Tom Francart. Beyond linear neural envelope tracking: A mutual information approach. *bioRxiv*, 2022.
- [Ma2022b] Jian Ma. Copula entropy based variable selection for survival analysis. *arXiv preprint arXiv:2209.01561*, 2022.
- [Zhang2022] Bowen Zhang, Jinping Lin, Man Luo, Changxian Zeng, Jiajia Feng, Meiqi Zhou, and Fuying Deng. Changes in public sentiment under the background of major emergencies – taking the Shanghai epidemic as an example. *International Journal of Environmental Research and Public Health*, 19(19):12594, 2022.
- [刘 2022] 刘勃. 基于机器学习的封装材料加速预测. 硕士学位论文, 哈尔滨理工大学, 2022.
- [Zhu2022] Shaojun Zhu, Jinhui Zhao, Yating Wu, and Qingshan She. Intermuscular coupling network analysis of upper limbs based on R-vine copula transfer entropy. *Mathematical Biosciences and Engineering*, 19(9):9437–9456, 2022.
- [Chen2019] Lu Chen and Shenglian Guo. *Copulas and its application in hydrology and water resources*. Springer, 2019.
- [Hao2015] Zengchao Hao and Vijay P. Singh. Integrating entropy and copula theories for hydrologic modeling and analysis. *Entropy*, 17(4):2253–2280, 2015.
- [Purkayastha2022] Soumik Purkayastha and Peter X.K. Song. Asymmetric predictability in causal discovery: an information theoretic approach. *arXiv preprint arXiv:2210.14455*, 2022.
- [陈 2019] 陈燕璇, 刘合香, and 倪增华. 基于 Copula 熵因子选取的 PSO-ELM 台风灾情预测模型. *气象研究与应用*, 40(2):7–11, 2019.
- [Hu2022] Wei Hu, Qiuting Guo, Wei Wang, Weiheng Wang, and Shuhong Song. Research on user loss contribution calculation of high-loss distribution area based on transfer entropy. In *2022 China International Conference on Electricity Distribution (CICED)*, pages 499–502, 2022.
- [Yin2022] Min Yin, Jince Li, and Hongguang Li. A CNN approach based on correlation metrics to chemical process fault classifications with limited labeled data. *The Canadian Journal of Chemical Engineering*, 2022.
- [Gocht-Zech2022] Andreas Gocht-Zech. Ein Framework zur Optimierung der Energieeffizienz von HPC-Anwendungen auf der Basis von Machine-Learning-Methoden. PhD thesis, Technische Universität Dresden, 2022.
- [Xiong2022] Xiaoping Xiong and Guohua Qing. A hybrid day-ahead electricity price forecasting framework based on time series. *Energy*, page 126099, 2022.
- [Mohammadi2021] M. Mohammadi, M. Emadi, and M. Amini. Bivariate dependency analysis using Jeffrey and Hellinger divergence measures based on copula density estimation by improved probit transformation. *Journal of Statistical Sciences*, 15(1):233–254, 2021.
- [金 2022] 金国美, 余青山, 马玉良, 张建海, and 孙明旭. 基于小波包-copula 互信息的肌间耦合特性. *传感技术学报*, 35(10):1348–1353, 2022.
- [朱 2022a] 朱正林 and 张冕. 基于 AO 优化 VMD-CE-BiGRU 的光伏发电功率预测. *国外电子测量技术*, 41(10):56–61, 2022.
- [Qian2022] Longxia Qian, Yong Zhao, Jianhong Yang, Hanlin Li, Hongrui Wang, and ChengZu Bai. A new estimation method for copula parameters for multivariate hydrological frequency analysis with small sample sizes. *Water Resources Management*, 36(4):1141–1157, March 2022.

参考文献

- [Han2022] Muye Han and Jinsheng Zhou. Multi-scale characteristics of investor sentiment transmission based on wavelet, transfer entropy and network analysis. *Entropy*, 24(12), 2022.
- [Zhang2023] Ziya Zhang, Yi Li, Chen Xinguo, Yanzi Wang, Ben Niu, De Li Liu, Jianqiang He, Bakhtiyor Pulatov, Ishtiaq Hassan, and Qingtao Meng. Impact of climate change and planting date shifts on growth and yields of double cropping rice in southeastern China in future. *Agricultural Systems*, 205:103581, 2023.
- [Ma2023] Jian Ma. Identifying Time Lag in Dynamical Systems with Copula Entropy based Transfer Entropy. *arXiv preprint arXiv:2301.06037*, 2023.
- [李 2023] 李润泽, 姚尧, 冯珂珂, 杨硕, 李佳丽, 程轶峰, 尹绍雅, and 徐桂芝. 重复经颅磁刺激改善帕金森病运动症状的脑功能网络分析. *生物化学与生物物理进展*, 50(1):126–134, 2023.
- [崔 2022] 崔双双 and 孙单勋. 分工况下风电机组各变量相关性研究. *综合智慧能源*, 44(12):49–55, 2022.
- [Tian2023] Yu-Xin Tian and Chuan Zhang. An end-to-end deep learning model for solving data-driven newsvendor problem with accessibility to textual word-of-mouth data. *SSRN*, 2023.
- [Luo2023] Yu Luo, Guangcan Xu, Hongyu Li, Tianju Ma, Zi Ye, and Zhaohui Li. Research on establishing corneal edema after phacoemulsification prediction model based on variable selection with copula entropy. *Journal of Clinical Medicine*, 12(4):1290, 2023.
- [黄 2021c] 黄达. 基于模块链构建的大件货物多式联运方案研究. 博士学位论文, 北京交通大学, 2021.
- [Condino2009] Francesca Condino. La divergenza di Jensen-Shannon nell' algoritmo di clustering dinamico per dati descritti da distribuzioni multivariate. PhD thesis, Università degli Studi di Napoli Federico II, 2009.
- [吴 2022] 吴京鹏. 基于图嵌入表示的节点无特征网络链路预测研究. 硕士学位论文, 西北师范大学, 2022.
- [Redondo2023] Paolo Victor Redondo, Raphaël Huser, and Hernando Ombao. Measuring information transfer between nodes in a brain network through spectral transfer entropy. *arXiv preprint arXiv:2303.06384*, 2023.
- [Bi2023] Xiaotian Bi, Deyang Wu, Daoxiong Xie, Huawei Ye, and Jinsong Zhao. Large-scale chemical process causal discovery from big data with transformer-based deep learning. *Process Safety and Environmental Protection*, 2023.
- [张 2022b] 张可, 刘施彤, 郑植, 贾宇明, and 黄乐天. 一种基于动态贝叶斯网络的目标意图识别方法, 2022. CN114997306A.
- [陈 2023] 陈作海, 钱恒, and 高永超. 一种基于知识图谱的城市热线派单方法及系统, 2023. CN115860436A.
- [Sunoj2023] S.M. Sunoj and N. Unnikrishnan Nair. Survival copula entropy and dependence in bivariate distributions. *REVSTAT-Statistical Journal*, 2023.

参考文献

- [An2023] Wuyue An, Lin Wang, and Dongfeng Zhang. Comprehensive commodity price forecasting framework using text mining methods. *Journal of Forecasting*, 2023.
- [Hu2023a] Jiabei He and Lifeng Wu. Cross-conditions capacity estimation of lithiumion battery with constrained adversarial domain adaptation. *Energy*, 277:127559, 2023.
- [Dong2023] Jie Dong, Keren Cao, and Kaixiang Peng. Hierarchical causal graph-based fault root cause diagnosis and propagation path identification for complex industrial process monitoring. *IEEE Transactions on Instrumentation and Measurement*, 72:1–11, 2023.
- [Hu2023b] Jie Hu, Min Wu, Weihua Cao, and Witold Pedrycz. Dynamic modeling framework based on automatic identification of operating conditions for sintering carbon consumption prediction. *IEEE Transactions on Industrial Electronics*, pages 1–9, 2023.
- [Mo2023] Ran Mo, Bin Xu, Ping-An Zhong, Yuanheng Dong, Han Wang, Hao Yue, Jian Zhu, Huili Wang, Guoqing Wang, and Jianyun Zhang. Long-term probabilistic streamflow forecast model with “inputs–structure–parameters” hierarchical optimization framework. *Journal of Hydrology*, page 129736, 2023.
- [Wei2022] Yingpeng Wei and Li Wang. Copula entropy-based PCA method and application in process monitoring. In 2022 4th International Conference on Intelligent Information Processing (IIP), pages 61–64, 2022.
- [汪 2023] 汪方毅, 唐杰庆, 刘倩, 余成新, 李博, and 丁帆. 基于静息态 fMRI 区分健康老年人认知水平的 MVPA 方法研究. *磁共振成像*, 14(6):18–25, 2023.
- [傅 2023] 傅宇舟, 程文驰, 陈小军, and 李赞. 面向 6G 网络的基于语义通信的端到端服务框架. *移动通信*, 47(6):35–40, 2023.
- [金 2023] 金秀章, 乔鹏, and 史德金. 基于 VMD-Bayes-Lasso 算法带误差补偿的火电厂 NO_x 浓度软测量. *华北电力大学学报 (自然科学版)*, 2023.
- [朱 2022b] 朱仲儿. 多种机器学习方法的股票分类预测. 硕士学位论文, 上海师范大学, 2022.
- [Cao2023] 曹久慧, 卞桂荣, 陈剑, 李宝枝, 顾晓彬, 徐士月, 夏显文, and 张旭辉. 一种基于自注意力机制的变形监测方法, 2023. CN116378120A.
- [许 2023] 许罗豪, 刘金鑫, 张慧波, and 纪超. 基于熵与回归树的票价影响因素研究. *综合运输*, 45(6):125–130, 2023.
- [Gao2023] Sheng Gao, Linchuan Zhang, Lei He, Xiaoyang Deng, Huilin Yin, and Hao Zhang. Attack detection for intelligent vehicles via CAN- bus: A lightweight image network approach. *IEEE Transactions on Vehicular Technology*, pages 1–13, 2023.
- [Kanthavel2022] P. Kanthavel, C.K. Saxena, and R.K. Singh. Integrated drought index based on vine copula modelling. *International Journal of Climatology*, 2022.
- [杨 2019] 杨惜岁. 多目标准则下流域水文站网的优化与评价. 硕士学位论文, 武汉理工大学, 2019.

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欢迎体验 Copula 熵引擎的强劲动力

