

Measuring Regulatory Complexity

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Roadmap

Introduction

Regulation and algorithms

Psychological complexity

Logical complexity

Computational complexity

Motivation

- ▶ Perceived increase in the complexity of financial regulation.
For instance:
 - ▶ Basel I, 1988: 30 pages.
 - ▶ Basel II, 2004: 347 pages.
 - ▶ Basel III, 2011-2014: 616 pages.
 - ▶ Dodd-Frank Act, 2010: 848 pages.
- ▶ Calls for **simpler regulations**, for instance a leverage ratio (Haldane, 2012).
- ▶ Persuasive rhetoric against complexity (e.g., comparison with the 10 commandments), but:
 - ▶ How can we **measure** regulatory complexity?
 - ▶ Complexity will be neglected in the **trade-off** if it cannot be measured.

Usual measures of complexity

Quick quiz:

- ▶ What sector in the U.S. is supervised by **47,000 Federal employees**?
- ▶ Which U.K. regulatory agency has over **11,200 employees**?
- ▶ What French industry needs **1,000** on-site inspectors?
- ▶ Which French law code has **3,477 pages**? (with comments)
- ▶ What international set of standards has **338 titles**?

Usual measures of complexity

Quick quiz:

- ▶ What sector in the U.S. is supervised by **47,000 Federal employees**?
- ▶ **Civil Aviation**, FAA. Fed system 17,000, + 13,000 FDIC, OTS, OCC.
- ▶ Which U.K. regulatory agency has over **11,200 employees**?
- ▶ **Environment agency**. FSA had 3,800.
- ▶ What French industry needs **1,000** on-site inspectors?
- ▶ **Slaughterhouses**. \simeq SSM headcount at ECB.
- ▶ Which French law code has **3,477 pages**? (with comments)
- ▶ **Code rural et de la peche maritime & Code forestier**.
Code monetaire et financier: 3,363 pages.
- ▶ What international set of standards has **338 titles**?
- ▶ **Codex Alimentarius**. Basel III 600 *pages*.

We need more than the “it’s a lot” rhetoric.

Our idea

- ▶ Similarities between **regulation** and **algorithms**:
 - ▶ Take a bank as input.
 - ▶ Apply a set of instructions and operations.
 - ▶ Output is a regulatory action.
- ▶ Adapt the well-developed literature on **algorithmic complexity**.
Two families:
 - ▶ **Psychological** complexity: how difficult is it to understand the regulation / to write the regulatory text without “bugs”.
 - ▶ **Computational** complexity: how long does it take to “test” a given bank (supervision). How much data needs to be stored?

Why is it important?

- ▶ Complexity can be strategically exploited by sophisticated agents (e.g., Carlin 2009).
- ▶ Complexity creates asymmetric information, Arora, Barak, Brunnermeier, and Ge (2009).
- ▶ Risk of **capture by sophistication** (Hellwig / Hakenes and Schnabel, 2013).
- ▶ **Opacity to outsiders** gives discretion to supervisors (Rochet, 2010).
- ▶ Further theoretical work on this issue hindered by lack of measures.

Today

- ▶ **Work in progress:**
 - ▶ General framework.
 - ▶ Some possible measures.
 - ▶ Simple examples.
 - ▶ Questions for future research.
 - ▶ No full-scale application to actual regulations yet.
- ▶ **Looking for feedback** from academics, supervisors, practitioners...

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Definition

A *regulation* f is a function from a set of regulated entities \mathcal{E} to a set of actions \mathcal{A} : $f : \mathcal{E} \rightarrow \mathcal{A}$.

- ▶ An element of \mathcal{E} is a list of relevant characteristics, e.g. balance sheet items.
- ▶ \mathcal{A} includes “doing nothing”, “closing the bank”, “imposing a fine”, etc.

Representation and supervision

Definition

A *representation* \tilde{f} of regulation f is a list of instructions that implement f for any $e \in \mathcal{E}$.

Definition

Supervision of a given entity e is the fact of following the instructions \tilde{f} in order to implement f at a given $e \in \mathcal{E}$.

- ▶ There are several ways to represent the same regulation, some more complex than others.
- ▶ Supervision may be long/complex even if the associated regulation is short/simple.

Definition

A measure μ of complexity of a regulation f is defined as a mapping $\mu : f \rightarrow \mathbb{R}$.

A measure of complexity of a representation \tilde{f} of a regulation f is a mapping $\tilde{\mu} : \tilde{f} \rightarrow \mathbb{R}$.

- ▶ μ and $\tilde{\mu}$ correspond to different questions.
- ▶ We can require traditional properties of a measure, e.g., monotonicity (additivity more problematic).

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Objective

- ▶ Measure the difficulty of **understanding** a regulation.
- ▶ Proxy for opacity to outsiders (hence capture), potential for misunderstandings, loopholes in the regulation.
- ▶ In computer science: link with the time it takes to code a program and the expected number of bugs.

Halstead measures

- ▶ Pioneering work of Halstead (1977).
- ▶ Define an algorithm as a list of **operands** and **operators**:
 - ▶ Operands: variables, constants...
 - ▶ Operators: $+$, $-$, $=$, *if*, *end*, etc.
- ▶ Applied to regulation, two possibilities:
 - ▶ Adapt: assigning a risk-weight can be seen as an operator.
 - ▶ Apply: represent regulation as an algorithm.
- ▶ Denote N_1 the number of operators, N_2 the number of operands, η_1 the number of unique operators, η_2 the number of unique operands.

Volume

- ▶ Typical measure: lines of code. 600,000 for the Apollo program; 200 mln for Windows 7.
- ▶ Problem: depends on the language and the character set used.
- ▶ **Volume** V = lines of code with the “best” character set:

$$V = (N_1^* + N_2^*) \log_2(\eta_1^* + \eta_2^*)$$

- ▶ **Potential volume** V^* = volume in the best programming language:

$$V^* = (2 + \eta_2^*) \log_2(2 + \eta_2^*)$$

- ▶ V^* depends only on the number of inputs and outputs, independent of the representation f .

- ▶ **Level** of a program is:

$$L = \frac{V^*}{V} \simeq \frac{\eta_1^*}{\eta_1} \times \frac{\eta_2}{N_2}$$

- ▶ Inversely proportional to the number of repetitions of operands $\frac{\eta_2}{N_2}$.
- ▶ Inversely proportional to unnecessary operators $\frac{\eta_1^*}{\eta_1}$.
- ▶ In the context of regulation:
 - ▶ High L corresponds to **efficient but specialized language**: complex operators and operands not defined based on more elementary ones.
 - ▶ Measure can be part of a trade-off between **transparency and length**.

Difficulty and effort

- ▶ **Difficulty** of a program:

$$D = \frac{\eta_1}{\eta_2} \times N_2.$$

- ▶ **Effort** of a program:

$$E = V \times D.$$

- ▶ Intuitively, E is a measure of how long it takes to write a program, using a basic search model of program writing.
- ▶ Offers a measure of regulatory complexity that takes into account **repetitions and richness of the vocabulary**.

Example - Capital regulation

Bank reduced to a [detailed balance sheet](#):

- ▶ n asset types and m types of capital, possibly with a “attributes” worth 0 or 1.
- ▶ E.g., sovereign debt, OECD or non-OECD country, maturity < 1 year or not ($a = 2$).
- ▶ Risk-weight RW associated to a type of asset, regulatory capital RC for a liability.
- ▶ Regulation: scan the balance sheet, compute total RWAs and total RC, compute the ratio and compare to 8%.

Example - Capital regulation, $a = 1$

for $x = 1$ to n

if $type = x$ and $attribute_{x1} = 1$ then $RW = w_{x1}$

if $type = x$ and $attribute_{x1} = 0$ then $RW = w_{x0}$

for $y = 1$ to m

if $type = y$ and $attribute_{y1} = 1$ then $RC = w_{c1}$

if $type = y$ and $attribute_{y1} = 0$ then $RC = w_{c0}$

$$RWA = \sum_{x=1}^n RW(x) \times volume_x$$

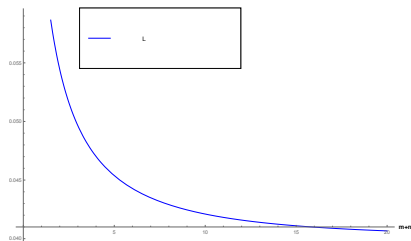
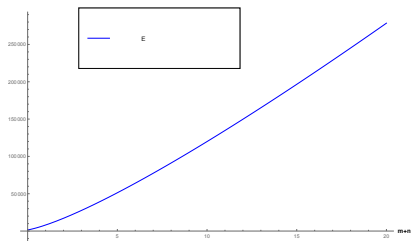
$$RC = \sum_{y=1}^m RC(y) \times volume_y$$

if $RWA/RC \geq \alpha$ then $pass = 1$

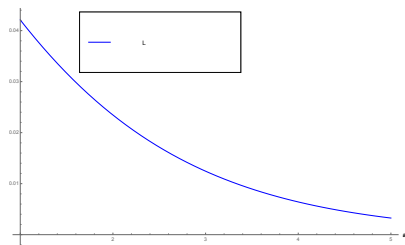
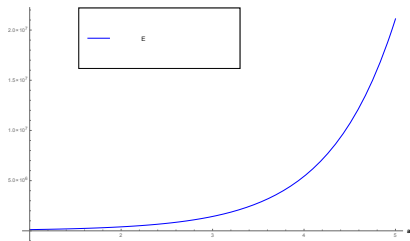
else $pass = 0$

We can compute the different measures as a function of n , m , a .

Number of balance sheet item types



Number of attributes



Conjectures

- ▶ IRB vs. SA: reduction in volume, but increase in level, hence decrease in transparency.
- ▶ Liquidity regulation in Basel III: “more of the same”, increase in effort only proportional to number of new measures introduced.

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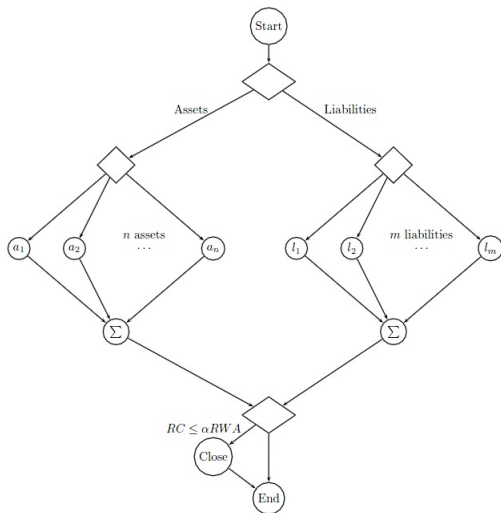
Computational complexity

Goal and measurement

- ▶ Number of conditional statements and loops.
- ▶ Very long regulation might still be “linear” and not very complex in terms of structure.
- ▶ McCabe (1976): model an algorithm as a control-flow chart, complexity given by the number V of **possible paths**.

$$V = \#edges - \#nodes + 2\#components$$

Example



$$V = (8 + 2m + 2n) - (9 + m + n) + 2 = 1 + m + n$$

- ▶ Risk-bucket approach very additive in nature.
- ▶ **Macroprudential regulation** can in principle be significantly more complex:
 - ▶ Conditions on one bank can depend on the entire system.
 - ▶ Different banks can be seen as different components, now linked with each other.

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- ▶ How costly is it to **supervise a particular bank**?
- ▶ Depends not only on the regulation $f(\cdot)$, but also on the entity e to which it is applied.
- ▶ Can potentially be measured in monetary terms.

Time complexity

- ▶ **Number of elementary operations** necessary to perform a supervision task.
- ▶ “Millions” of computations for a large bank (Haldane, 2011).
- ▶ But computing power is higher than in 1988.
- ▶ Probably more relevant: number of work hours necessary for different tasks.
- ▶ Exercise that **requires data from supervisors**.

Space complexity

- ▶ Number of **elements that need to be kept in memory** while performing the computation.
- ▶ Used to be very important for computer programs (RAM).
- ▶ May still reflect an important dimension of complexity for banks: managers need to **keep track of more variables** in their decision-making process.

Conjectures

- ▶ Huge increase in time complexity with **internal models** (but maybe decrease in psychological complexity).
- ▶ Macroprudential regulation can also have a large impact, e.g., network-based capital requirements (Alter, Craig and Raupach, 2014).
- ▶ **Liquidity regulation** represents a large increase in space complexity.

Conclusion

- ▶ Work in progress. Only a **framework for future research**.
- ▶ New avenues for measuring several dimensions of regulatory complexity.
- ▶ Next step is to **test the measures on actual regulatory texts** (done for Basel I).
- ▶ Two possible uses in the future:
 - ▶ Test existing theories, and stimulate new ones by **generating new stylized facts**.
 - ▶ Offer a tool for drafting new regulations, measure the increase and complexity and **trade it off against other objectives**.

Thank you!