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# FM4Urban 2026

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# Foundation Models for Urban Intelligence: Why Geospatial Information Science Matters

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## The most relevant question

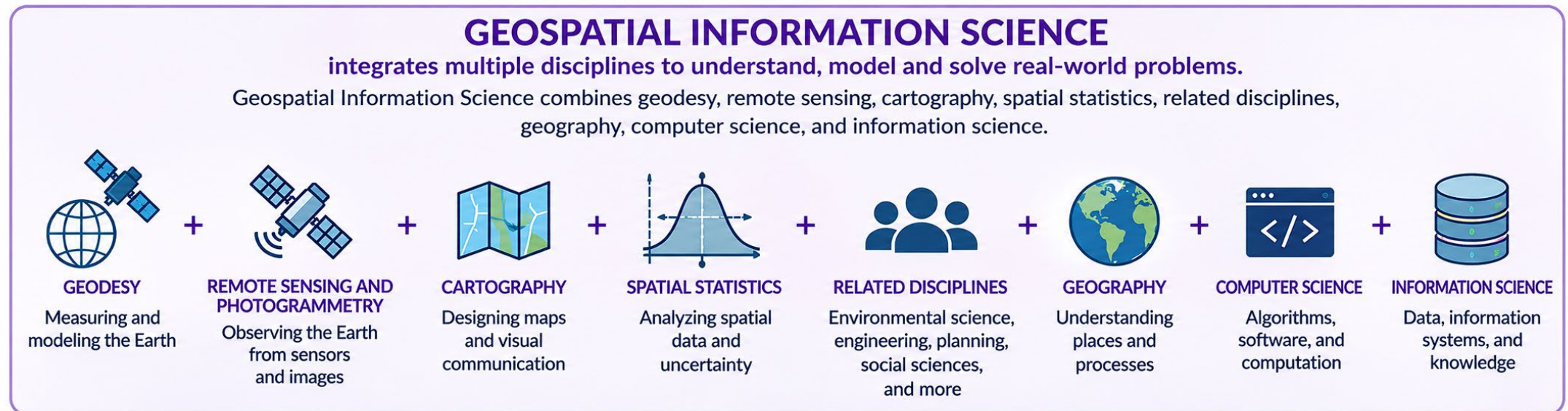
- When foundation models meet cities, is geographic information merely another modality—or does geography fundamentally change what the model has to learn?

## My answer

- Geography cannot be added at the end. If we want foundation models to contribute to urban intelligence, geographic structure has to enter the representation itself.
- **A city is not an image with coordinates attached to it. It is a spatial, temporal, relational and governed system.**

# Geospatial Information Science

**Geospatial Information Science (GIScience)** is the interdisciplinary scientific field that studies how geographic information about the Earth is acquired, represented, modelled, stored, shared, analysed, visualised, communicated and evaluated.



# GIScience versus GIS

*Two sides of the same world*

## GIS

### THE TECHNOLOGY & SYSTEM

GIS is the technology or information system used to capture, manage, analyse, and visualise geographic data.



#### CAPTURE

Collect geographic data from the real world



#### MANAGE

Store, organize, and maintain geographic data



#### ANALYSE

Explore, query, and analyze spatial patterns



#### VISUALISE

Present and share results through maps and apps

VS

## GIScience

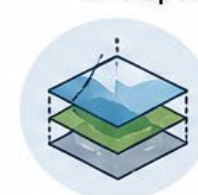
### THE SCIENTIFIC DISCIPLINE

GIScience is the scientific discipline that studies the principles underlying geographic information, GIS technologies, and spatial reasoning.



#### THEORY

Developing models, concepts, and formal theories



#### METHODS

Designing algorithms, models, and analytical methods



#### SPATIAL REASONING

Understanding how people think about space and place



#### RESEARCH

Advancing knowledge through empirical and theoretical investigation

### KEY CHARACTERISTICS



**Tools & Software**  
e.g., QGIS, ArcGIS, PostGIS



**Data Management**  
Databases, formats, standards



**Applications**  
Mapping, analysis, modeling, visualization



**Users**  
Practitioners, analysts, decision-makers

### KEY FOCUS AREAS



**Foundations**  
Ontology, semantics, data models



**Methods & Models**  
Spatial statistics, uncertainty, AI, simulation



**Cognition & Society**  
Human spatial cognition, VGI, ethics, policy



**Interdisciplinary**  
Geography, computer science, statistics, social sciences, etc.



### COMPLEMENTARY, NOT COMPETING

GIS provides the tools and infrastructure. GIScience provides the knowledge and principles. Together, they advance our understanding and ability to solve spatial problems.



**Smarter Cities**



**Environmental Sustainability**



**Disaster Management**

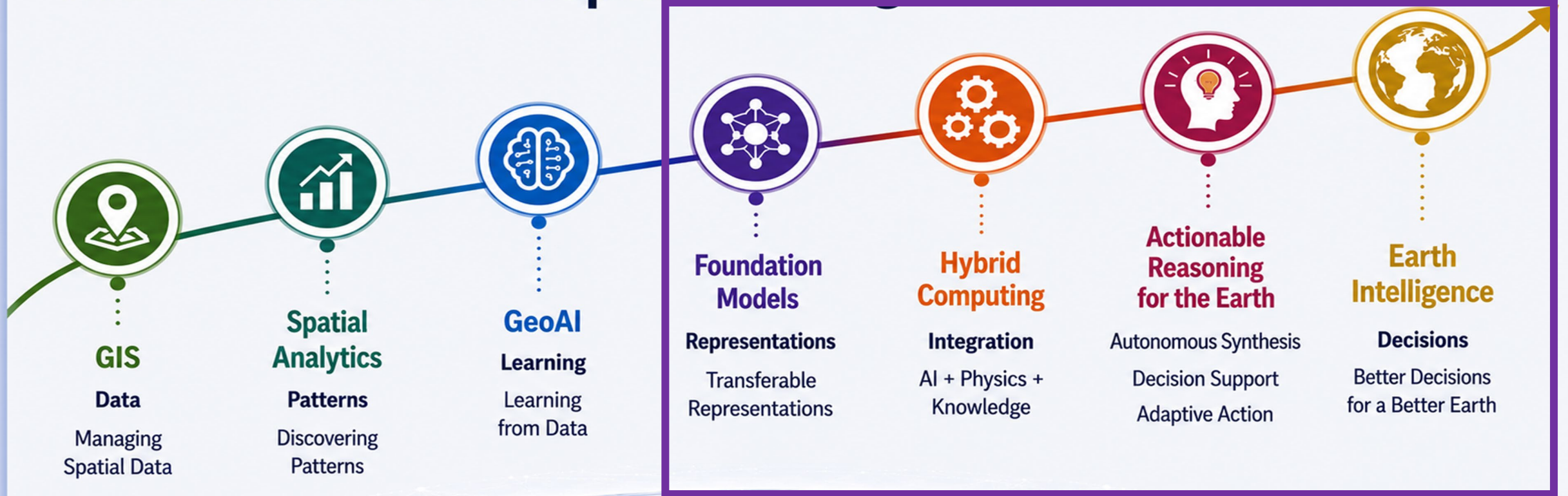


**Public Health**



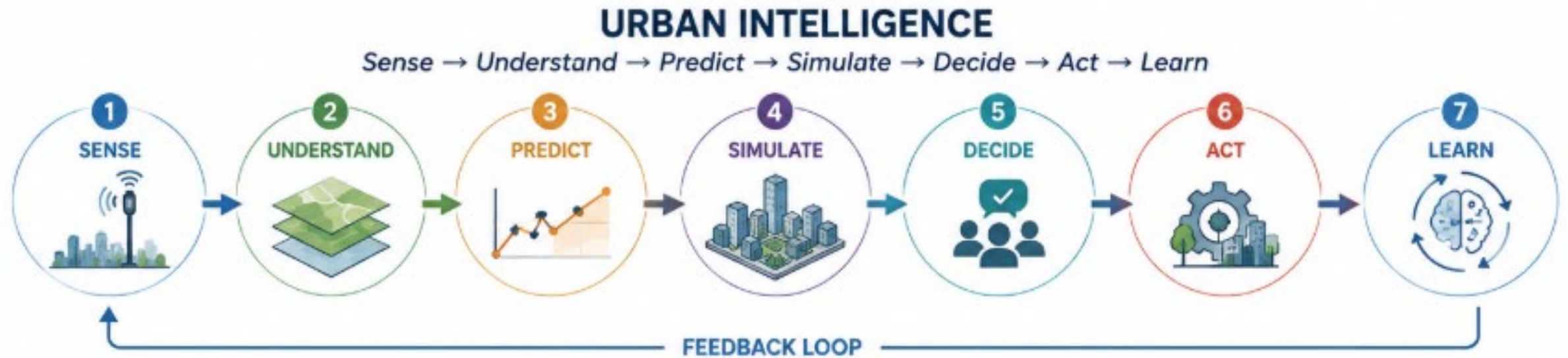
**Better Decisions for a Better World**

# The Evolution of Geospatial Intelligence



# Urban Intelligence

Urban Intelligence: capacity to integrate observations, data, models, domain knowledge, and human expertise to understand, predict, simulate, and support decisions about urban systems.



Urban intelligence is not equivalent to producing a prediction; it requires explanation, spatial context, uncertainty, and actionable decisions.

# Why Generic AI Is Not Enough for Cities

If this is what we mean by Urban Intelligence, then simply applying a generic foundation model to urban data is not enough. Cities create scientific problems that are deeply geographic.

**Urban AI must understand geography, not only patterns.**



Cities are **spatially heterogeneous**, multi-scale and constantly changing



Meaning depends on **location, context, resolution** and time

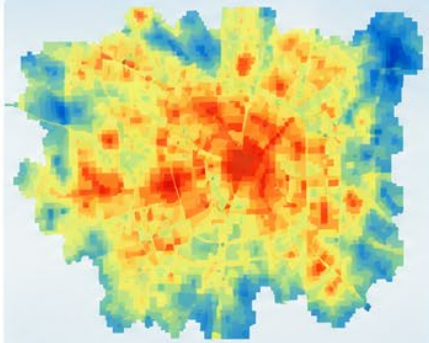


Predictions can fail when transferred across cities or neighbourhoods



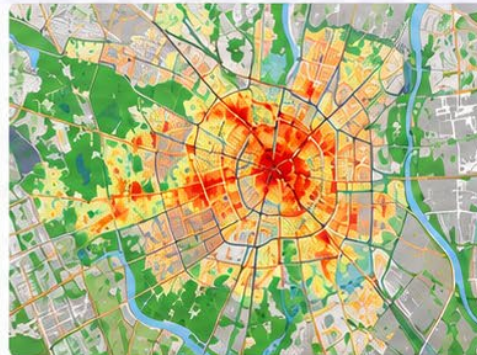
Urban decisions require **uncertainty, provenance, fairness** and **accountability**

**Generic AI – learns patterns**



- ✗ No spatial context
- ✗ No urban structure
- ✗ Hard to explain “why there”
- ✗ Weak transferability

**Geography-aware Urban AI – understands place and context**



- ✓ Uses georeferenced EO and GIS layers
- ✓ Relates heat to land cover, morphology and urban form
- ✓ Transferable across neighbourhoods/cities
- ✓ Supports interpretation and decisions

**Understanding geography means:**



**Location:**  
where



**Spatial relations:**  
how places interact



**Scale:**  
from buildings to city



**Space-time:**  
today and in the future



**Place semantics:**  
land use, functions, people



**Physical and urban processes:**  
heat, pollution, mobility, risk

**Geography is not metadata added after the model has been trained; it has to be part of the representation itself.**

**Generic AI predicts; GIScience-grounded Urban AI explains, transfers and supports decisions**

*Image generated with the assistance of OpenAi's ChatGPT, based on author-provided content.*

## Urban Foundation Models

Large-scale, pretrained AI models that learn transferable general-purpose representations and spatiotemporal reasoning capabilities of urban systems from diverse, multimodal, multiscale, and spatiotemporal urban data and that can be adapted to generate predictions and insight related to multiple urban applications.

## From Foundation Models to Urban Geospatial Foundation Models

Geospatial Science provides a fundamental methodological framework for **grounding** these models in geographic reality by integrating spatial reasoning, geospatial data representations, rigorous analytical methods, and effective mechanisms for spatial communication. This foundation enables models to capture the spatial structure, context, scale, and heterogeneity of urban phenomena, thereby enhancing their geographic validity, interpretability, and practical applicability.

**What does this geographic grounding add in practice? Let us look at urban applications before we move to the taxonomy.**

## Urban Applications: What GIScience Adds

Different applications stress different GIScience capabilities.

Therefore, there is probably no meaningful notion of a universally 'best' Urban Foundation Model independent of task, geography and decision context.

## Urban Applications: What GIScience Adds



GIScience makes urban AI scientifically robust, transferable, interpretable and policy-relevant.

# 1. Urban Heat Islands

What does the FM provide, and what does GIScience add to turn that output into urban intelligence?

GIScience builds the urban-climate representation; the FM learns transferable relationships; GIScience turns outputs into place-based action.

## Geospatial representation

- LST / thermal anomalies
- vegetation, canopy, NDVI
- imperviousness, morphology
- LCZs, land use, meteo time series
- CRS, resolution, spatial units

## FM contribution

- reusable representations
- multimodal fusion
- prediction / gap filling
- downscaling
- transfer to new cities

## GIScience reasoning

- spatial drivers of heat
- scale and modifiable areal unit problem (MAUP) control
- uncertainty mapped in space
- exposure / vulnerability overlays
- intervention areas and monitoring

## Urban intelligence outcome

**Where is heat risk concentrated, why there, who is exposed, and what should be cooled first?**

**+ DOMAIN EXPERTISE ACROSS THE CHAIN: URBAN CLIMATE**

GIScience & EO → Foundation model → GIScience reasoning → Urban intelligence



Image generated with the assistance of OpenAI's ChatGPT, based on author-provided prompts.

## 4. Urban Air Quality

**What does the FM provide, and what does GIScience add to turn that output into urban intelligence?**

GIScience defines pollutant geography and exposure context; the FM learns nonlinear patterns; GIScience validates what the predictions mean.

### Geospatial representation

- NO<sub>2</sub>, PM<sub>2.5</sub>, O<sub>3</sub>, AOD
- sensors and emissions
- roads, industry, land use
- meteorology, terrain, dispersion context
- station geography and scale

### FM contribution

- fuse sparse sensors + EO
- learn source-weather relations
- gap-fill / downscale
- short-term forecasting
- transfer to undersampled areas

### GIScience reasoning

- exposure surfaces by population
- source-area interpretation
- station bias and uncertainty
- regulatory
- policy monitoring in space and time

### Urban intelligence outcome

**Who breathes what, when, from which sources, and which intervention reduces exposure?**

**+ DOMAIN EXPERTISE ACROSS THE CHAIN: AIR POLLUTION/ATMOSPHER**

GIScience & EO → Foundation model

→ GIScience reasoning

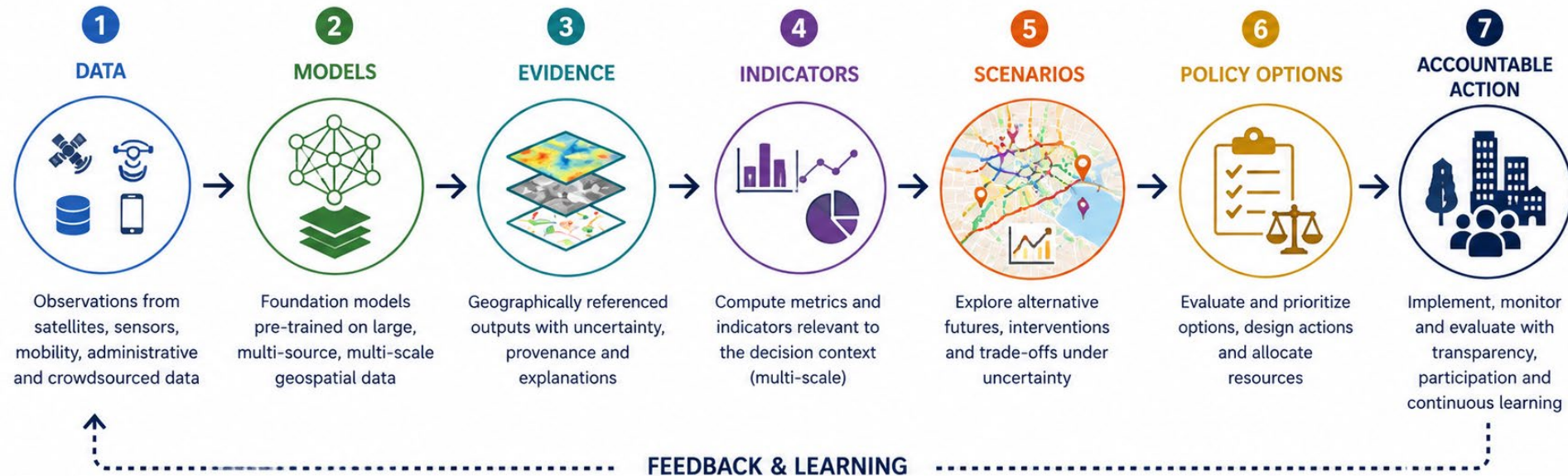
→ Urban intelligence



*Image generated with the assistance of OpenAI's ChatGPT, based on author-provided content.*

# A Trusted Geospatial Decision Chain for Urban Intelligence

Urban Intelligence is not about blindly applying generic AI to city data. On the opposite, it relies on trusted geospatial decision chains that link data and models to actionable evidence, policy choices, and responsible outcomes. Foundation Models can contribute by generating predictions or insights but GIScience is essential to convert these outputs into geographically sound evidence, relevant indicators, and robust decisions.



This should not be viewed as a fixed sequence but as a flexible framework. Depending on the urban challenge, steps may overlap or merge. Model output is a starting point—it must be translated into geographically grounded evidence before it can support accountable governance.

# Representation-centered taxonomy of Urban (Geospatial) Foundation Models

We propose a **representation-centred, GIScience-grounded taxonomy of Urban Foundation Models**. In this framework, the geographic dimension is not treated as an additional attribute of an otherwise generic foundation model. Rather, it is considered **constitutive of the urban representation itself**. Urban phenomena are inherently spatially referenced, scale-dependent, relational, heterogeneous and dynamic; consequently, geographic structure forms part of the conceptual foundation of an UFM.

Accordingly, we use simply the term **Urban Foundation Model (UFM)** in this keynote. The qualifier **geospatial** may be omitted once this definition has been established, because **geospatial grounding is assumed to be intrinsic** to the family rather than an optional model characteristic.

The taxonomy is intended to provide a **parsimonious organization of the major representational paradigms currently emerging in urban foundation models**, rather than an exhaustive or mutually exclusive classification. Models are assigned to families according to their **dominant geographic representational principle**, rather than solely according to input modality, architecture or downstream application. **A model may therefore belong to more than one family when it explicitly combines different forms of geographic representation.**

## Representation-centered taxonomy of Urban Foundation Models

We expect progressive convergence across the proposed families (representational archetypes rather than rigid model classes), with future models increasingly integrating **continuous fields, geographic objects, 3D scenes, networks, trajectories, spatiotemporal processes, language and domain knowledge within unified architectures.**

Earth-observation, environmental and urban-field GFMs



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**Place-, object- and geovector-centric GFMs**



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**3D, cross-view and scene-centric GFMs**



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**3D, cross-view and scene-centric GFMs**

**Spatiotemporal process, mobility and network GFMs**



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Earth-observation, environmental and urban-field GFMs

Place-, object- and geovector-centric GFMs

3D, cross-view and scene-centric GFMs

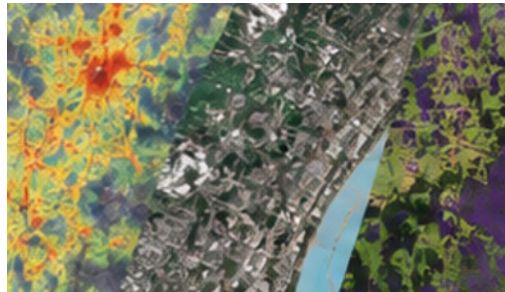
Spatiotemporal process, mobility and network GFMs

Geospatial language, knowledge and planning FMs



# Representation-centered taxonomy of Urban Foundation Models

We expect progressive convergence across the proposed families (representational archetypes rather than rigid model classes), with future models increasingly integrating **continuous fields**, **geographic objects**, **3D scenes**, **networks**, **trajectories**, **spatiotemporal processes**, **language** and **domain knowledge** within unified architectures.



FIELDS



OBJECTS AND  
PLACES



GEOMETRY  
AND SCENES



RELATIONS AND  
PROCESSES



KNOWLEDGE AND  
DECISIONS

The future UFM may not choose between these five geographic languages; it may have to speak all five.

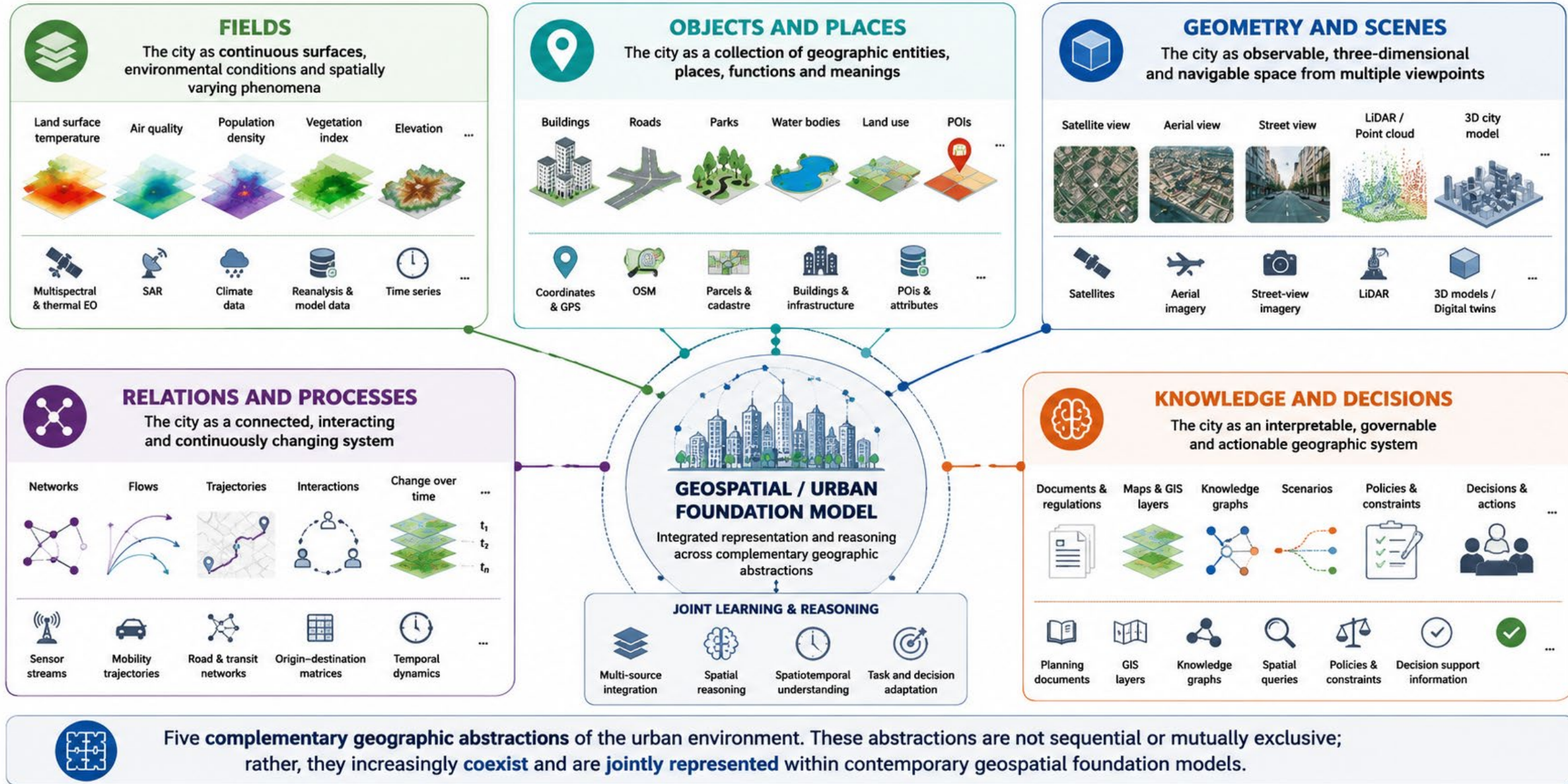
Multimodality, generative capability, reasoning, adaptation, transferability and interaction with external tools are **cross-cutting properties** rather than as independent model families.

# Representation-centered taxonomy of Urban Foundation Models

| Family                                                       | Dominant geographic object or representation                                                       | Geographic conception of the city                                                                                               | Includes                                                                                                                                                                                      |
|--------------------------------------------------------------|----------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| <b>Earth-observation, environmental and urban-field GFMs</b> | Continuous geographic fields and raster representations                                            | <b>Fields</b> — the city as continuous surfaces, environmental conditions and spatially varying phenomena                       | Optical, SAR, multispectral, hyperspectral and thermal imagery; climate layers; land-cover products; multitemporal EO data                                                                    |
| <b>Place-, object- and geovector-centric GFMs</b>            | Discrete geographic entities, vector objects and their semantic relationships                      | <b>Objects and places</b> — the city as a collection of geographic entities, places, functions and meanings                     | Coordinates, POIs, OSM, parcels, buildings, roads, land-use classes, urban functions, place embeddings, semantic graphs                                                                       |
| <b>3D, cross-view and scene-centric GFMs</b>                 | Urban geometry, scenes and multiple 3D geometry, scenes, viewpoints, and embodied observations     | <b>Geometry and scenes</b> — the city as observable, three-dimensional and navigable space represented from multiple viewpoints | Satellite, aerial and street-view imagery; video; LiDAR; point clouds; meshes; 3D city models; digital twins                                                                                  |
| <b>Spatiotemporal process, mobility and network GFMs</b>     | Time series, trajectories, flows, graphs, and evolving spatial relations                           | <b>Relations and processes</b> — the city as a connected, interacting and continuously changing system                          | Sensor streams, spatiotemporal grids, traffic networks, road graphs, trajectories, mobility flows, origin–destination matrices, infrastructure networks                                       |
| <b>Geospatial language, knowledge and planning FMs</b>       | Textual, symbolic, relational and decision-oriented representations grounded in geographic context | <b>Knowledge and decisions</b> — the city as an interpretable, governable and actionable geographic system                      | Regulations; planning documents; maps; GIS layers; spatial queries; indicators; knowledge graphs; scenarios; planning constraints; spatial reasoning; policy and decision-support information |

## Representation-centered taxonomy of Urban Foundation Models

- Family membership is determined by the **dominant representational** principle rather than by the mere presence of a particular data modality. Secondary family memberships may be assigned when a model explicitly integrates multiple geographic representations.
- The taxonomy **does not classify UFM**s primarily according to **neural architecture or data modality**, but according to the form of geographic reality that their representations are designed to encode.
- These should not be interpreted as a strict progression. Rather, they are **complementary geographic abstractions**, which increasingly coexist within the same foundation model.



# A proposed GIScience-centred evaluation framework for Urban Foundation Models

Building on established requirements for foundation models, GeoAI, spatial reasoning, responsible geospatial AI, and urban computing, we propose a multidimensional framework for assessing the urban geospatial maturity of GFMs. The proposed framework evaluates UFM from **three** complementary perspectives:

1. **eligibility criteria** determine whether a model should be considered an Urban Foundation Model. These are conditions and not scored quality dimensions. Therefore, they decide if a model can be considered a UFM
2. **GIScience dimensions** evaluate the extent to which the model explicitly represents and reasons about geographic properties of urban systems
3. **foundation-model and deployment dimensions** assess whether the model exhibits the generality, adaptability, robustness and operational maturity expected of a foundation model

# Eligibility criteria

## CRITERION

## DEFINITION

### E1. Urban relevance

The model is pretrained, adapted, or systematically evaluated on urban phenomena, urban geographic data, or urban tasks, either as its primary domain or within a broader geospatial domain.

### E2. Geospatial grounding

Geographic structure is constitutive of the model representation rather than incidental metadata.

### E3. Foundation-model behaviour

The model provides reusable representations or capabilities beyond a single predefined task and supports adaptation to multiple downstream problems.

### E4. Documented evidence

Sufficient public information exists to assess the model consistently.

# GIScience maturity dimensions I

## G1–G6: core geographic representation and reasoning

### ID Dimension and definition

- G1 Explicit geographic grounding** – Model-level encoding, preservation or exploitation of geographic position and spatial context.
- G2 Scale and resolution awareness** – Ability to account for spatial extent, granularity, GSD, aggregation and scale effects.
- G3 Spatial dependence and geographic non-stationarity** – Representation of neighbourhood effects, spatial dependence and geographically varying relationships.
- G4 Temporal dynamics and spatiotemporal interaction** – Modelling of temporal evolution, dynamics and space-time interactions.
- G5 Topology and network structure** – Representation of adjacency, connectivity, containment, paths and network relations.
- G6 Geographic semantics** – Association of geographic entities and patterns with place, function, meaning and urban context.

Georeferenced input alone cannot justify model-level geographic grounding. The dimensions require evidence that geography shapes the representation, objective, inference or validated reasoning capability.

# GIScience maturity dimensions II

## G7–G11: trust, transfer and operational geographic use

### ID Dimension and short definition

- G7** **Uncertainty** – Estimation, calibration and communication of uncertainty in model outputs.
- G8** **Provenance and data lineage** – Traceability of data sources, time, quality, processing history, licensing and lineage.
- G9** **Geographic generalisation and transferability** – Maintaining or adapting performance across unseen cities, regions, sensors, scales and contexts.
- G10** **Spatial and social fairness** – Evaluation and mitigation of disparities across territories, populations and data-coverage conditions.
- G11** **Operational geospatial interoperability** – Official workflow integration with GIS formats, standards, data models and operational infrastructures.

Third-party post-processing is not a model capability unless it is part of the official released workflow. G11 requires preserved geographic reference and standard GIS-ready exchange.

# Foundation-model and deployment maturity dimensions

## F1–F8: foundation-model behaviour and deployment readiness

### ID Dimension and definition

- F1** **Generality and adaptation capacity** – Reusable capabilities and efficient adaptation to new tasks, datasets, domains and applications.
- F2** **Multimodal and cross-representational integration** – Alignment, fusion and joint exploitation of heterogeneous modalities and geographic representations.
- F3** **Robustness and continual adaptation** – Reliability under noise, missing data, distribution shifts and evolving conditions, with updating.
- F4** **Constraint-aware physical and behavioural plausibility** – Representation, enforcement or evaluation of physical, geometric, infrastructural, behavioural or institutional constraints.

F4 requires explicit constraints, targeted validity tests or constraint-aware training/inference.

# Foundation-model and deployment maturity dimensions

## F1–F8: foundation-model behaviour and deployment readiness

### ID Dimension and definition

- F5 Computational efficiency** – Practical training and inference performance in compute, memory, latency, energy and scalability.
- F6 Reproducibility and reusability** – Availability of code, weights, configurations, data and documentation for independent reuse.
- F7 Transparency and auditability** – Understandable, traceable and auditable behaviour through documentation, explanations and limitations.
- F8 Responsible and safe deployment** – Privacy, security, governance, human oversight, risk management and operational safeguards.

F4 requires explicit constraints, targeted validity tests or constraint-aware training/inference.

# Scoring the dimensions

| Score Class |                              | Definition                                                                                                                                                                                   | Typical evidence                                                                                                                                                                                                                                  |
|-------------|------------------------------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| 0           | Not addressed                | The dimension is not addressed by the model, or no supporting evidence is available.                                                                                                         | No relevant mechanism, experiment, output, documentation, or operational evidence.                                                                                                                                                                |
| 1           | Claimed or implicit          | The dimension is mentioned, assumed, or indirectly present through the data or architecture, but is not explicitly operationalized or evaluated.                                             | Conceptual claim; property inherited from the input data; indirect architectural support; no targeted evaluation.                                                                                                                                 |
| 2           | Partially addressed          | The dimension is explicitly considered through a relevant mechanism, dataset design, output, or evaluation, but evidence remains limited in scope or depth.                                  | A dedicated mechanism with limited evaluation; one restricted context; descriptive analysis; limited transfer, robustness, or operational testing.                                                                                                |
| 3           | Substantially demonstrated   | The model explicitly addresses the dimension and provides convincing empirical or operational evidence across multiple relevant settings.                                                    | Targeted experiments; ablations; multiple datasets, cities, scales, modalities, tasks, or evaluation settings; systematic documentation where appropriate.                                                                                        |
| 4           | Comprehensively demonstrated | The dimension is treated as a systematic model capability and is validated across diverse, realistic, and challenging conditions with strong evidence of robustness or operational maturity. | Cross-domain or cross-city validation; distribution-shift or stress testing; repeated temporal evaluation; calibrated uncertainty; interoperability in real workflows; extensive reproducibility evidence; operational deployment where relevant. |

## Adding Relevance

| Label                     | Definition                                                                                                                          | Interpretation                                                                                                                                     |
|---------------------------|-------------------------------------------------------------------------------------------------------------------------------------|----------------------------------------------------------------------------------------------------------------------------------------------------|
| <b>C – Core</b>           | The dimension is central to the family's geographic representation and reasoning logic.                                             | A model in this family should normally address this dimension. Its absence represents a significant limitation.                                    |
| <b>R – Relevant</b>       | The dimension is important for evaluating the family, but it does not define the family itself.                                     | A model can still belong to the family without explicitly addressing this dimension, although its capabilities or applicability may be limited.    |
| <b>CR – Core Relevant</b> | The dimension is relevant to the family in general, but becomes central for particular subfamilies, architectures, or applications. | Its importance depends on the specific model and use case. It should be evaluated carefully, but its absence is not always a fundamental weakness. |
| <b>X – Contextual</b>     | The dimension can be useful for comparison or for specific applications, but it is not normally expected from the family.           | Its absence is not necessarily a significant weakness.                                                                                             |

## Evaluation matrix

| Family                                                       | Core dimensions                                         | Relevant dimensions        | Contextual dimensions |
|--------------------------------------------------------------|---------------------------------------------------------|----------------------------|-----------------------|
| <b>Earth-observation, environmental and urban-field GFMs</b> | G1, G2, G3, G7, G8, G9, G11, F1, F3, F5, F6, F7, F8     | G4 (CR), G6, G10, F2, F4   | G5                    |
| <b>Place-, object- and geovector-centric GFMs</b>            | G1, G2, G5, G6, G7, G8, G9, G11, F1, F2, F5, F6, F7, F8 | G3, G10, F3, F4            | G4                    |
| <b>3D, cross-view and scene-centric GFMs</b>                 | G1, G2, G7, G8, G9, G11, F1, F2, F5, F6, F7, F8         | G3, G5, G6, G10, F3, F4(*) | G4                    |
| <b>Spatiotemporal process, mobility and network GFMs</b>     | G1, G3, G4, G5, G7, G8, G9, G11, F1, F3, F5, F6, F7, F8 | G2, G6, G10, F2(*), F4     |                       |
| <b>Geospatial language, knowledge and planning FMs</b>       | G1, G6, G7, G8, G9, G11, F1, F2, F3, F4, F5, F6, F7, F8 |                            |                       |

(\*) the requirement is relevant to the family in general but becomes core for specific subfamilies, model designs, or applications.

## UFM #1 GitHub / model Open status / embeddings

|                               |                                                                            |                                                                                                                                                       |
|-------------------------------|----------------------------------------------------------------------------|-------------------------------------------------------------------------------------------------------------------------------------------------------|
| <b>Prithvi-EO-2.0</b>         | <a href="#">GitHub</a> · <a href="#">Hugging Face weights</a>              | <b>Open</b> — code + pretrained weights                                                                                                               |
| <b>TerraMind</b>              | <a href="#">GitHub</a> · <a href="#">Hugging Face model</a>                | <b>Open</b> — code + pretrained weights                                                                                                               |
| <b>Copernicus-FM</b>          | <a href="#">GitHub</a> · <a href="#">Hugging Face weights</a>              | <b>Open</b> — code + pretrained weights + associated data/embedding resources                                                                         |
| <b>THOR</b>                   | <a href="#">GitHub</a> · <a href="#">Hugging Face model</a>                | <b>Open</b> — code + pretrained weights                                                                                                               |
| <b>AlphaEarth Foundations</b> | <a href="#">Official project</a> · <a href="#">Earth Engine embeddings</a> | <b>Partially open</b> — embeddings publicly available; model weights/training code not released                                                       |
| <b>TESSERA</b>                | <a href="#">GitHub</a> · <a href="#">GeoTessera embeddings</a>             | <b>Open</b> — code + model weights + global embeddings                                                                                                |
| <b>Galileo</b>                | <a href="#">GitHub</a> · <a href="#">Hugging Face models</a>               | <b>Open</b> — code + pretrained weights                                                                                                               |
| <b>AnySat</b>                 | <a href="#">GitHub</a> · <a href="#">Hugging Face model</a>                | <b>Open</b> — code + pretrained model                                                                                                                 |
| <b>Panopticon</b>             | <a href="#">GitHub</a> · <a href="#">Hugging Face weights</a>              | <b>Open</b> — code + pretrained weights                                                                                                               |
| <b>UrbanCLIP</b>              | <a href="#">GitHub</a>                                                     | <b>Partially open</b> — public implementation and urban image-text data/resources; no explicit open-source license is visible in the main repository. |
| <b>RobSense</b>               | <a href="#">GitHub Project</a>                                             | <b>Partially open</b> — The authors released code and weights on 23 May 2025.                                                                         |

## Eligible UFM — Fields, Objects and Places

### UFM #2 GitHub / model Open status / embeddings

|                 |                                                        |                                                                                    |
|-----------------|--------------------------------------------------------|------------------------------------------------------------------------------------|
| <b>CityFM</b>   | <a href="#">GitHub</a>                                 | <b>Partially open</b> — implementation + pretrained city models publicly available |
| <b>PlaceFM</b>  | <a href="#">GitHub</a>                                 | <b>Partially open</b> — public training-free implementation                        |
| <b>GeoLink*</b> | <a href="#">GitHub</a>                                 | <b>Open</b> — implementation + pretrained checkpoints                              |
| <b>ReFound</b>  | <a href="#">GitHub</a> / <a href="#">PaddleSpatial</a> | <b>Partially open</b> — implementation and associated resources publicly available |

### UFM #3 GitHub / model Open status / embeddings

|            |                                                             |                                                                                                       |
|------------|-------------------------------------------------------------|-------------------------------------------------------------------------------------------------------|
| UrbanVLP   | <a href="#">GitHub</a>                                      | <b>Partially open</b> — official code public; pretrained checkpoint/release coverage limited          |
| UrbanLLaVA | <a href="#">GitHub</a> · <a href="#">Project</a>            | <b>Partially open</b> — code and data publicly available                                              |
| GeoBridge  | <a href="#">GitHub</a> · <a href="#">Hugging Face model</a> | <b>Partially open</b> — public code/model; some source imagery subject to redistribution restrictions |
| 3DCity-LLM | <a href="#">GitHub</a>                                      | <b>Open</b> — code + model/data resources                                                             |

### UFM#5 GitHub / model Open status / embeddings

|            |                                                                                    |                                                                                                           |
|------------|------------------------------------------------------------------------------------|-----------------------------------------------------------------------------------------------------------|
| CityGPT    | <a href="#">GitHub</a> · <a href="#">CityGPT data</a>                              | <b>Partially open</b> — public framework, training/evaluation code and data resources                     |
| UrbanLLM   | <a href="#">GitHub</a>                                                             | <b>Partially open</b> — code/data public; standalone model-weight release limited                         |
| PlanGPT    | <a href="#">GitHub</a> / <a href="#">project</a> · <a href="#">Project website</a> | <b>Partially open</b> — public project/demo resources; complete underlying model stack not fully released |
| PlanGPT-VL | <a href="#">GitHub</a> · <a href="#">Model</a>                                     | <b>Open</b> — public implementation + released model                                                      |

## Eligible UFMs – Geometry, Processes, Knowledge and Decisions

### UFM#4 GitHub / model Open status / embeddings

|          |                                                                                       |                                                                                           |
|----------|---------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------------|
| UniST    | <a href="#">GitHub</a>                                                                | <b>Partially open</b> — official implementation + dataset/model resources                 |
| OpenCity | <a href="#">GitHub</a> · <a href="#">Hugging Face model</a> · <a href="#">Dataset</a> | <b>Open</b> — code + pretrained model + datasets                                          |
| BIGCity  | <a href="#">GitHub</a> · <a href="#">Hugging Face model</a>                           | <b>Partially open</b> — implementation + weights + datasets publicly available            |
| MoRA     | <a href="#">GitHub</a> <a href="#">Project</a>                                        | <b>Open</b> — MIT-licensed code + pretrained/distilled model and representation resources |
| UniFlow  | <a href="#">GitHub</a>                                                                | <b>Partially open</b> — public implementation and data resources                          |
| UrbanDiT | <a href="#">GitHub</a>                                                                | <b>Partially open</b> — public implementation; pretrained release less complete           |
| UrbanFM  | <a href="#">GitHub</a>                                                                | <b>Partially open</b> — implementation and WorldST resources public                       |
| UniTraj  | <a href="#">GitHub</a>                                                                | <b>Open</b> — implementation + pretrained model + trajectory resources                    |
| UrbanGPT | <a href="#">GitHub</a>                                                                | <b>Open</b> — implementation + model/resource ecosystem                                   |

# Eligible and Active Models

| Representational Family                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 |                                                       | Models         |            |               |            |                        |          |
|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-------------------------------------------------------|----------------|------------|---------------|------------|------------------------|----------|
|                                                                                                                                                                                                                                                                                                                                                                                                                                        | Earth-observation, environmental and urban-field GFMs | Prithvi-EO-2.0 | TerraMind  | Copernicus-FM | THOR       | AlphaEarth Foundations | TESSERA  |
|                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         |                                                       | Galileo        | AnySat     | Panopticon    | GeoLink*   | UrbanCLIP              | RobSense |
|                                                                                                                                                                                                                                                                                                                                                                                                                                        | Place-, object- and geovector-centric GFMs            | CityFM         | PlaceFM    | GeoLink*      | ReFound    |                        |          |
|                                                                                                                                                                                                                                                                                                                                                                                                                                        | 3D, cross-view and scene-centric GFMs                 | UrbanVLP       | UrbanLLaVA | GeoBridge     | 3DCity-LLM |                        |          |
|                                                                                                                                                                                                                                                                                                                                                                                                                                        | Spatiotemporal process, mobility and network GFMs     | UniST          | OpenCity   | BIGCity       | UniFlow    | UrbanDiT               |          |
|                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         |                                                       | UrbanFM        | UniTraj    | UrbanGPT      | MoRA       |                        |          |
|                                                                                                                                                                                                                                                                                                                                                                                                                                       | Geospatial language, knowledge and planning FMs       | CityGPT        | UrbanLLM   | PlanGPT       | PlanGPT-VL |                        |          |
| <div><div><div></div><div>VH</div><div>Very High</div><div>(substantial public updates or releases within ~1 month)</div></div><div><div></div><div>H</div><div>High</div><div>(within ~3 months)</div></div><div><div></div><div>M</div><div>Moderate</div><div>(within ~3–12 months)</div></div><div><div></div><div>L</div><div>Low</div><div>(largely static for &gt;12 months)</div></div><div><div></div><div>N/A</div><div>Not Assessable</div><div>(no public code repo or project page only)</div></div></div> |                                                       |                |            |               |            |                        |          |

\* GeoLink is relevant to both EO/field and geovector families.



**Project vitality** assessed on **15 August 2026** based on public repositories, model/data releases, dataset/embedding updates, documentation and other official ecosystem activity.

09/07/2026

# Eligible and Active Models

Selecting 6 models from the 5 families based on their vitality; both Terramind (model-centric, multimodal EO foundation-model approach) and Tessera (embedding-centric approach) were selected from family #1 because of their different approach

| Representational Family                                                             |                                                                                                                                                                                | Models                                                                                |                                     |                                                                                       |                                            |                                                                                       |                                                 |                                                                                       |                                                                         |
|-------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------|-------------------------------------|---------------------------------------------------------------------------------------|--------------------------------------------|---------------------------------------------------------------------------------------|-------------------------------------------------|---------------------------------------------------------------------------------------|-------------------------------------------------------------------------|
|    | Earth-observation, environmental and urban-field GFMs                                                                                                                          | Prithvi-EO-2.0                                                                        | TerraMind                           | Copernicus-FM                                                                         | THOR                                       | AlphaEarth Foundations                                                                | TESSERA                                         |                                                                                       |                                                                         |
|                                                                                     |                                                                                                                                                                                | Galileo                                                                               | AnySat                              | Panopticon                                                                            | GeoLink*                                   | UrbanCLIP                                                                             | RobSense                                        |                                                                                       |                                                                         |
|    | Place-, object- and geovector-centric GFMs                                                                                                                                     | CityFM                                                                                | PlaceFM                             | GeoLink*                                                                              | ReFound                                    |                                                                                       |                                                 |                                                                                       |                                                                         |
|    | 3D, cross-view and scene-centric GFMs                                                                                                                                          | UrbanVLP                                                                              | UrbanLLaVA                          | GeoBridge                                                                             | 3DCity-LLM                                 |                                                                                       |                                                 |                                                                                       |                                                                         |
|    | Spatiotemporal process, mobility and network GFMs                                                                                                                              | UniST                                                                                 | OpenCity                            | BIGCity                                                                               | UniFlow                                    | UrbanDiT                                                                              |                                                 |                                                                                       |                                                                         |
|                                                                                     |                                                                                                                                                                                | UrbanFM                                                                               | UniTraj                             | UrbanGPT                                                                              | MoRA                                       |                                                                                       |                                                 |                                                                                       |                                                                         |
|   | Geospatial language, knowledge and planning FMs                                                                                                                                | CityGPT                                                                               | UrbanLLM                            | PlanGPT                                                                               | PlanGPT-VL                                 |                                                                                       |                                                 |                                                                                       |                                                                         |
|  | <b>VH</b> Very High<br>(substantial public updates or releases within ~1 month)                                                                                                |  | <b>H</b> High<br>(within ~3 months) |  | <b>M</b> Moderate<br>(within ~3–12 months) |  | <b>L</b> Low<br>(largely static for >12 months) |  | <b>N/A</b> Not Assessable<br>(no public code repo or project page only) |
| * GeoLink is relevant to both EO/field and geovector families.                      |                                                                                                                                                                                |                                                                                       |                                     |                                                                                       |                                            |                                                                                       |                                                 |                                                                                       |                                                                         |
|  | Project vitality assessed on 15 August 2026 based on public repositories, model/data releases, dataset/embedding updates, documentation and other official ecosystem activity. |                                                                                       |                                     |                                                                                       |                                            |                                                                                       |                                                 |                                                                                       |                                                                         |

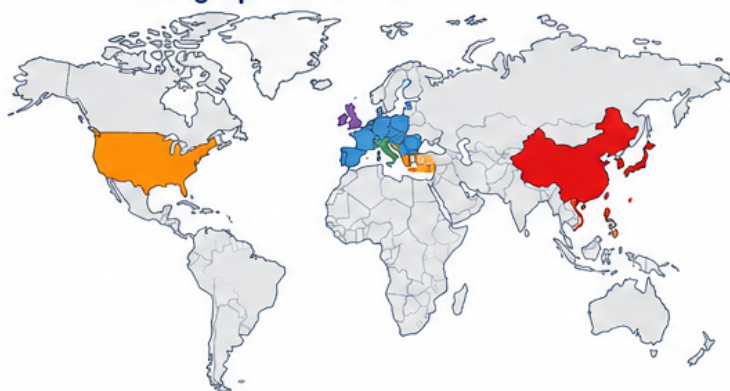


# Urban Foundation Models (UFMs): Main Contributing Countries & Supporting Organisations



| <b>TerraMind (PANGAEA)</b><br> Pan-European (no single country lead)<br>  <br>  <br> <b>Principal Organisations</b> <ul style="list-style-type: none"> <li>• ESA Φ-lab</li> <li>• IBM Research Europe</li> <li>• FAST-EO consortium (DLR-MF, Forschungszentrum Jülich, KP Labs)</li> <li>• ETH Zürich</li> <li>• NASA IMPACT</li> <li>• University of Iceland</li> </ul> | <b>TESSERA</b><br> United Kingdom (major contributor)<br> USA (dClimate Labs)  Finland (Aalto Univ.)<br> <b>Principal Organisations</b> <ul style="list-style-type: none"> <li>• University of Cambridge</li> <li>• dClimate Labs (USA)</li> <li>• Aalto University (Finland)</li> <li>• University of Bristol</li> <li>• NVIDIA (TESSERA v2)</li> </ul> | <b>GeoLink</b><br> China (major contributor)<br> Switzerland (EPFL)<br> <b>Principal Organisations</b> <ul style="list-style-type: none"> <li>• Peking University (Earth &amp; Space Sciences; Urban &amp; Environmental Sciences)</li> <li>• Institute of Automation, Chinese Academy of Sciences</li> <li>• EPFL (Switzerland)</li> </ul> | <b>GeoBridge</b><br> China (all contributors)<br> <b>Principal Organisations</b> <ul style="list-style-type: none"> <li>• Jilin University</li> <li>• Wuhan University</li> <li>• Zhongguancun Academy</li> <li>• State Key Laboratory of Information Engineering in Surveying, Mapping and Remote Sensing (Wuhan Univ.)</li> </ul> | <b>UrbanFM</b><br> China (Guangzhou & Hong Kong SAR)<br> <b>Principal Organisations</b> <ul style="list-style-type: none"> <li>• The Hong Kong University of Science and Technology (Guangzhou) – HKUST(GZ)</li> <li>• The Hong Kong University of Science and Technology – HKUST</li> </ul> | <b>PlanGPT-VL</b><br> China (all contributors)<br> <b>Principal Organisations</b> <ul style="list-style-type: none"> <li>• Behavioral and Spatial AI Lab (BSAI Lab)</li> <li>• Peking University &amp; Tongji University</li> <li>• Southern University of Science and Technology</li> </ul> |
|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|

## Overall Geographic Pattern



-  China leads: GeoLink, GeoBridge, UrbanFM, PlanGPT-VL
-  United Kingdom leads: TESSERA
-  Multinational European collaboration: TerraMind (IBM-ESA / FAST-EO)
-  Switzerland contributes: TerraMind (major hub) & GeoLink
-  Other contributors: USA, Finland, Italy, Poland, Iceland

## Key Takeaways

-  China is the largest overall contributor, leading 4 of the 6 models.
-  The UK leads TESSERA, mainly through the University of Cambridge.
-  TerraMind is a pan-European (IBM-ESA/FAST-EO) collaboration with major hubs in Switzerland, Germany and Italy.
-  GeoLink has a Swiss component; TESSERA has limited US and Finnish participation.

# Robustness of the UFM evaluation across three LLMs

(Evaluators: GPT H · Claude Opus 5 H (run by L. Biagi) · Gemini 3.7 Flash (run by Q. Xu))

|                        | G1 | G2 | G3 | G4 | G5 | G6 | G7 | G8 | G9 | G10 | G11 | F1 | F2 | F3 | F4 | F5 | F6 | F7 | F8 |
|------------------------|----|----|----|----|----|----|----|----|----|-----|-----|----|----|----|----|----|----|----|----|
| Count of Max Diff. = 0 | 2  | 4  | 0  | 4  | 4  | 4  | 1  | 3  | 3  | 1   | 2   | 1  | 2  | 1  | 1  | 1  | 3  | 2  | 1  |
| Count of Max Diff. = 1 | 4  | 2  | 3  | 2  | 2  | 2  | 4  | 3  | 3  | 3   | 3   | 5  | 3  | 5  | 5  | 5  | 3  | 4  | 4  |
| Count of Max Diff. = 2 | 0  | 0  | 3  | 0  | 0  | 0  | 1  | 0  | 0  | 2   | 1   | 0  | 1  | 0  | 0  | 0  | 0  | 0  | 1  |
| Count of Max Diff. = 3 | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 0   | 0   | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 0  |
| Count of Max Diff. = 4 | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 0   | 0   | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 0  |

92% of cases have Max Diff ≤ 1

41 Max Diff = 0

64 Max Diff = 1

9 Max Diff = 2

0 Max Diff = 3

- G3

**Spatial dependence and geographic non-stationarity** – Representation of neighbourhood effects, spatial dependence and geographically varying relationships (TerraMind, GeoBridge, UrbanFM)
- G10

**Spatial and social fairness** – Evaluation and mitigation of disparities across territories, populations and data-coverage conditions (TerraMind, TESSERA)

# Comparison of the UFM evaluation across three LLMs

(Evaluators: GPT H · Claude Opus 5 H (ran by L. Biagi) · Gemini 3.7 Flash ran by Q. Xu)

CONSENSUS SCORE PROFILE Mean ± Std Dev across GPT, Gemini and Claude

|             |             |             |             |
|-------------|-------------|-------------|-------------|
| TerraMind G | TerraMind F | GeoBridge G | GeoBridge F |
| 1.91±0.99   | 2.79±1.14   | 1.58 ±1.06  | 2.33±0.59   |
| TESSERA G   | TESSERA F   | UrbanFM G   | UrbanFM F   |
| 1.70±1.05   | 2.75±1.07   | 1.91±1.00   | 2.13±0.82   |
| GeoLink G   | GeoLink F   | PlanGPT G   | PlanGPT F   |
| 2.00±0.77   | 2.33±0.85   | 2.03±0.66   | 2.75±0.50   |

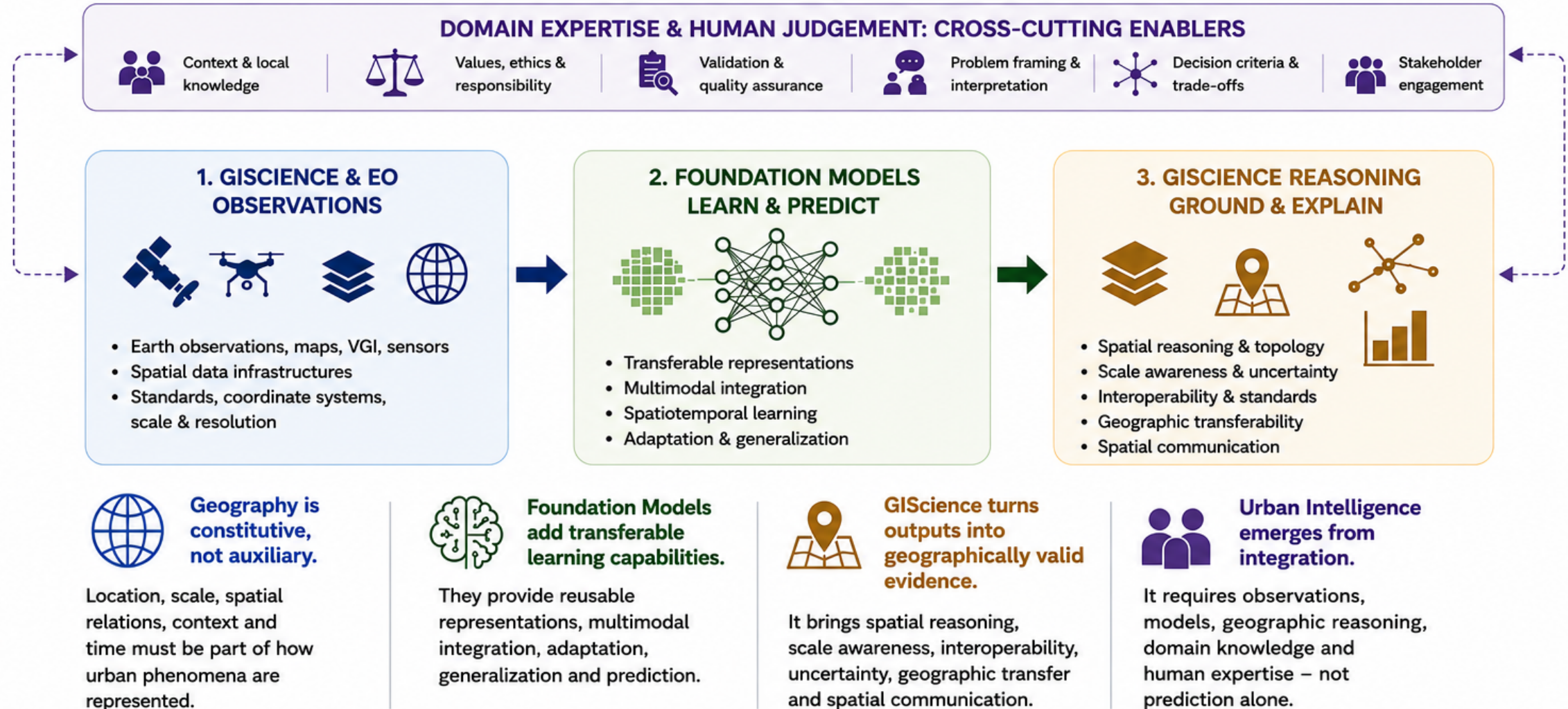
All-models  
G = 1.70 ± 0.80  
F = 2.28 ± 0.79

| Model                | Evaluator | G1 | G2 | G3 | G4 | G5 | G6 | G7 | G8 | G9 | G10 | G11 | F1 | F2 | F3 | F4 | F5 | F6 | F7 | F8 |
|----------------------|-----------|----|----|----|----|----|----|----|----|----|-----|-----|----|----|----|----|----|----|----|----|
| GeoBridge (Family 3) | max diff  | 1  | 0  | 2  | 0  | 0  | 0  | 0  | 1  | 0  | 1   | 1   | 1  | 1  | 1  | 1  | 0  | 1  | 1  | 0  |

## What could the GIScience-Centred Evaluation Show?

- No single UFM is universally “best”; substantial room remains for improving their suitability across different urban applications and geographic contexts.
- **Geospatial data  $\neq$  geospatial intelligence.**  
Using EO, maps, coordinates, or trajectories does not automatically mean that a model explicitly understands **location, scale, topology, spatial dependence, or geographic context.**
- **GIScience maturity and FM maturity are different.**
- **Suggestions and comments on the framework are more than welcome**

# Conclusions



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Alberta  
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Ludovico  
Biagi



Giovanna  
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Daniele  
Oxoli



Vasil  
Yordanov



Alberto  
Vavassori



Afshin  
Moazzam



Polychronis  
Kolokoussis



Keerthana  
Kirubakaran



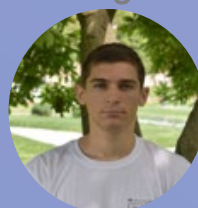
Xiao Tan



Erfan  
Eshghollahi



Matej  
Žgela



Qiongjie  
Xu



Nikolina  
Zallem



Quang Huy  
Nguyen



Merceline  
Ojwala



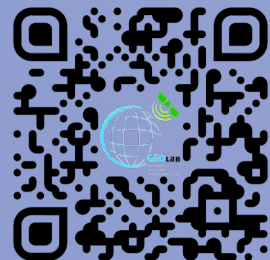
Julia  
Leonardi



Xiangyang  
Song



# @Research on GEOAI at PolIMI





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UNIVERSITY OF BANJA LUKA  
АРХИТЕКТОНСКО-ГРАЂЕВИНСКО-ГЕОДЕТСКИ ФАКУЛТЕТ  
FACULTY OF ARCHITECTURE, CIVIL ENGINEERING AND GEODESY



Introduction to Geospatial Artificial Intelligence

Gordana Jakovljević, Miro Govedarica, Maria Antonia Brovelli

## INTRODUCTION TO GEOSPATIAL AI

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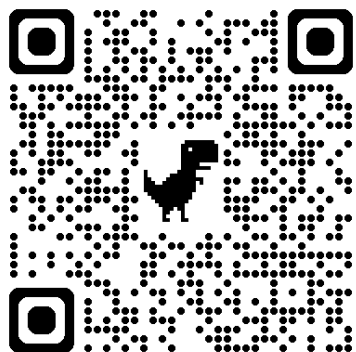


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# Thanks for your attention

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