# A Mathematical Theory of Communication

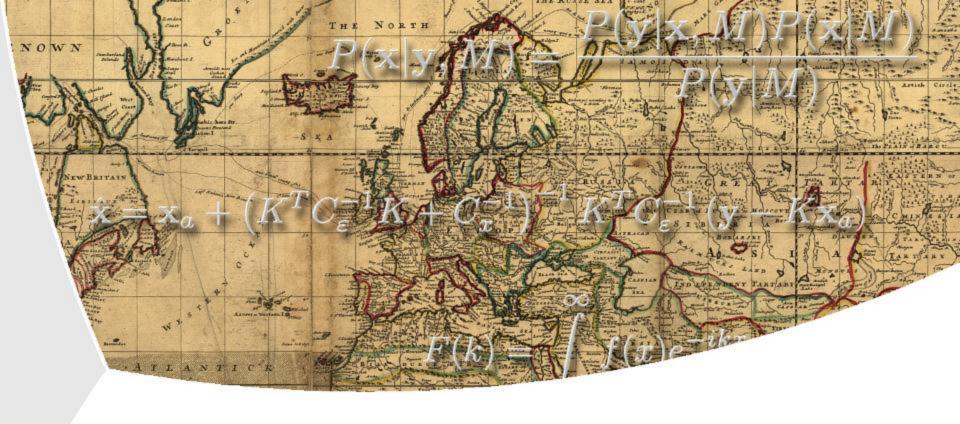
By C. E. SHANNON

### Introduction

THE recent development of various methods of modulation such as PCM and PPM which exchange bandwidth for signal-to-noise ratio has intensified the interest in a general theory of communication. A basis for such a theory is contained in the important papers of Nyquist and Hartley on this subject. In the present paper we will extend the theory to include a number of new factors, in particular the effect of noise in the channel, and the savings possible due to the statistical structure of the original message and due to the nature of the final destination of the information.

The fundamental problem of communication is that of reproducing at one point either exactly or approximately a message selected at another point. Frequently the messages have meaning; that is they refer to or are correlated according to some system with certain physical or conceptual entities. These semantic aspects of communication are irrelevant to the engineering problem. The significant aspect is that the actual message is one selected from a set of possible messages. The system must be designed to operate for each possible selection, not just the one which will actually be chosen since this is unknown at the time of design.

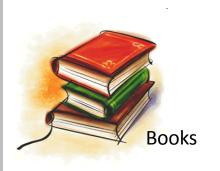




Media semantic content extraction: the perspectives

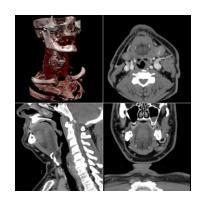
Prof. Mihai Datcu





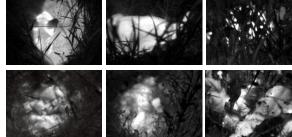


Photos and handdrawn images (Corel)

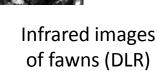


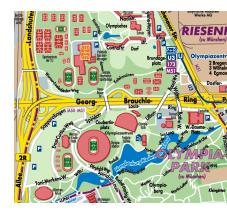
Tomography





Video frames (Run, Lola, Run)

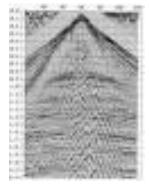




Maps



Genome



Seismic records



Satellite images



### The data archive



### The meta - data

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### The data





### **Istoric**

1989 - Tim Berners-Lee (poza) propune si realizeaza prima comunicare HTTP (Hypertext Transfer Protocol) server-client. El folosea deja existentul Internet. Se naste WWW (World Wide Web)

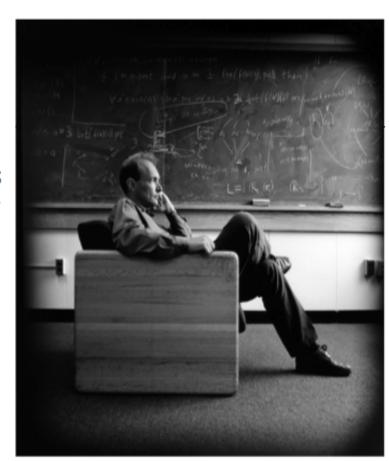
WWW – sistem global de documente hypertext interconectate logic;

Internet – sistem global de retele de computere interconectate fizic; TCT/IP – set de protocoale de comunicare intre sistemele de calcul din Internet;

1990: 2001 – WWW este referit, retroactiv, drept Web 1.0 Caracteristici pricipale: Pagini statice; folosirea de: frameseturi, extensii HTML, butoane GIF, guestbook-uri on line, etc.

2002 : prezent – www este referit drept Web 2.0

Caracteristici pricipale: Pagini (mai) dinamice; aplicatii care permit schimbul interactiv de informatii, interoperabilitate, etc.



~2006: prezent – apare, lansat de acelasi *Tim Berners-Lee*, si evolueaza conceptul

de Web 3.0 (urmatoarea "epoca" a WWW)

Caracteristici pricipale: Pagini dinamice; Semantica; Personalizare;



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### Introduction

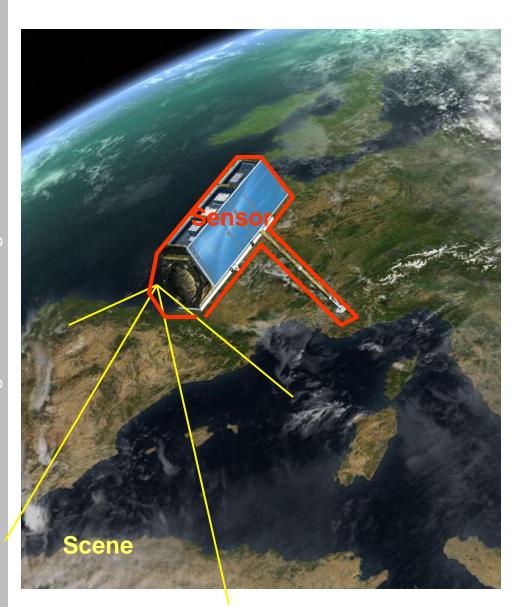
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# and Image Understanding for Earth Observation Competence Centre on Information Extraction

# **Data, Content and Knowledge**

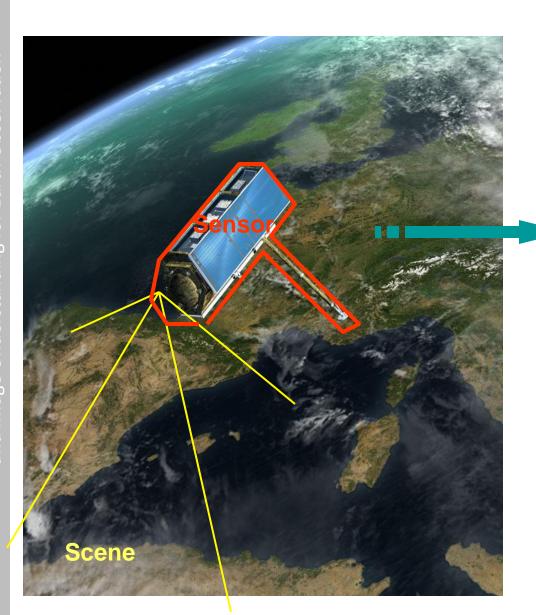


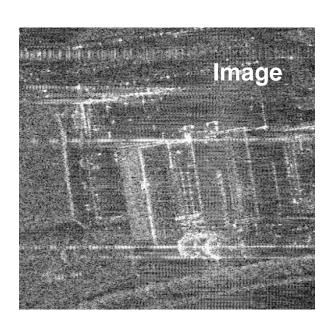


# and Image Understanding for Earth Observation Competence Centre on Information Extraction

# Data, Content and Knowledge



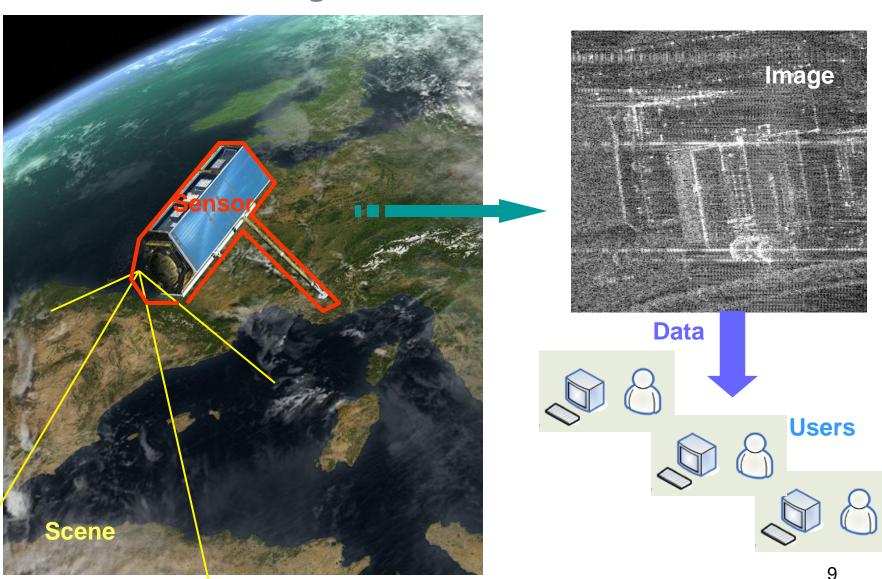




# Data, Content and Knowledge

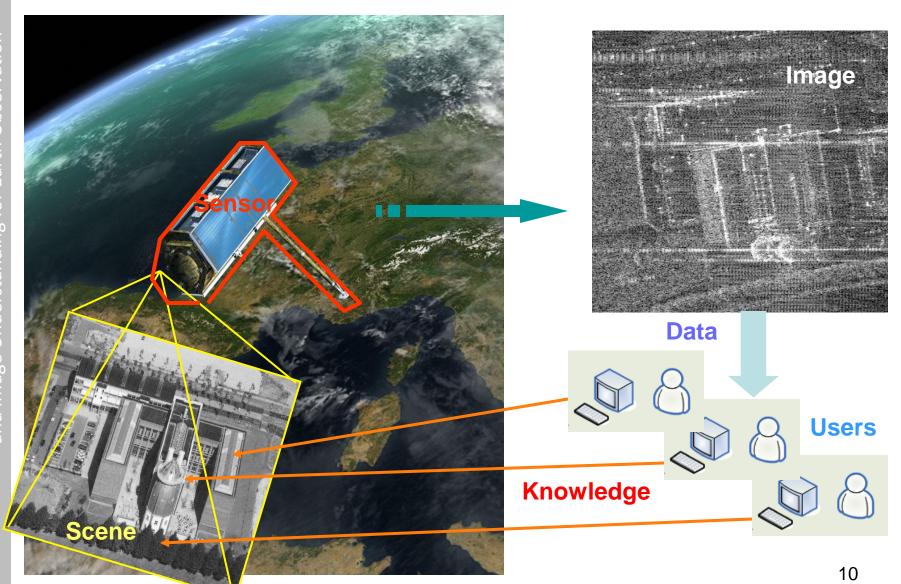


# How EO is working?



# **Data, Content and Knowledge**





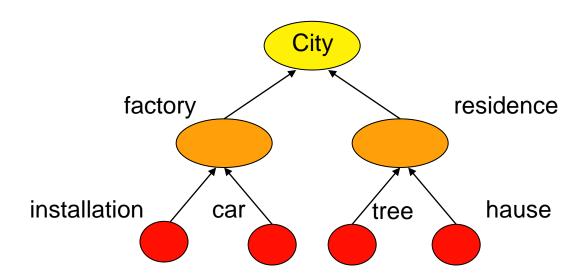
# **Understanding and semantics**



- Roots of understanding
  - Content => semantic => ontology
  - Grand challenge interoperability of semantics
  - Communication between machines vs communication between individuals
  - Syntactic metadata vs Semantic metadata vs semiotic metadata (Umberto Ecco)
  - Semiotics



Semantic compositionality: the meaning of a hole is a function of the meanings of its parts and their mode of syntactic combination





# Symbolic synonymy





# Symbolic synonymy





# Symbolic synonymy





- 1974 at the Office of Naval Research
- a boiler explosion on a distroyer
- the boiler was the problem for other accidents
- data/information existed, but was ignored
- no tools to find patterns
- R&D program to discover such problems



### What is data mining?

Data created by people

- A process of sorting through a large amount of data and picking out relevant information.
- Data => information => knowledge => actionable intelligence (understanding)



### What is information mining?

Data created by sensor

- Data understanding from **Observation**: A contextual approach
  - Creation of contextual understanding from data.
  - Sensor Data => models working on data create information (content) => contextual knowledge about geopolitical and socioeconomic factors => actionable intelligence at the local level (understanding)
- How does data mining build knowledge? Memory, communication, pattern recognition
- Challenge is to understand data and to have all data accessible Issues – formats, etc.



Information must be obtained from the data

Databases and search engines were not designed to

provide contents

**Visualization** is very important

**HMI** are crucial

Words – signals – semantics

Visual – perception – cognition

Memory – latency – knowledge - relevance

## **Archives and Libraries**



- Archive: a long-term storage area, place or collection containing records, documents, or other materials of historical interest (that's passive and static!)
- Library: a depository built to contain books and other materials for reading and study (that's active and dynamic!)

### What makes the difference?

- Library has:
  - A catalogue (better then archives): indexing books based on multiple criteria, e.g. author, title, keywords, domains (ontology!)...
  - A librarian: one who has the care of a library and its contents, selecting
    the books, documents and non-book materials which comprise its
    collection, and providing information and loan services to meet the needs
    of its users

# **Searching Libraries**



- Use the catalogue: select indexes and search the books. Next, read them.
- Walk trough the library: browse till you get interested...
- A friend told me...: go to the material using prior information
- Ask the librarian: the ideal librarian, he
  - reads all the incoming books
  - interprets contents
  - associate with other information
  - creates categories
  - understand the inquiry
  - dialogues
  - comments, and
  - suggest ...

### **Knowledge based Image Information Mining TSX Ground Segment Systems**



Integrated in operational environments Image Information Mining (IIM) technologies for enhanced information content extraction from EO image archives. Operate the new functionalities in the TerraSAR-X Payload GS.

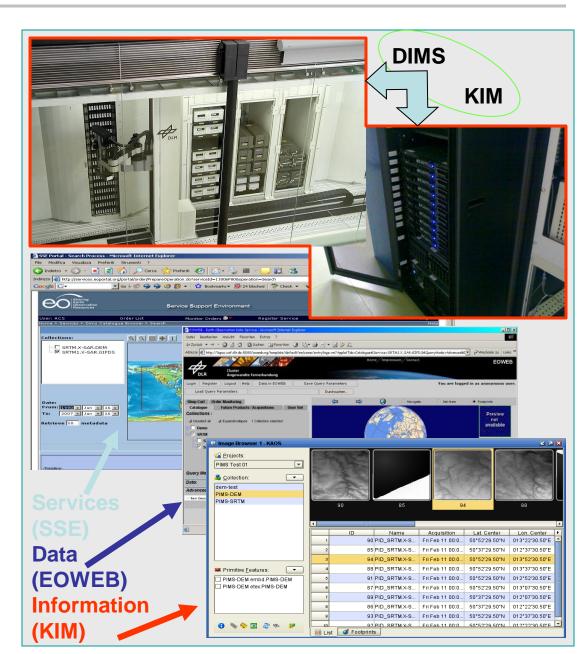
**Method:** Interface of DIMS and KIM systems. Extend the DIMS product catalogue with the semantic and image feature catalogues of KIM. Provide IIM functions.

### **Applications:**

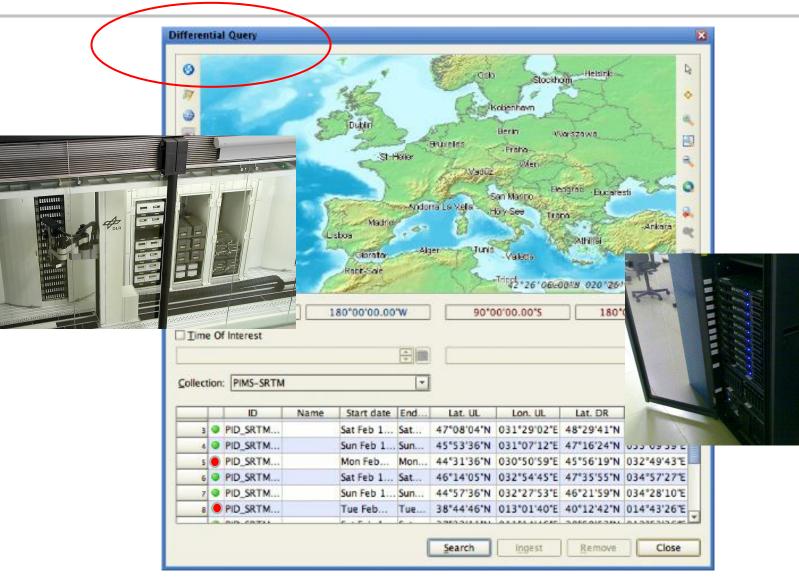
- concurrent queries of DIMS and KIM catalogue
- interactive selection of EO products information content
- IIM functions (explore, semantic annotation, detection-discovery, etc.)
- new generations of GS systems

### **Envisaged missions:**

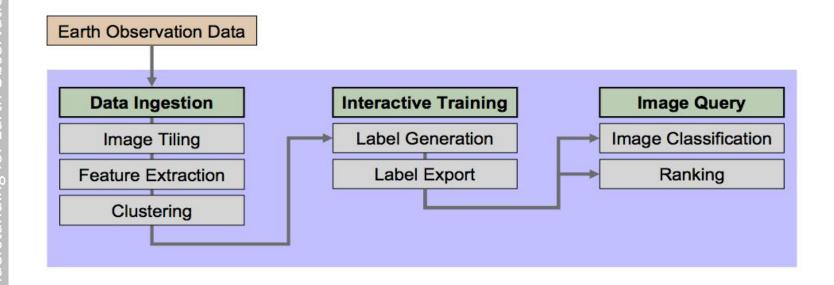
- TerraSAR-X, TanDEM-X
- SRTM
- MERIS
- GMES

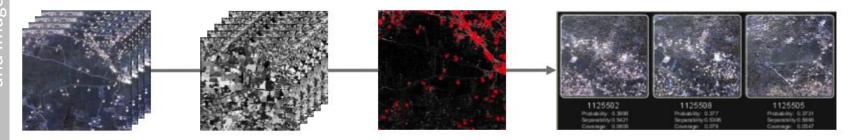










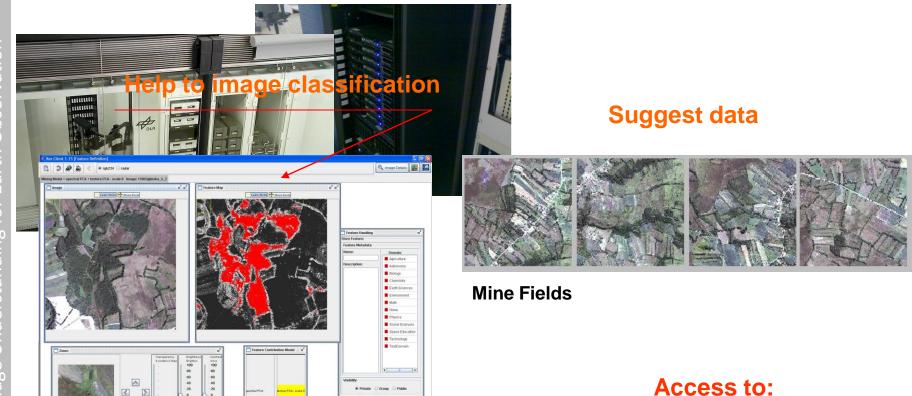


### Today: Interactive, user adapted, EO data content access



information

knowledge



**Knowledge share** 

Help to image understanding

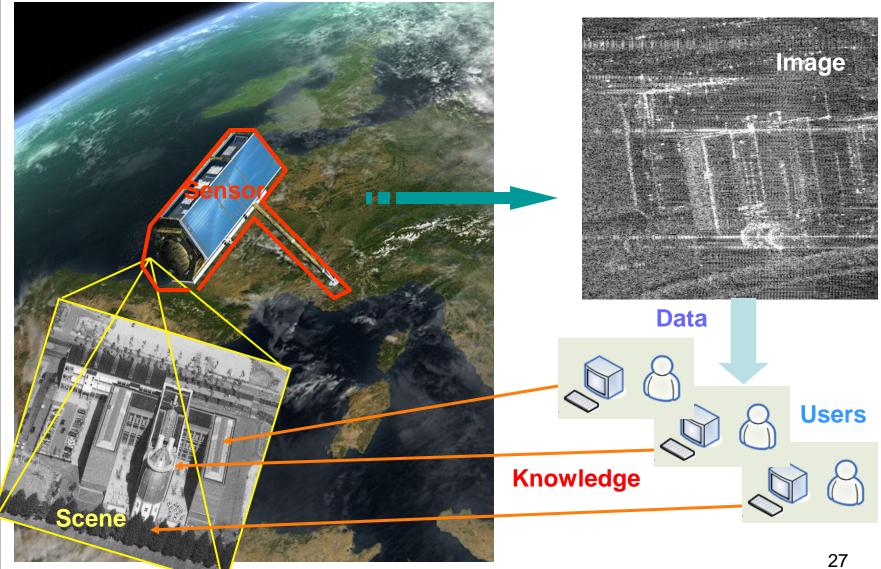


## **Advances in Image and Heterogeneous Data Mining**

The Image Librarian

# **Data, Content and Knowledge**







# Rationale

 An observation, strictly, is only a sensation. ... But as soon as we go beyond sensations we are making inferences. (Jeffreys)



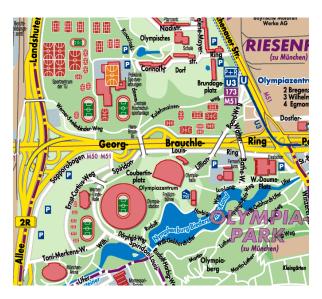
### **Data Structure**

@image{filename [ width [ height [ alttext [ extension]]]]}



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@image{filename [ width [ height [ alttext [ extension]]]]}



Signs & Symbols



### @image{filename [ width [ height [ alttext [ extension]]]]}



Signs & Symbols

### **Data Structure**

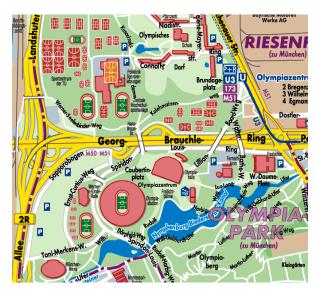


**Image** 



### **Data Structure**

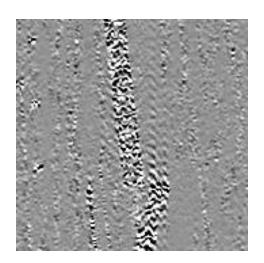
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Signs & Symbols



**Image** 



Signal



### Rationale

- An observation, strictly, is only a sensation. ... But as soon as we go beyond sensations we are making inferences. (Jeffreys)
- Signals, signs, symbols: images are messages



# Scene meaning inferred from images





# Scene meaning inferred from images

Jail





# Scene meaning inferred from images

### Villas





- An observation, strictly, is only a sensation. ... But as soon as we go beyond sensations we are making inferences. (Jeffreys)
- Signals, signs, symbols: images are messages
- Meaning depends on components



**Buildings** 





Agriculture Fields





- An observation, strictly, is only a sensation. ... But as soon as we go beyond sensations we are making inferences. (Jeffreys)
- Signals, signs, symbols: images are messages
- Meaning depends on components
- Meaning depends on spatial context



**Circular Forest** 

Landsat 30 m resolution





#### **Nuclear Facility**



0.6 resolution



- An observation, strictly, is only a sensation. ... But as soon as we go beyond sensations we are making inferences. (Jeffreys)
- Signals, signs, symbols: images are messages
- Meaning depends on components
- Meaning depends on spatial context
- Meaning depends on resolution



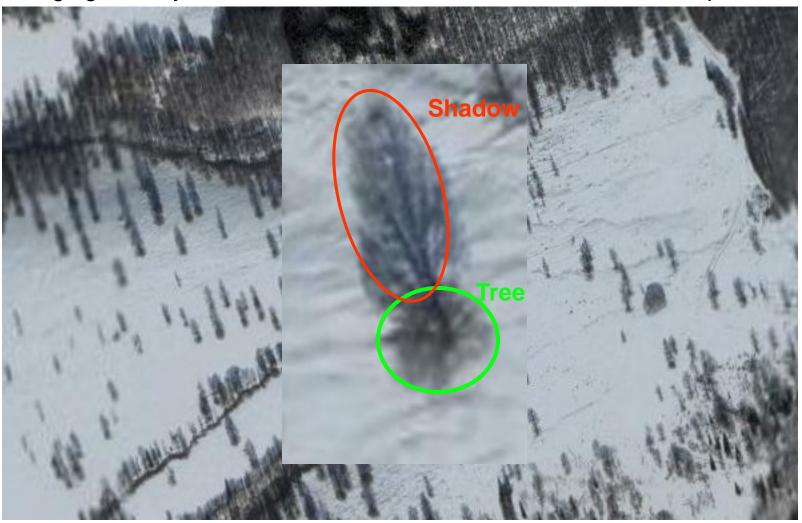
Winter Landscape: Pine





Image geometry context

Winter Landscape: Oak

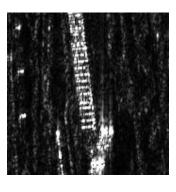




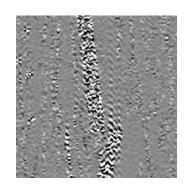
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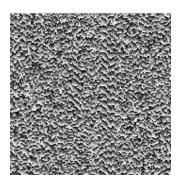
Building: aggregation of signal components



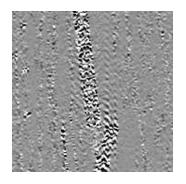
Amplitude



Real channel



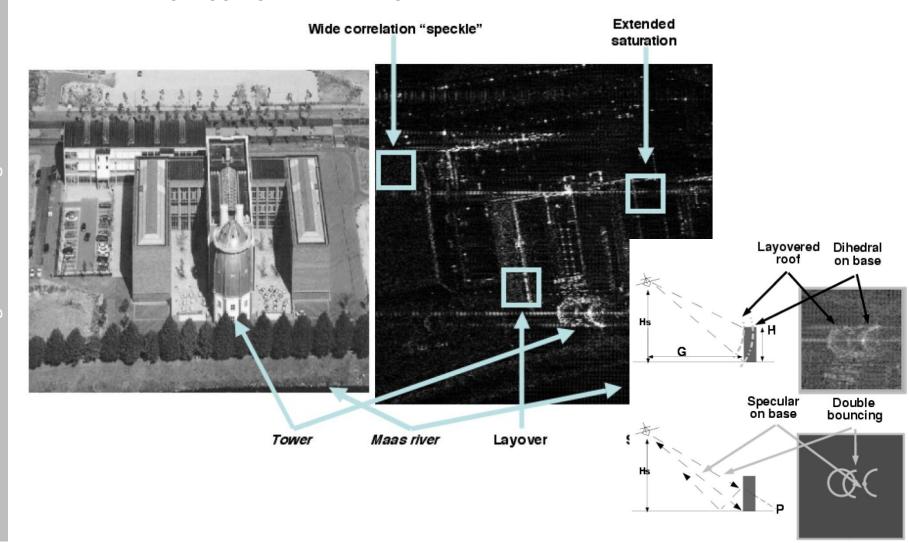
Phase



Imaginary channel



Building: aggregation of image components

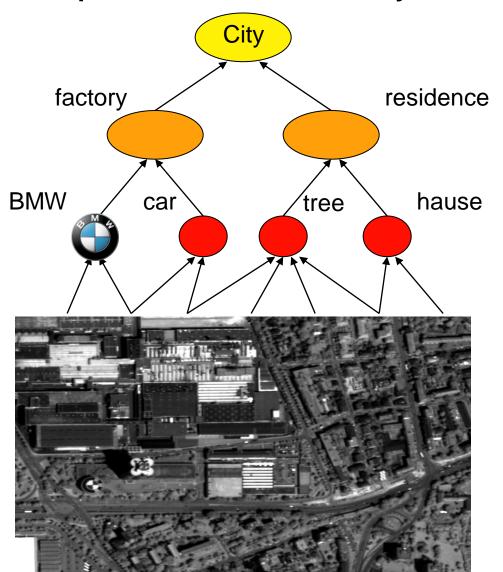




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- Signals, signs, symbols: images are messages
- Meaning depends on components
- Meaning depends on spatial context
- Meaning depends on resolution
- Meaning depends on imaging geometry
- Meaning depends on perceptual context
- Meaning depends on temporal context
- Meaning depends on signal components

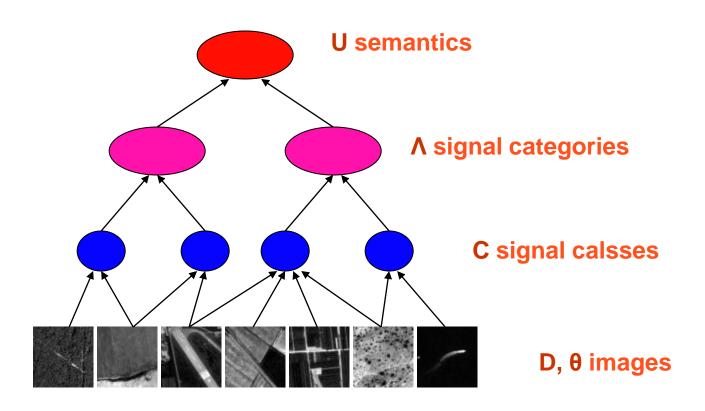


Semantic compositionality: the meaning of a hole is a function of the meanings of its parts and their mode of syntactic combination





## **Image Semantics Generative Model**





## The syntax

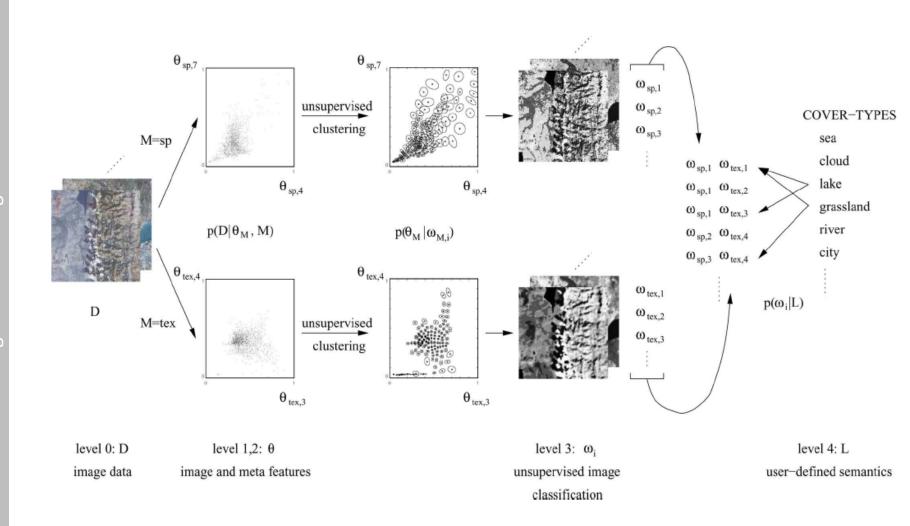
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**PERFECT PRESENT** 

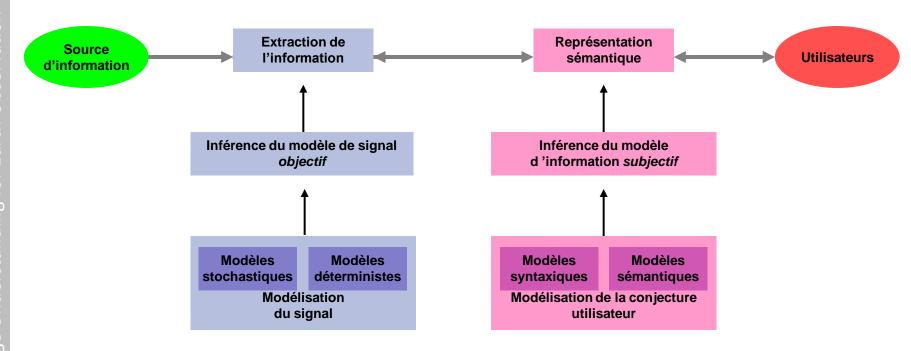


#### KIM hierarchical information representation: coding





#### CONCEPT DE COMMUNICATION AVANCE

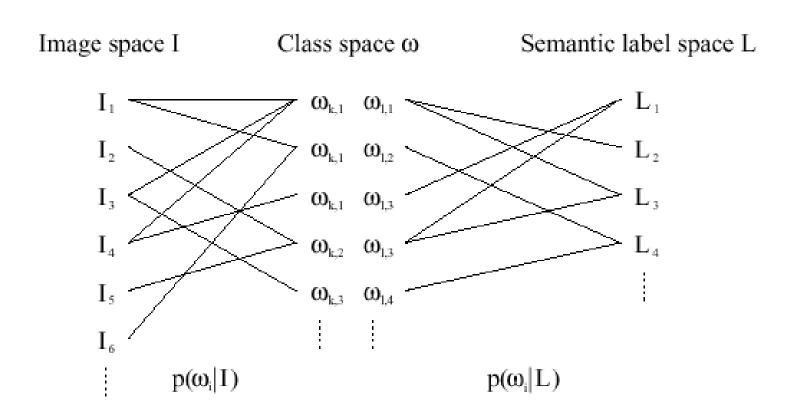


#### The principle of semantic compositionality:

the meaning of a whole is a function of the meanings of its parts and their mode of syntactic combination

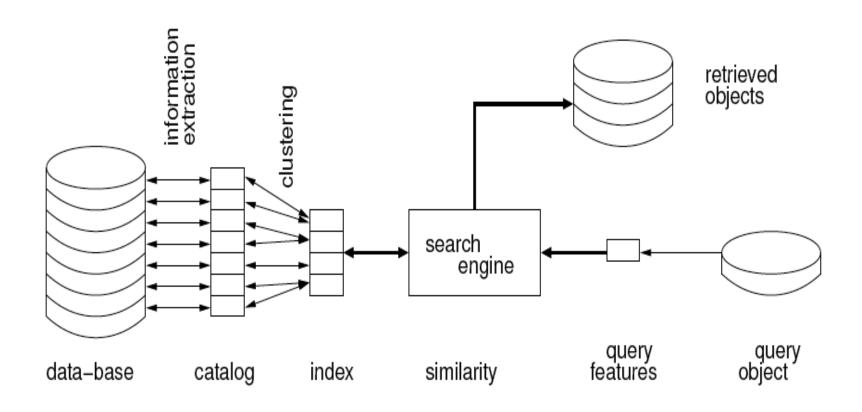


## **Coding**





### **Coding and Data Bases**



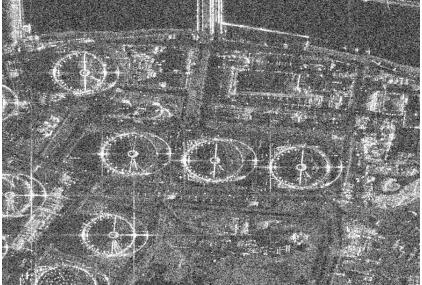
the structure of an indexed data-base and how the search engine uses this structure to find similar objects





## Oil storage tanks, Singapore









## TerraSAR-X: Ship Recognition

