

# **Turbulence Numerical Model as a Research Tool**

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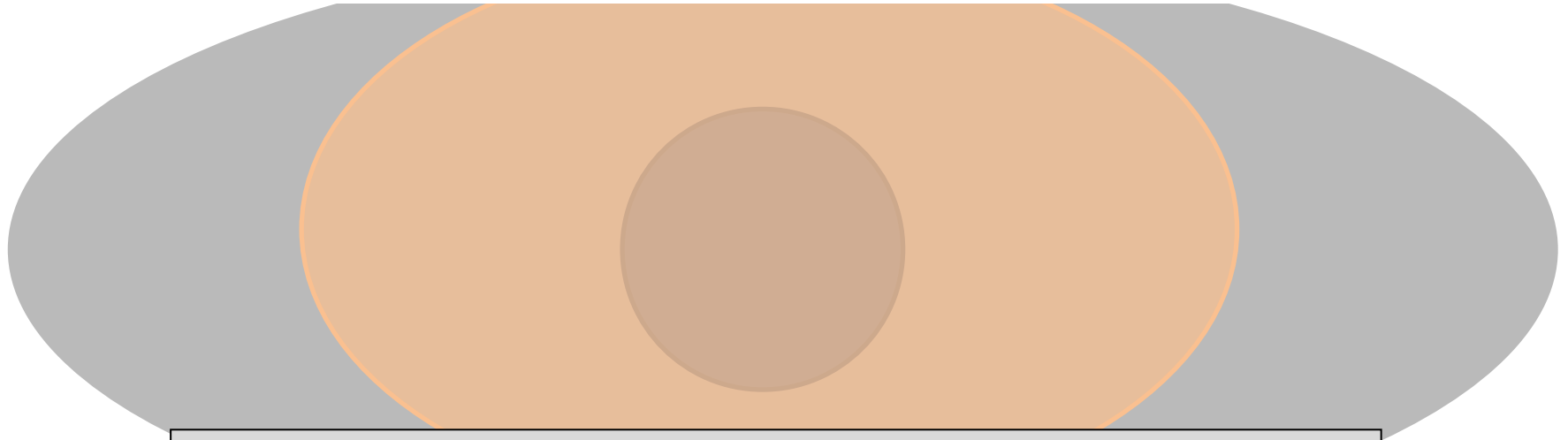
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# Objectives

- Discuss numerical modeling of turbulence in terms of **philosophical concepts**
- Consider cultural aspects of modeling and its impact on result interpretation
- Illustrate shift of paradigms in turbulence research facilitated by modeling
- **My ultimate objective is to highlight emergence of meaning out a set of numbers**

# Part I: Philosophical Frameworks

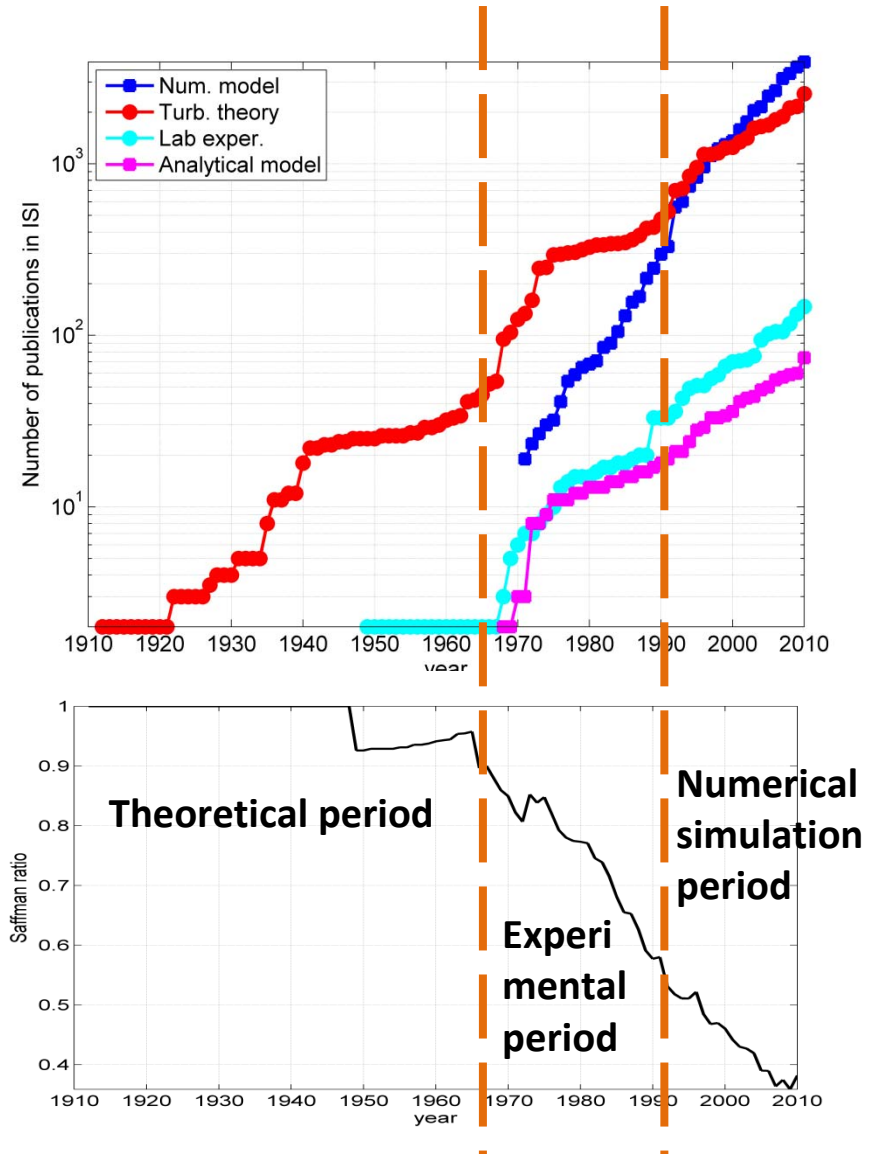
# Philosophical Concepts of Scientific Endeavor



Open systems in **post-modern, post-positivist** formulation  
Formulations unclear and incomplete  
Models are non-deterministic  
Not only data in IBC are uncertain but also the systems themselves  
Evidences are ambiguous or absent; values fluid and in change  
Science develops in democratic way through consensus discussion  
Continues shift of popular subjects and fashions

# Disciplinary Positivism in Crisis

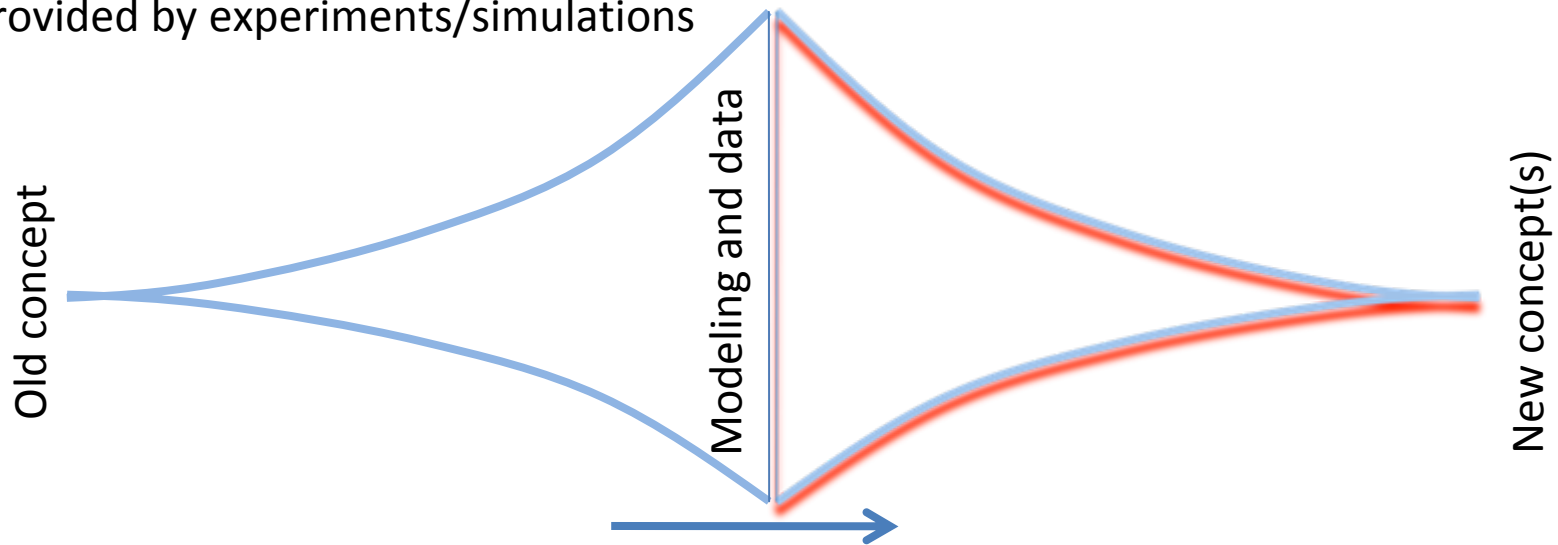
- **Positivism in normal science (T. Kuhn)**
  - A set of epistemological perspectives and philosophies of science which hold that the scientific method is the best approach to uncovering the processes by which both physical and human events occur
- Positivist seeks for **quantitative data (numbers)** to falsify existing hypotheses
- Positivist's final goal is to **predict**
- Positivism does not explain (I. Lakatos)
  - Where those hypotheses come from
  - How do they emerge and mature
- Disciplinary crisis occur without a fresh inflow of **new conceptual qualitative ideas**
- Illustration: A linear (S trend  $-0.012/\text{yr}$ ) drop of the Saffman ratio (Tsinober, 2009) in the turbulence research since mid-60s



# On the Way Out of Crisis

Disciplinary crisis is obvious ...

To resolve the crisis, one must design a way to generate new concepts out of data provided by experiments/simulations



This design is addressed by qualitative or interpretive approach inherently linked to the post-modern, post-positivist paradigm (Quantz, 1992)

By coincidence (?), the first understanding of the positivist crisis and attempts to find a way out have been published in 1960s, e.g. Glaser, B. G., & Strauss, A. L. (1967). *The discovery of grounded theory*. Chicago, IL: Aldine Publishing Company

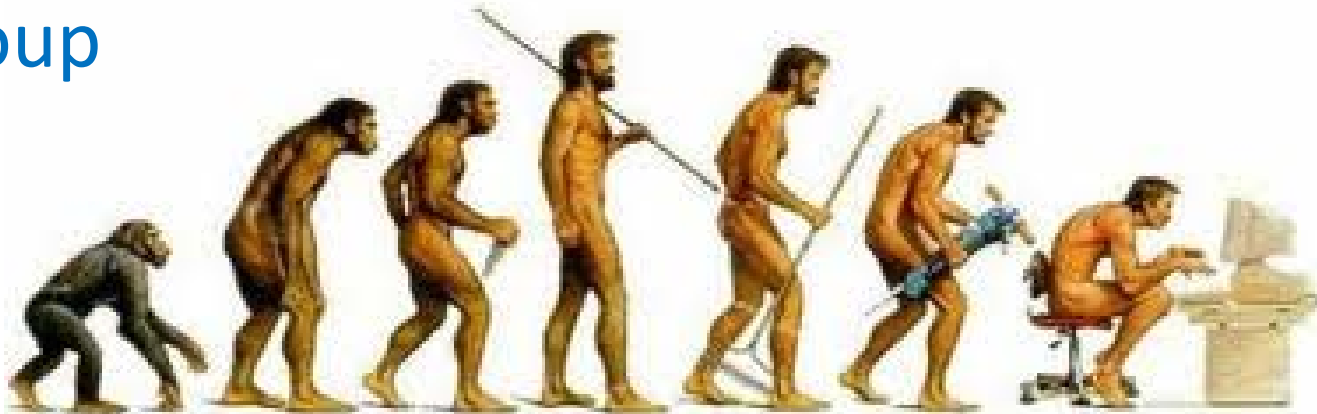
# Qualitative versus Quantitative Approach

POSITIVIST APPROACH	INTERPRETIVIST APPROACH
<p><i>Assumptions</i></p> <ul style="list-style-type: none"> <li>• Social facts have an objective reality</li> <li>• Variables can be identified and relationships measured</li> </ul>	<p><i>Assumptions</i></p> <ul style="list-style-type: none"> <li>• Reality is socially constructed</li> <li>• Variables are complex, interwoven, and difficult to measure</li> </ul>
<p><i>Research Purposes</i></p> <ul style="list-style-type: none"> <li>• Generalizability</li> <li>• Causal explanations</li> <li>• Prediction</li> </ul>	<p><i>Research Purposes</i></p> <ul style="list-style-type: none"> <li>• Contextualization</li> <li>• Understanding</li> <li>• Interpretation</li> </ul>
<p><i>Research Approach</i></p> <ul style="list-style-type: none"> <li>• Begins with hypotheses and theory</li> <li>• Uses formal instruments</li> <li>• Experimental</li> <li>• Deductive</li> <li>• Component analysis</li> <li>• Seeks the norm</li> <li>• Reduces data to numerical indices</li> <li>• Uses abstract language in write-up</li> </ul>	<p><i>Research Approach</i></p> <ul style="list-style-type: none"> <li>• May result in hypotheses and theory</li> <li>• Researcher as instrument</li> <li>• Naturalistic</li> <li>• Inductive</li> <li>• Searches for patterns</li> <li>• Seeks pluralism, complexity</li> <li>• Makes minor use of numerical indices</li> <li>• Descriptive write-up</li> </ul>
<p><i>Researcher Role</i></p> <ul style="list-style-type: none"> <li>• Detachment</li> <li>• Objective portrayal</li> </ul>	<p><i>Researcher Role</i></p> <ul style="list-style-type: none"> <li>• Personal involvement</li> <li>• Empathic understanding</li> </ul>

EXHIBIT 1.1 Predispositions of Positivist and Interpretivist Approaches to Research

# Culture

- (definition from Wiki) – An integrated pattern of human knowledge, belief, and behavior that depends upon the capacity for symbolic thought and social learning; The set of shared attitudes, values, goals, and practices that characterizes an institution, organization or group





# Narrow the Perspective: Numerical Modeling (Simulations)

- Culture of Calculation
  - Numbers are the meaning
  - Models justified by affirmation of theory
  - Observations are objective and external
  - Science ends with model development
  - Model goal is to predict
  - Model accuracy can be always improved
- Culture of Simulations
  - Numbers are meaningless
  - Models justified by new relationships
  - Observations are another kind of models
  - Science begins with model development
  - Model goal is to understand
  - Model accuracy may not improve

Search for meaning of numbers and consensus of meanings

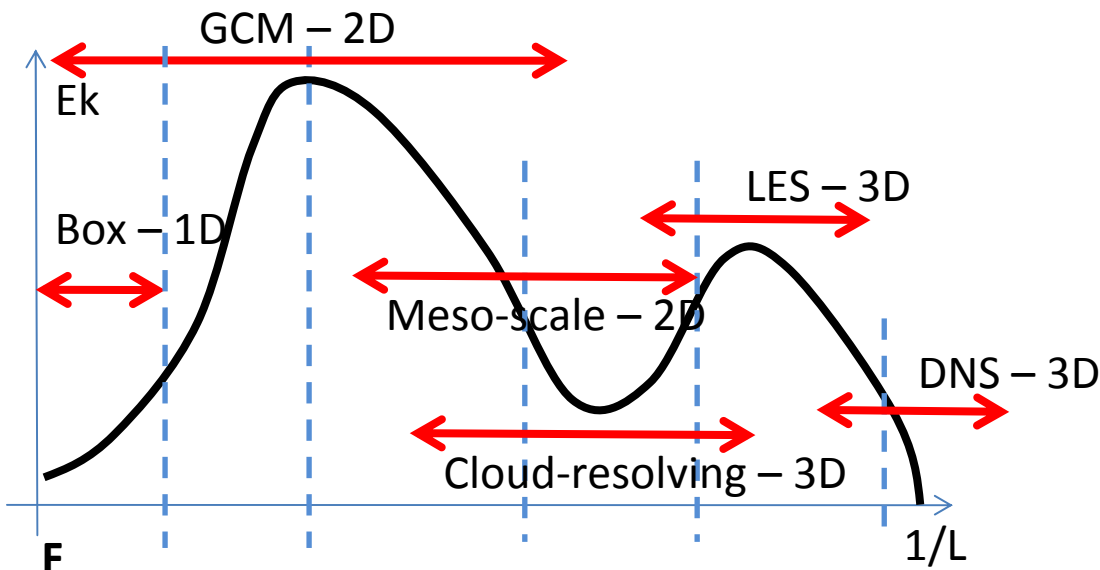
# Turbulence Modeling

The major difficulty of turbulence modeling is linked to the fact that the turbulence involves a wide range of length and time scales as well as their non-linear interactions

Models reduce the range of scales limiting either the largest scale (DNS) or the smallest one (LES) or totally eliminating them (RANS)

A picture of a friend is useless if it covers a football field and exhibits every pore.

(Achen, 1991, p. 13)



All models resolve only limited range of scales

How can we judge them as superior to each other?

# Historical Assessment

## Expectations

One should not expect too much from these “*calibrated surrogates for turbulence.*” They should work satisfactorily in situations not too far removed geometrically, or in parameter values, from the *benchmark situations used to calibrate them.*

John Lumley, “Atmospheric modeling,” Mech. Eng. Trans., Inst. of Eng. Australia, 1983:

I am convinced that much of this huge effort will be of passing interest only... The only encouraging prospect is that current progress in understanding turbulence will . . . guide these efforts to a more reliable discipline.

Hans Liepmann, “The rise and fall of ideas in turbulence,” Am. Scientist, 1973

## Practice

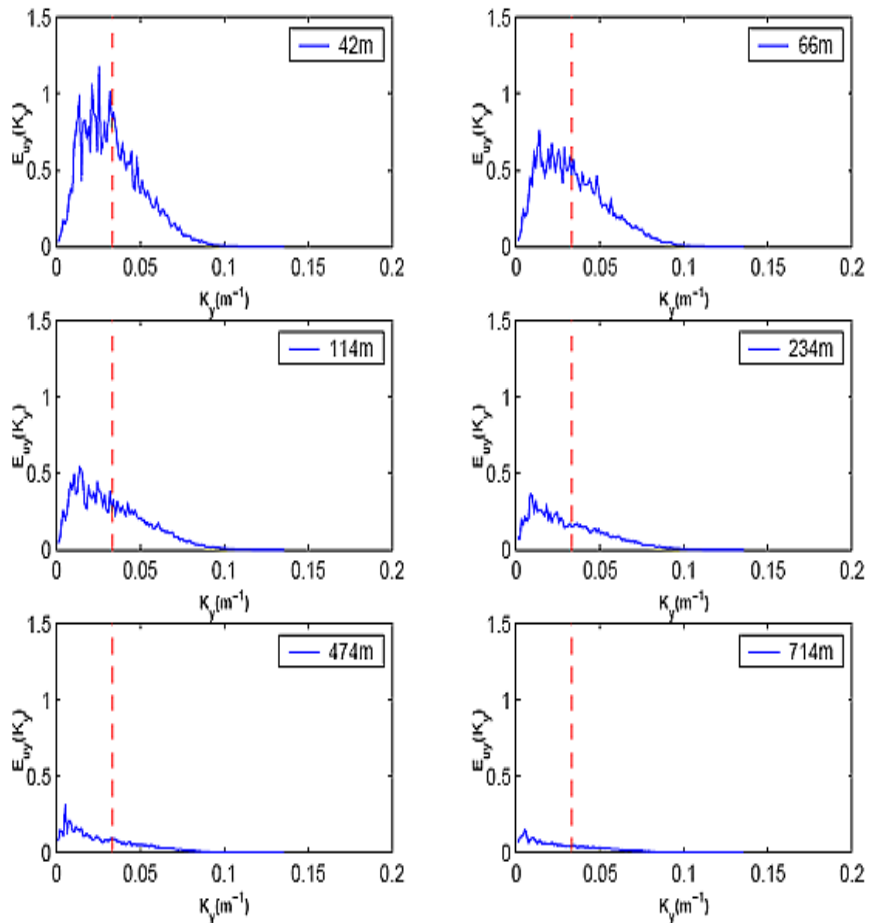
“DNS is a tool [in the turbulence research endeavor], in which it complements the time-trusted methodology of experimental research”

“Significant insight has been gained from DNS of certain idealized flows that cannot be easily attained in laboratory” [IE: i.e. cannot be calibrated]

Moin and Mahesh (Ann. Rev. Fluid Mech., 1998, 30, 539-78)

# Part II: Illustration

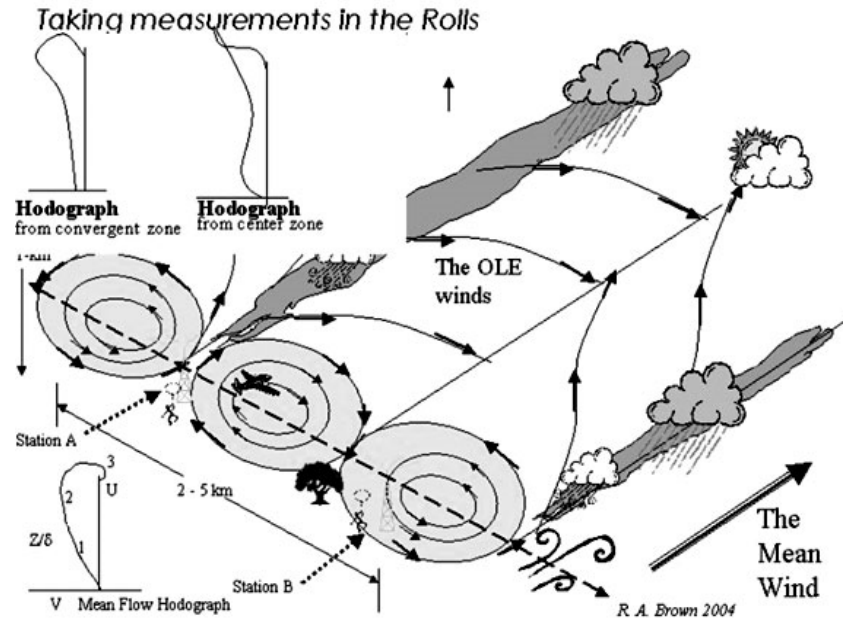
# Planetary Boundary Layer Structure



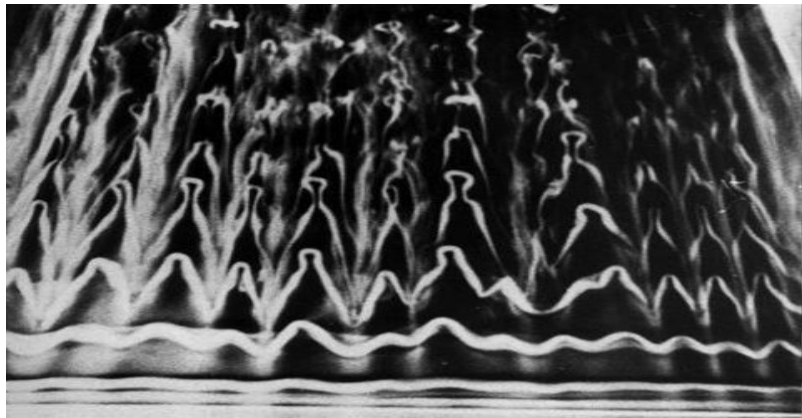
**No clear signature when standard methods are used**  
**Only elusive pattern on level of cognitive perception**

# Uncertainty of Observations – Freedom of Conceptualization

- Theory A (D. Lilly, R. Brown ...; meteorology) – EBL is organized due to Ekman instability ...  $\Omega_V$
- Theory B (P. Bradshaw, S. Leibovich ...; oceanography) – EBL is organized due to ...  $\Omega_H$
- Theories C (many authors) – EBL is organized due to other dynamical processes, e.g. oblique instability of the Tollmien-Schlichting waves, *not related to the Coriolis force*



C Perry, A.E., Lim, T.T. & Teh, E.W. (1981) A visual study of turbulent spots, J. Fluid Mech., 104 , 387



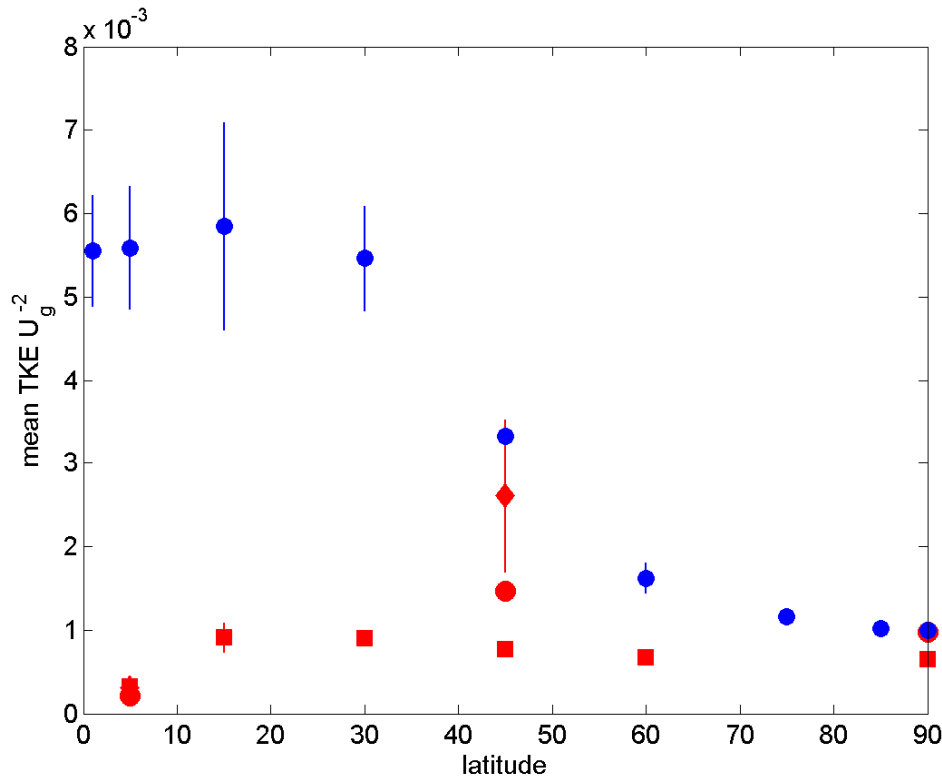
S

A  
B

# Calculations versus Simulations

- Calculations
  - Develop a model and a set of runs corresponding a chosen theory (e.g. Mason and Sykes, 1980; Zikanov, 2004)
  - Calibrate the model and affirm the theory
  - If the theory cannot be supported, correct the model
- Theoretical simplifications are logically derived and therefore correct (L. Landau approach)
  - Requires irrational intuition
- Simulations
  - Develop a model and a set of runs reproducing all alternatives
  - Obs: Superiority does not follow from the model resolution
  - Falsify the model against a set of evidences
  - Obs: Not against those which affirm the theory
  - Modify the runs to single of relevant simplifications
- Theoretical simplifications are logically derived and therefore could be irrelevant to the subject of study

# Bulk flow characteristics: *Effects of latitude*



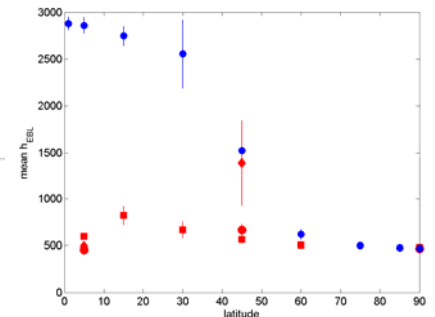
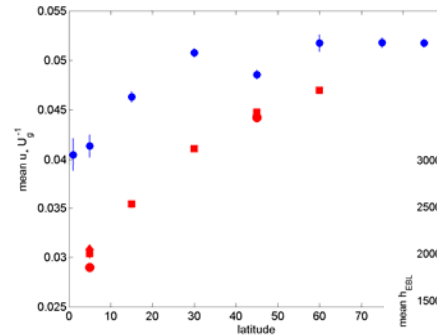
Mean normalized turbulent kinetic energy (TKE) in the LES domain.

**Blue** – E-W flow (180 deg.);

**Red** – W-E flow (0 deg.);

Symbols – different  $L_y$  and  $U_g$

Similar dependences are found for EBL thickness and friction velocity

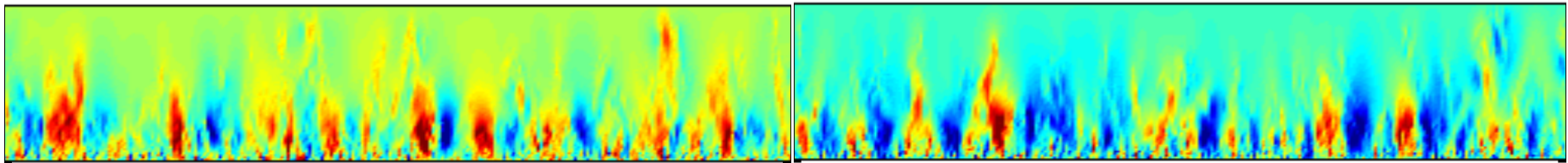


No dependence on wind direction at high latitudes!  
6-10 times larger TKE of easterlies at low latitudes!!!

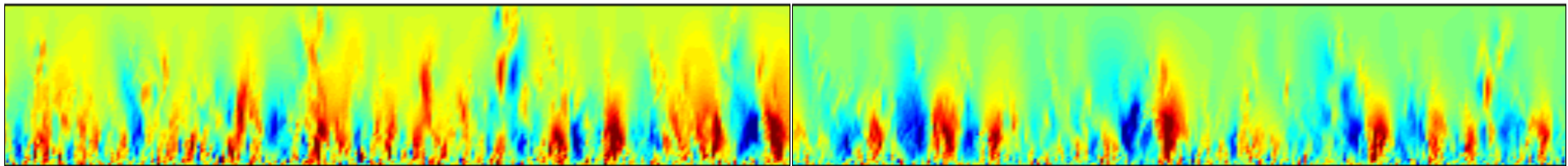


# Flow structure: *The pole (90 deg. Latitude)*

E-W wind (180 deg.)



72 km



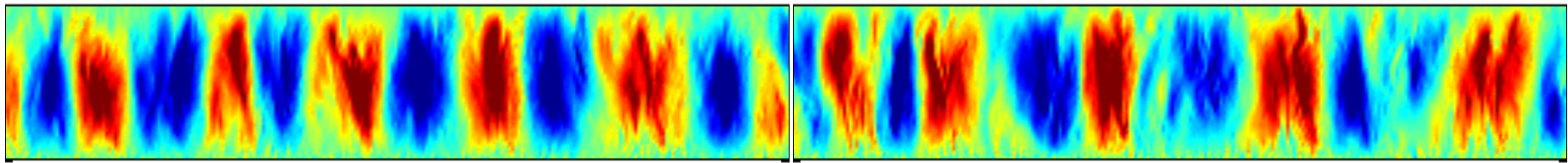
W-E wind (0 deg.)

Red – upward velocity; blue – downward velocity

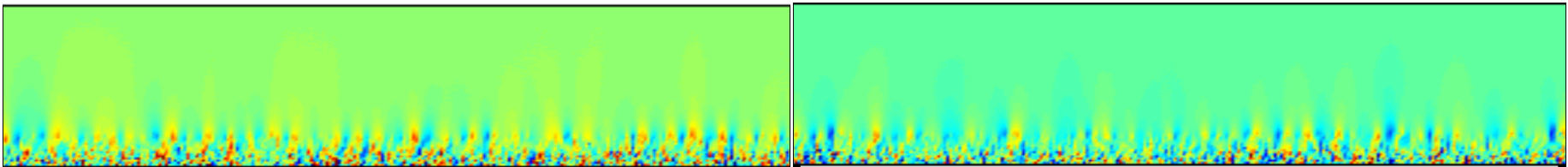
At the pole, the EBL turbulence is organized in the rolls but there is no structural dependences on the mean flow direction.

# Flow structure: *The equator (5 deg. Latitude)*

**E-W wind (180 deg.)**



72 km

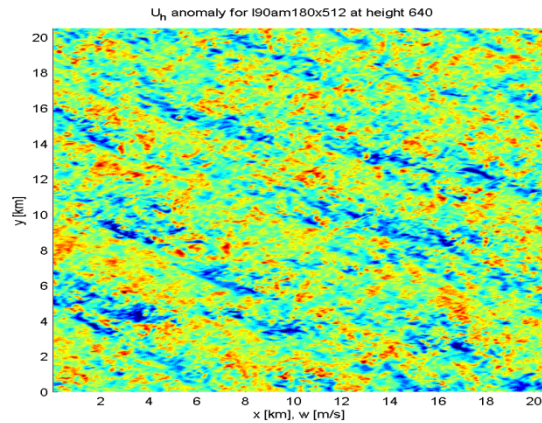


**W-E wind (0 deg.)**

Red – upward velocity; blue – downward velocity

At the low latitudes, the EBL turbulence is organized in the rolls only in the E-W flow; streaks could be identified in W-E flow.

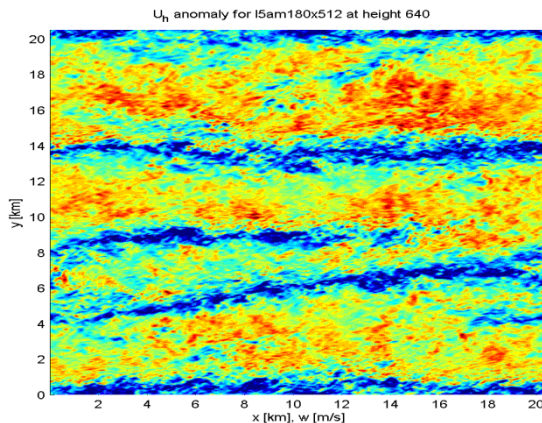
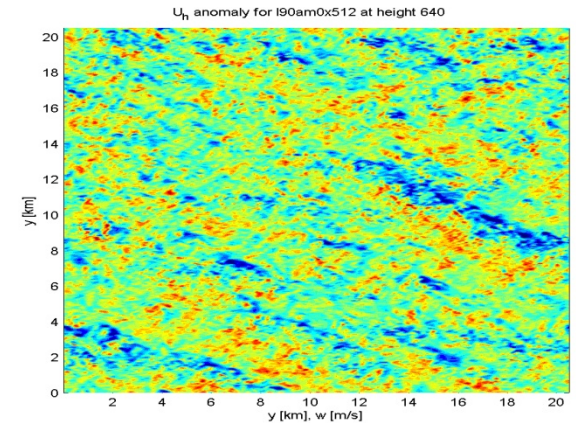
# 3D EBL simulations (PALM)



## EBL at the Pole

Left: East-to-West flow  
Right: West-to East flow

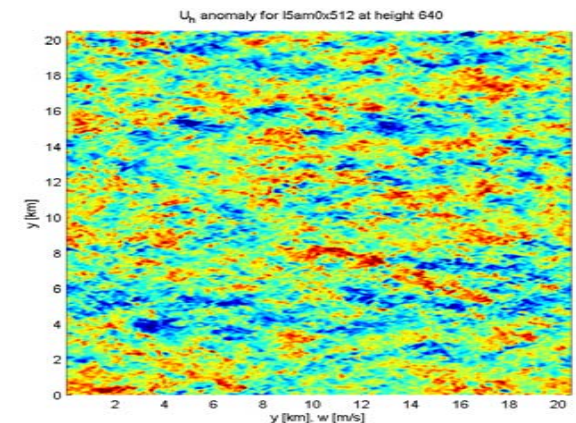
Streaks?



## EBL at the Equator (5N)

Left: East-to-West flow  
Right: West-to East flow

Definitely rolls!



# Effects of Large-Eddy Concept: Surface Boundary Layer



# Turbulence generation in high Re PBL



Photo, I. Esau from Stockholm.  
 Concept after J.C.R. Hunt and others (2000-2006)

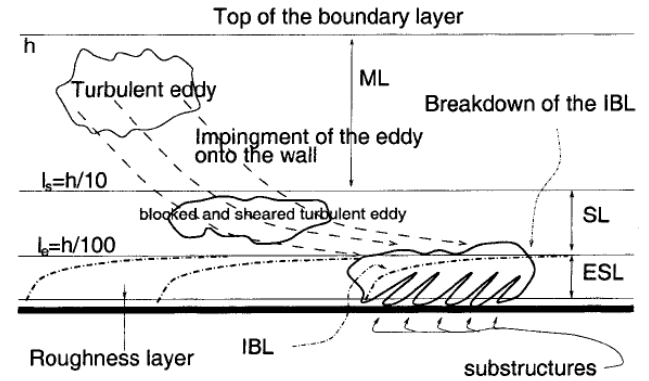
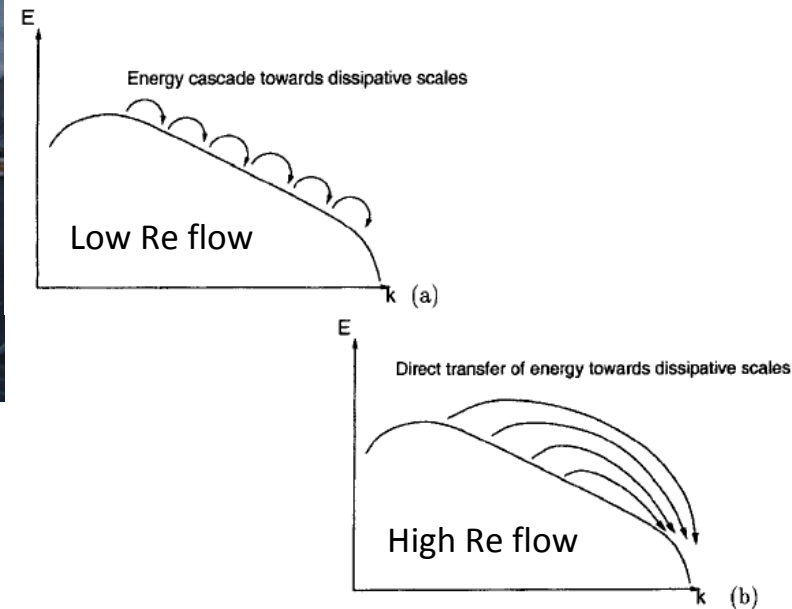
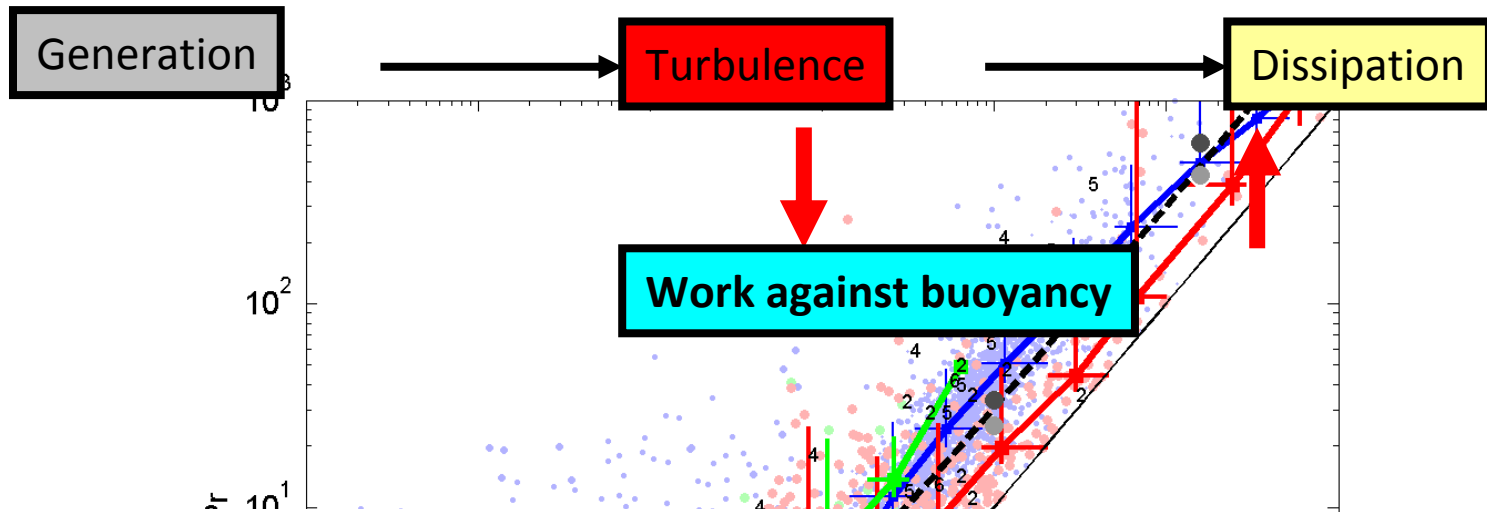


Figure 1. Sketch of a typical high Reynolds number boundary layer;  $h \approx 1-2$  km,  $l_s \approx 100-200$  m,  $l_e \approx 10-20$  m, the roughness length  $z_0$  is less than 0.1 m over a field, less than 1 m over a typical city.



# Total turbulence energy and inherent link between mixing properties and MO-similarity



$$\frac{DE_K}{Dt} + \frac{\partial \Phi_K}{\partial z} = -\tau \cdot \bar{S} + \beta F_z - \varepsilon_K,$$

$$E_K = 1/2 \overline{u_i u_i}$$

$$\frac{DE_\theta}{Dt} + \frac{\partial \Phi_\theta}{\partial z} = -F_z \frac{\partial \bar{\theta}}{\partial z} - \varepsilon_\theta.$$

$$E_\theta = 1/2 \overline{\theta'^2}$$

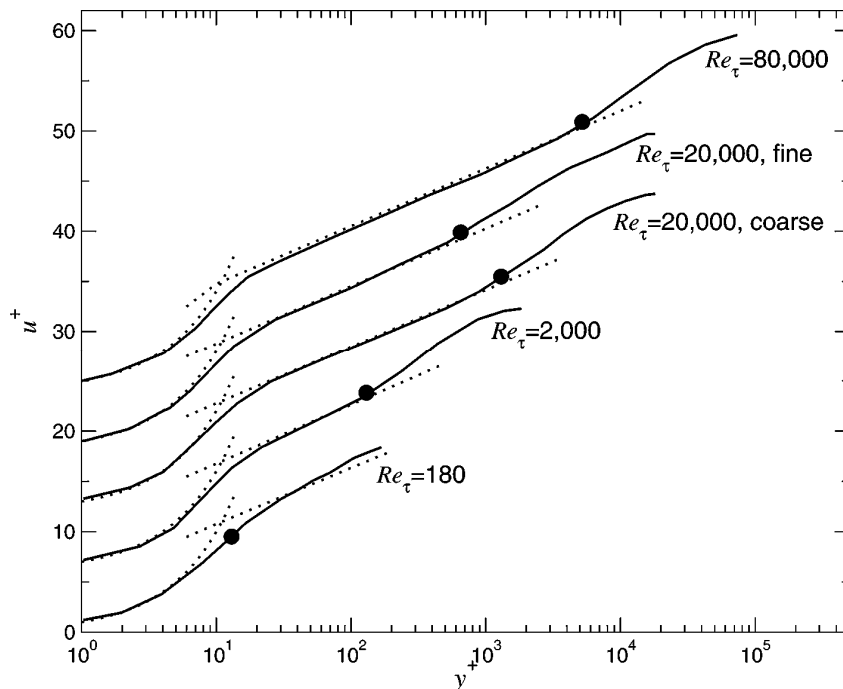
$10^{-3}$   $10^{-2}$   $10^{-1}$   $10^0$   $10^1$   $10^2$   $10^3$

Ri

# Toward Culture of Simulations

Most results obtained to date have been encouraging .... However, there are some counter examples of incorrect prediction ... in regions where LES matches to boundaries ...

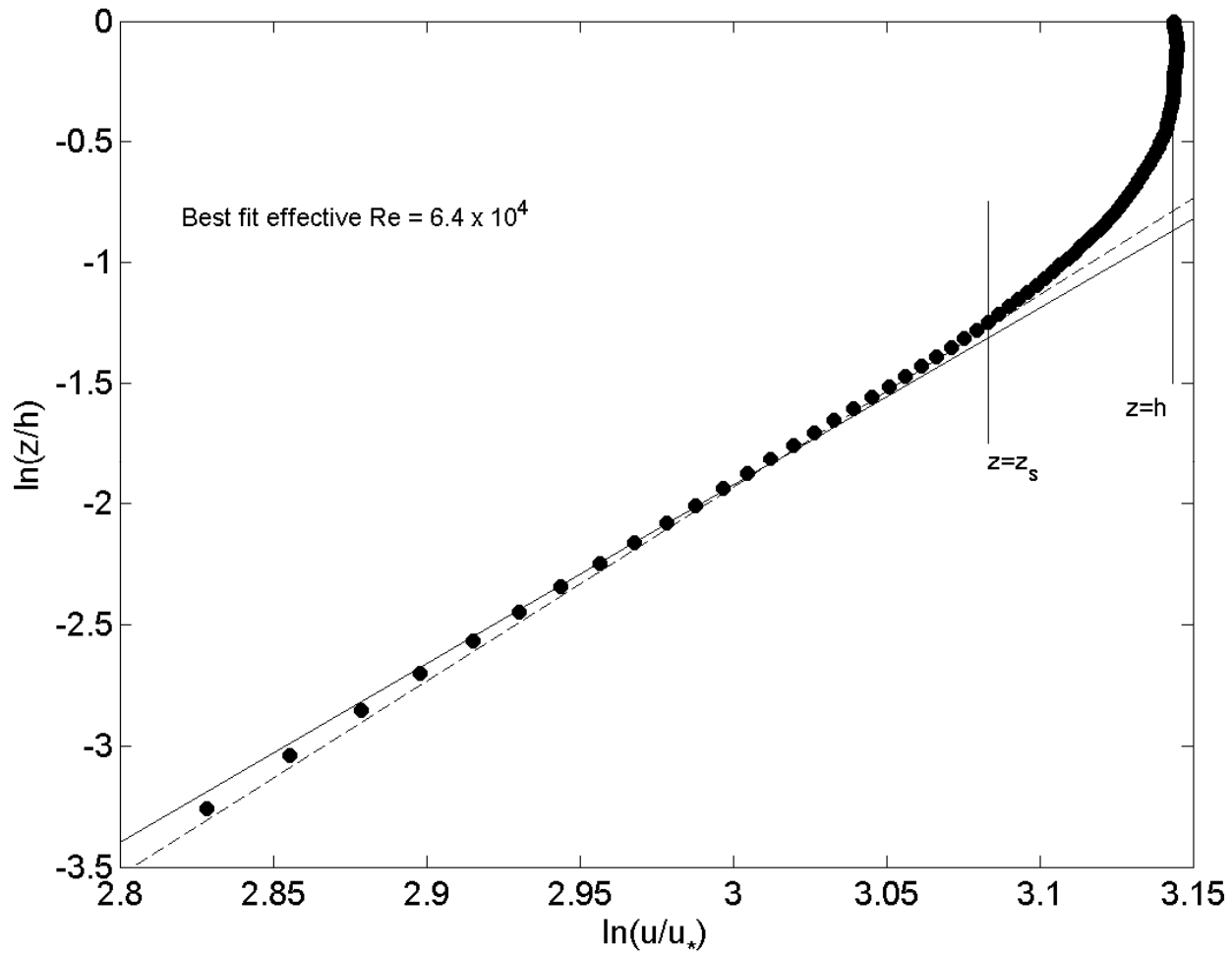
P.J. Mason, *Large-eddy simulation: A critical review of the technique*. *Quart. J. Roy. Meteorol. Soc.* 120 (1994) 1–26.



**Figure 10 Mean velocity profiles in plane channel flow. DES-based wall-layer model (Nikitin et al. 2000).** Each profile is shifted by 6 units in the vertical direction for clarity, and a bullet shows the interface between the RANS and the LES regions.

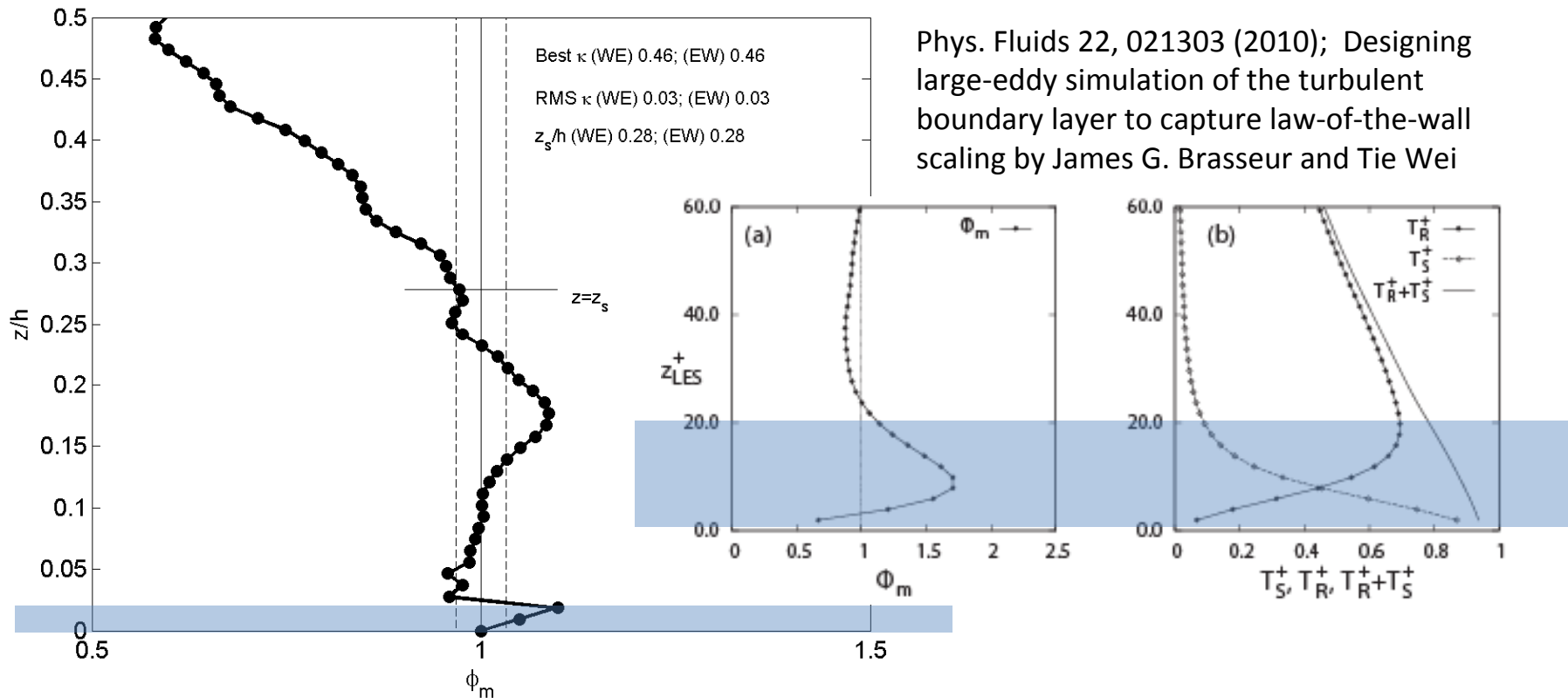
**LES are incorrect only when assumed to have infinite Re**

# Effective Re in LES



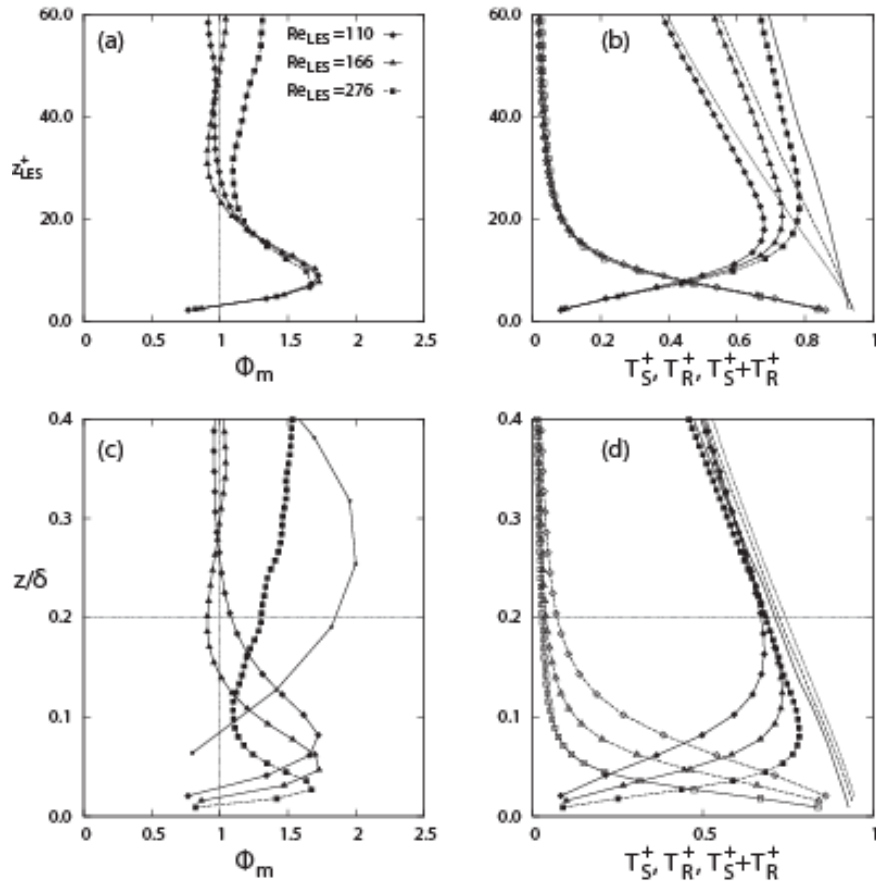


# Identification of simulated surface layer by Brasseur and Wei



Overshoot in LES of the neutral ABL using the Smagorinsky model ( $C_s = 0.2$ ) and a  $128 \times 128 \times 128$  grid. (a)  $\Phi_m$  vs  $z_{LES}^+$ . (b) Wall normalized mean resolved and SFS shear stress  $T_R^+$  and  $T_S^+$  plotted against  $z_{LES}^+$  and its sum.  $\kappa = 0.4$  is assumed in forming  $\Phi_m$ .  $\kappa = 0.4$  is assumed in forming  $\Phi_m$ .

# Relationship to LES resolution



Overshoots in LES of the neutral ABL. (a)  $\Phi_m$  vs  $z_{LES}^+$ . (b) Normalized resolved Reynolds stress  $TR^+$  (filled symbols) and mean SFS shear stress  $TS^+$  (open symbols) vs  $z_{LES}^+$ . Dotted, dashed, and thin lines are the sum of resolved and SFS stress from low to high LES Reynolds number. (c)  $\Phi_m$  vs  $z/\delta$ , where  $\delta$  is defined as the height where  $\Phi_m = 0$ . (d)  $TR^+$  (filled symbols) and  $TS^+$  (open symbols) vs  $z/\delta$ . The LES Reynolds numbers of the simulations are shown in (a). In order of  $Re_{LES}$ , the Smagorinsky constants and grids were ( $C_s = 0.1$ ,  $42 \times 42 \times 96$ ), ( $C_s = 0.2$ ,  $192 \times 192 \times 128$ ), and ( $C_s = 0.1$ ,  $128 \times 128 \times 256$ ). The thin black line in (c) is a simulation with such low  $Re_{LES}$  that turbulence is barely sustained ( $C_s = 0.2$ ,  $42 \times 42 \times 32$  and  $Re_{LES} = 38$ ). The horizontal dotted lines in (c) and (d) indicated the upper margin of the surface layer where LOTW should be predicted.  $\kappa = 0.4$  is assumed in forming  $\Phi_m$ .

# Culture of Simulations

## Reflection in Model Development

As it usually happen, at the beginning, nobody thought much about foundations making ungrounded statements

$$\partial_t u + (\nabla \times u) \times \bar{u} + \nabla(p + \frac{1}{2}u^2) = \bar{f}$$

Leray (1934) based NS-alpha model

$$\bar{u} = (I - l_{cut}^2 \Delta)^{-1} u$$

$$\begin{cases} \partial_t \bar{u} + \bar{u} \cdot \nabla \bar{u} = \nabla \cdot (-pI + T), \nabla \cdot \bar{u} = 0, \\ T = 2l_{cut}^2 (\partial_t S + \bar{u} \cdot \nabla S + S\Omega - \Omega S), \\ S = \frac{1}{2}(\nabla \bar{u} + (\nabla \bar{u})^T), \quad \Omega = \frac{1}{2}(\nabla \bar{u} - (\nabla \bar{u})^T). \end{cases}$$

$$\partial_t u + u \cdot \nabla u + \nabla \cdot (pI - T^*) = \bar{f}$$

Ladyzenskaja-Kaniel (1969) based eddy-viscosity model

$$u \cdot \nabla u = \nabla(\bar{u} \otimes \bar{u}) + \nabla(u \otimes u - \bar{u} \otimes \bar{u})$$

$$\begin{cases} \partial_t \bar{u} + \bar{u} \cdot \nabla \bar{u} = \nabla \cdot (-\bar{p}I + (\bar{u} \otimes \bar{u} - \overline{u \otimes u}) - T^*), \\ \nabla \cdot \bar{u} = 0, \\ T^* = 2l_{cut}^2 |\bar{S}| \bar{S} \end{cases}$$

# Dissipaters, filters and symmetries

Model Type	Translations	Rotations and reflections	Scaling transformations*	Material indifference**
Smagorinsky (Smagorinsky, 1963; Lilly, 1967)	Y	Y	N	Y
Dynamic Smagorinsky (Germano, 1986; Lilly, 1992; Vreman et al., 1994; Meneveau et al., 1999)	Y	Y	Y	Y***
Structure function (Metais and Lesieur, 1992)	Y	Y	N	N
Gradient (Clark et al., 1979)	Y	Y	N	N
Scale-Similarity (Bardina et al., 1980)	Y	Y	Y	Y*
Lund-Novikov tensor diffusivity (1992)	Y	Y	N	N
Kosovic or non-linear Lund-Novikov model (Kosovic, 1997)	Y	Y	N	N

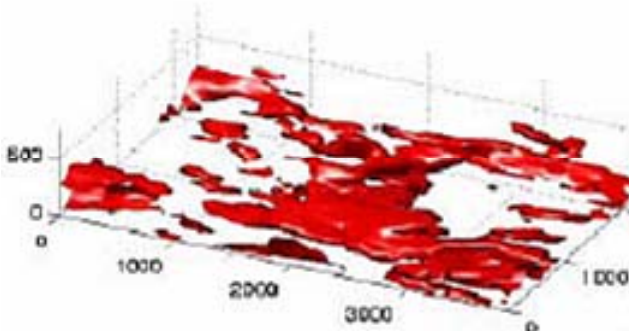
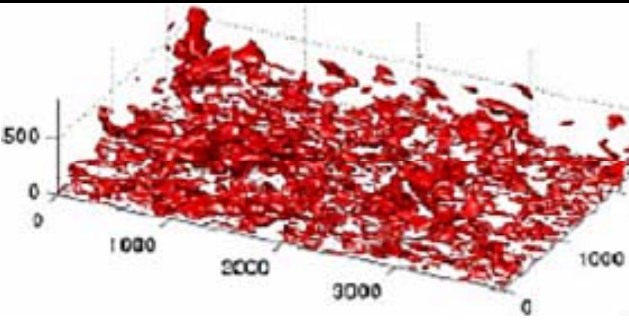
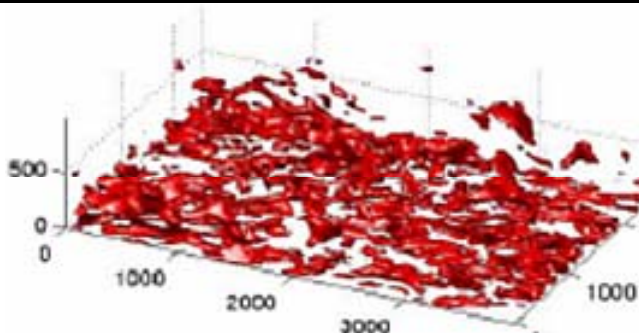
\* To hold scaling invariance, **the length scale should not appear in the model explicitly**

\*\* in the limit of 2D flow in simply connected domain

\*\*\* under special conditions on the filter core, **neither Gaussian nor box filters satisfy**

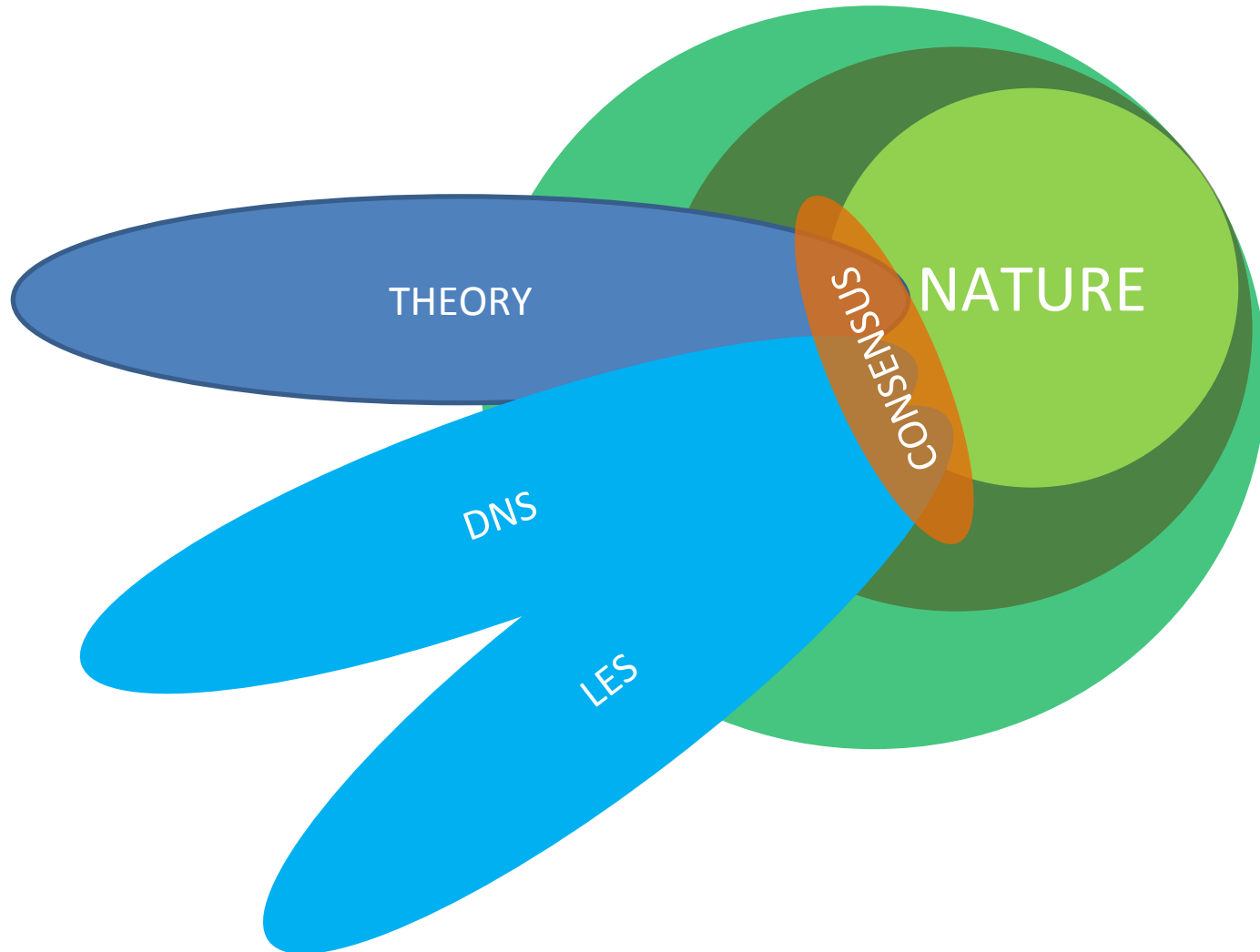
Razafindralandy D., and Hamdouni, A., 2006: Consequences of symmetries on the analysis and construction of turbulence models, *Symmetry, Integrability and Geometry: Methods and Applications*, 2, 052, 20 pp.

# Practical implications

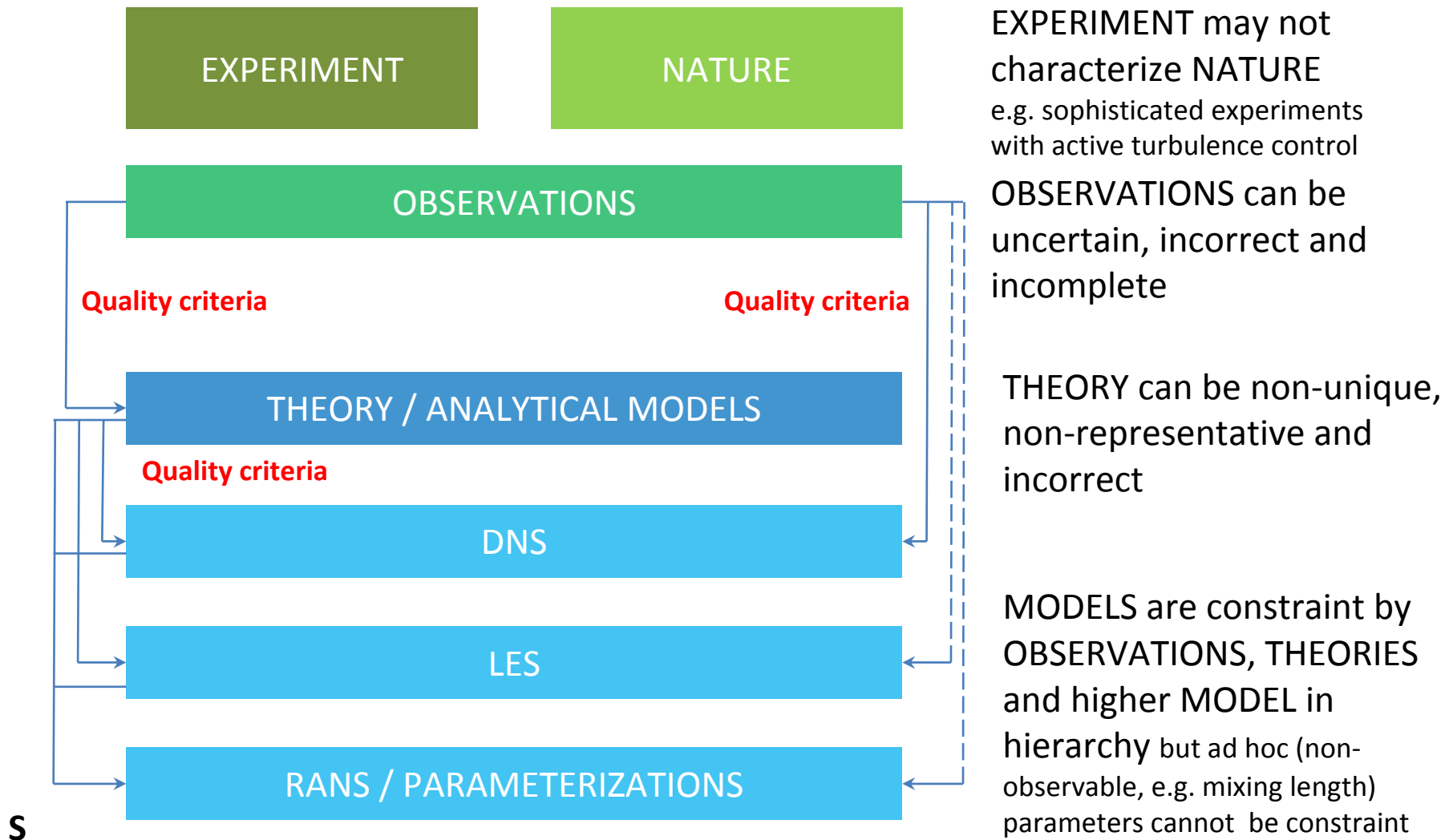
LES mesh	Dynamic-mixed LESNIC	Static Smagorinsky LESNIC, $C_s = 0.17$
$32^3$		<b>No turbulence develops, laminar flow</b>
$128^3$		

Instant fluctuations of the flow velocity in stably stratified LES runs for Beare et al. (2006) study. Data computed with the LESNIC code (Esau, 2004).

# Part III and the last: Adopting Culture of Simulations



# Turbulence Model Hierarchy



# Simulations determine Experiments

## HATS (Horizontal Array Turbulence Study)

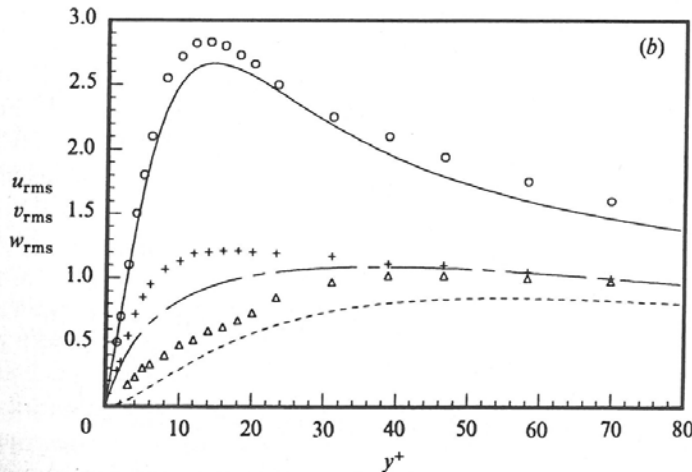
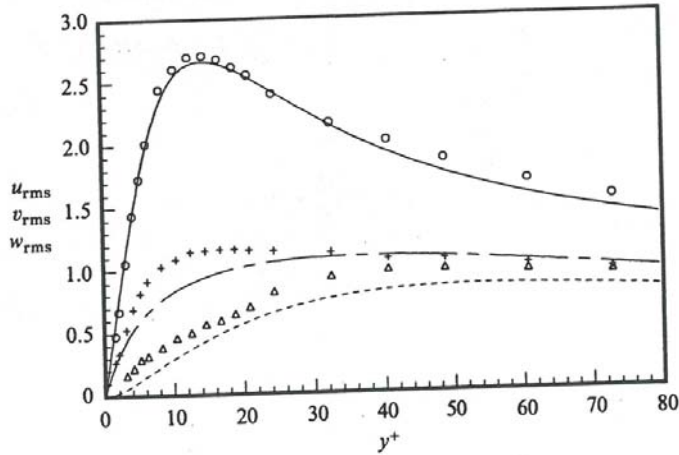
Non-trivial step is that the needs of models, not those of theory, determines the experiment

We begin to move from calculations to simulations considering the model as independent entity





# Simulations correct Experiment



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*J. Kim, P. Moin and R. Moser*

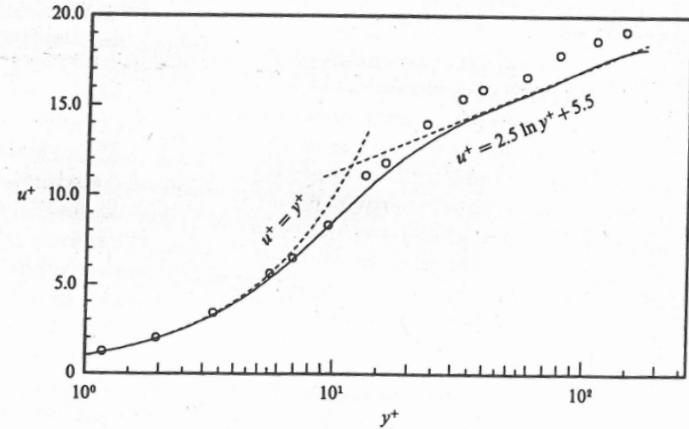
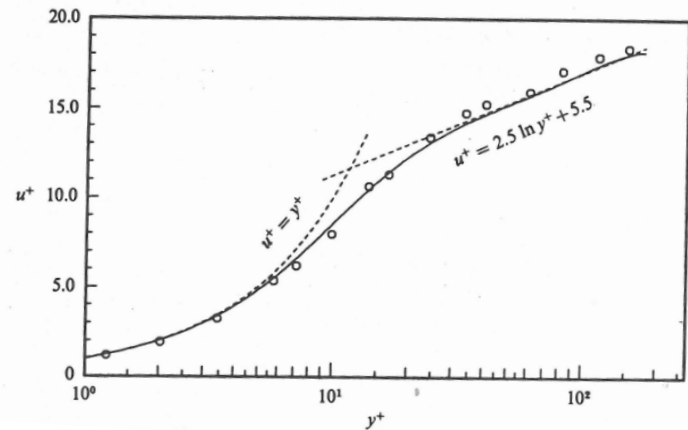


FIGURE 4. Mean-velocity profiles: —, upper wall; ---, lower wall (masked by solid  $\circ$ , data from Eckelmann (1974)); ---, law of the wall.

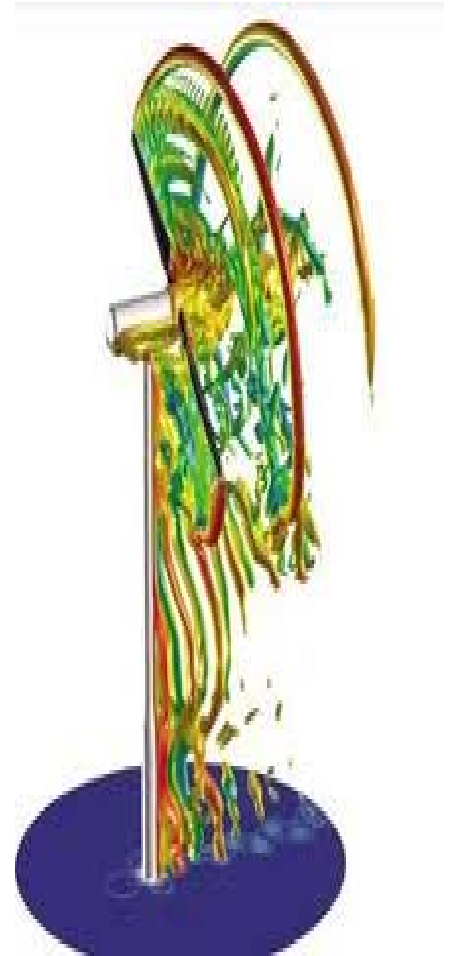


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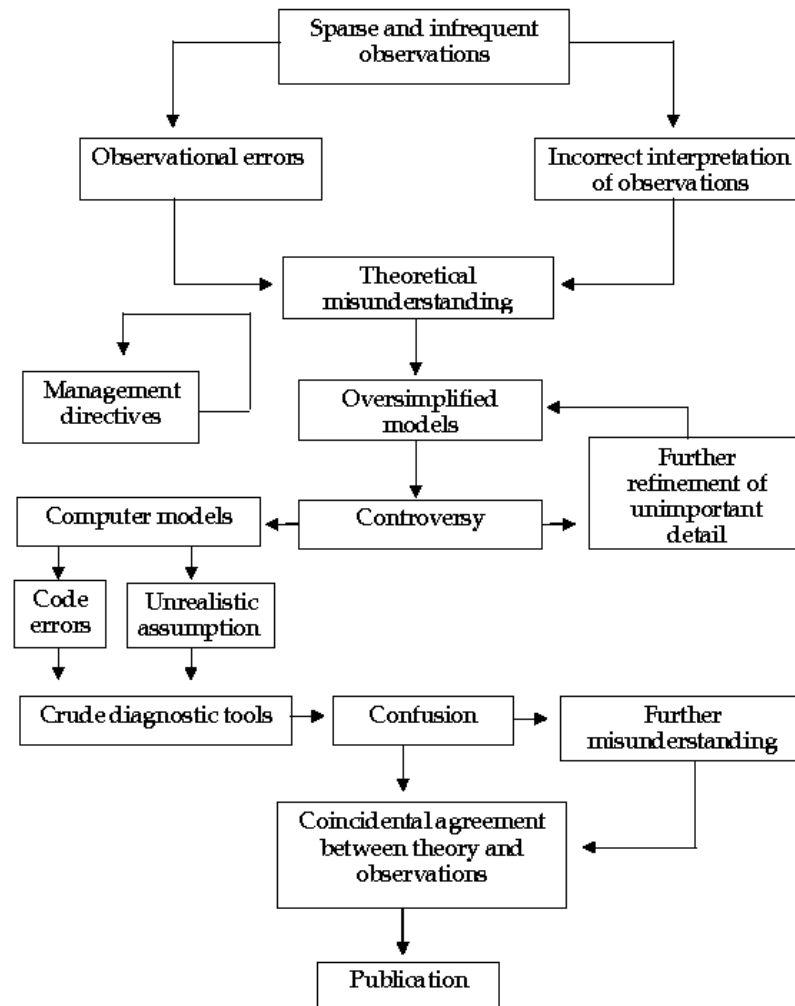
Kim, J., Moin, P. and R. Moser, 1987: Turbulence statistics in fully developed channel flow at low Reynolds number, *J. Fluid Mech.*, 177, 133-166

# Summary

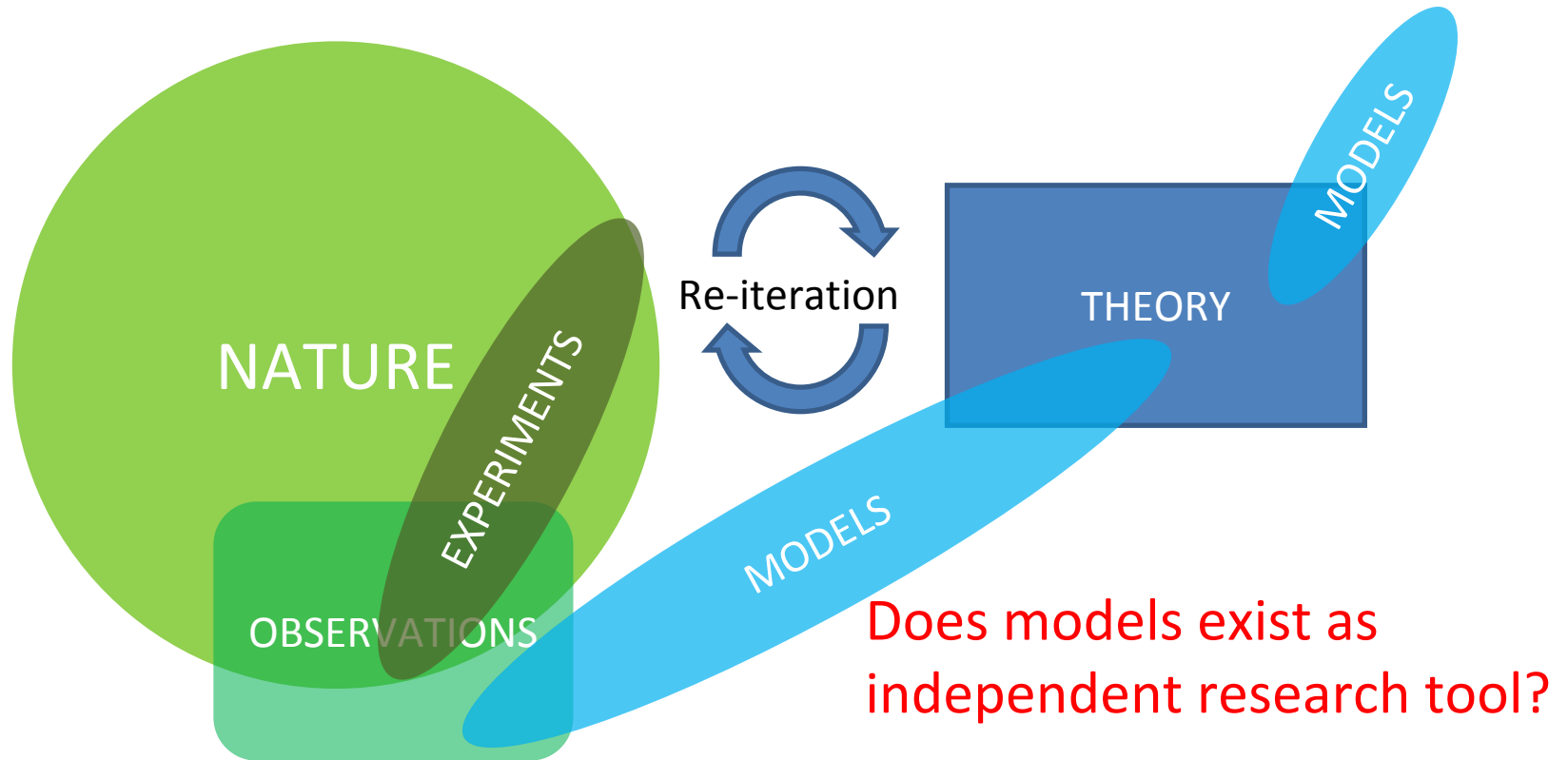
- Turbulent models were traditionally considered as affirmative quantitative tools to calculate numbers for pre-existing theories within their range of calibration (e.g. J. Lamley)
- They are largely still are, e.g. wind turbine, car, bridge etc engineering
- But turbulent models increasingly become effective tools for production new knowledge (e.g. P. Moin)
- To use opportunities provided by turbulence modeling, critical shift of paradigm is required
- From modernism and positivism (K. Popper and T. Kuhn) to post-modernism and post-positivism (I. Lacatos, Fantoviz and Ravitz)
- In new model hierarchy, the better models should reproduce not the larger range of scales but the larger range of yet unobserved or unrecognized facts



# Thank you

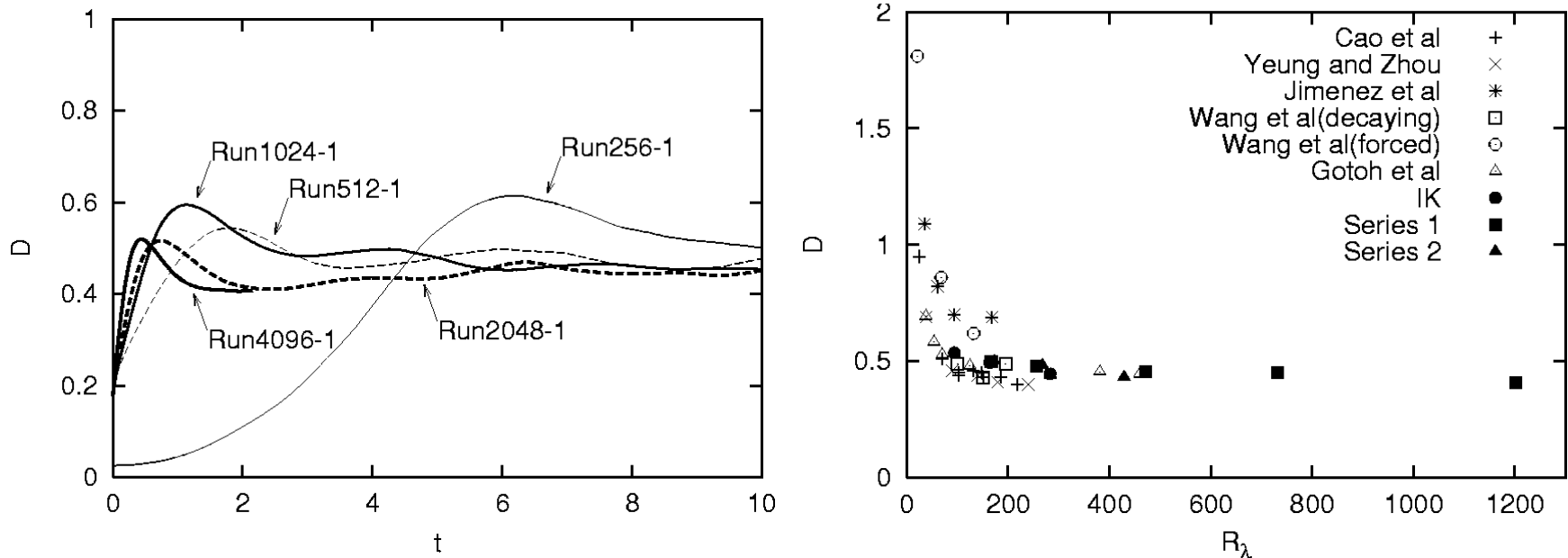


# Research of Open Systems



- Observations – sample a small fraction of nature and not necessarily readings are relevant
- Experiments – essentially a part of nature but not necessarily relevant or observed
- Theory – reiterates with but not necessarily based on nature via observed evidences
- Models – based on both observations and theory but not necessarily compatible with

Kaneda, Y, Ishihara, T., Yokokawa, M., Itakura, K. and A. Uno, 2003: Energy dissipation rate and energy spectrum in high resolution direct numerical simulations of turbulence in a periodic box, *Physics of Fluids*, 15(2), L21-L24

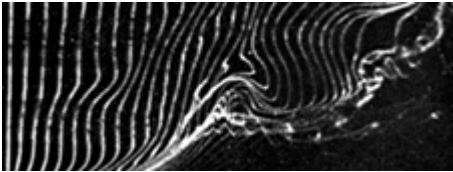


Neither different runs of one DNS nor different DNS are sufficiently consistent to supplant nature



DNS by J. Kim and P.Moin

[http://www.stanford.edu/group/ctr/articles/tackle\\_sidebar1.html](http://www.stanford.edu/group/ctr/articles/tackle_sidebar1.html)



Observations in experiment by S. Kline

- Data can be generating and re-generating unlimited times under specified, controllable conditions
- Model databases can be analyzed at cheap cost by diverse discipline researchers
- New ideas and theories can be tested, iterated and calibrated

# Affirmative Research

- Research strategy designed to confirm pre-concieved conclusions, simplifications etc.

