

## レジリエンスの科学的解明に向けて

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<http://systemsresilience.org>

2014/2/3

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## 「想定外」?

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## 「想定外」にどう対応するか



Photo: Fukushima No.2 Plant, TEPCO

想定された津波高さ:  
5.7m



3/11の津波高さ: 14m

**防潮堤が14mならばよかったのか?**

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re·sil·i·ent

adj. 弾力性のある、回復力のある

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今回のような震災に立ち向かうためには、災禍の損害から早期の機能回復が可能な技術社会システムを実現するための、レジリエンス工学とも呼ぶべき新分野を確立しなければなりません

東京大学工学系研究科 緊急工学デザイン・ワーキンググループ  
 「震災後の工学は何をめざすのか」  
<http://www.lu.tokyo.ac.jp/epage/topics/pdf/vision.pdf>

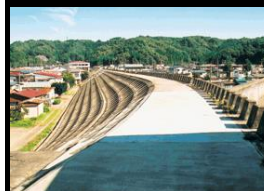
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Resilience = Resistance + Recovery

Logstaff et al., "Building Resilient Communities," Homeland Security Affairs, Vol. VI, No. 3, 2010



+

Taio-cho, Miyagi Pref.  
[http://www.bousaihaku.com/cgi-bin/hp/index2.cgi?ac1=6742&ac2=8ac3=1574&Page=hpd2\\_view](http://www.bousaihaku.com/cgi-bin/hp/index2.cgi?ac1=6742&ac2=8ac3=1574&Page=hpd2_view)  
<http://fullload.jp/blog/2011/04/post-265.php>

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情報・システム研究機構での取り組み

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### 情報・システム研究機構

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新領域融合プロジェクト システムズ・レジリエンス  
Systemsresilience.org

想定外を科学する  
SYSTEMS RESILIENCE  
TRANSDISCIPLINARY RESEARCH INTEGRATION CENTER

2012/7/26 -- 27  
本プロジェクトのワークショップを福井県国際高等セミナーハウスで開催し、16名(外部からの招待者4名)が参加しました。

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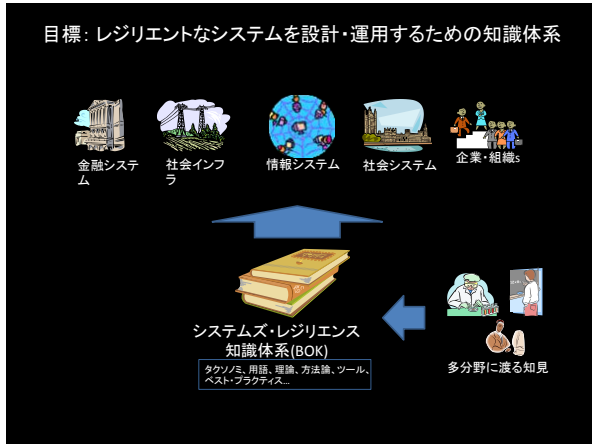
最近の論文  
1. 丸山正典, レジリエントな社会に向けて, 日本ソフトウェア科学会第29回大会, 2012.  
2. 丸山正典, 井上亮巳, 橋本計, 明石祐, 岡田仁志, 高和俊, システムズ・レジリエンス, 第11回情報科学技術フォーラム, 2012年9月.

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仮説: 分野を超えた共通のレジリエンス戦略がある

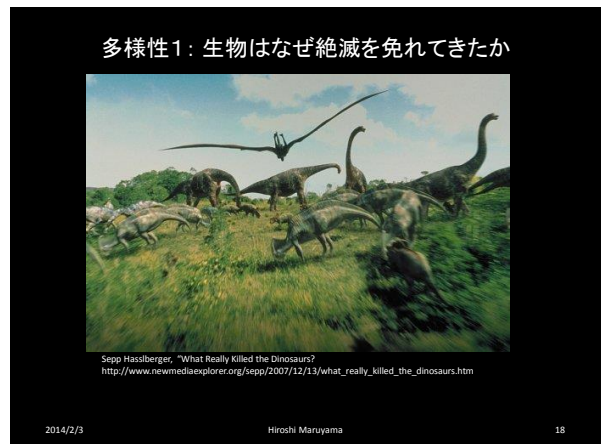
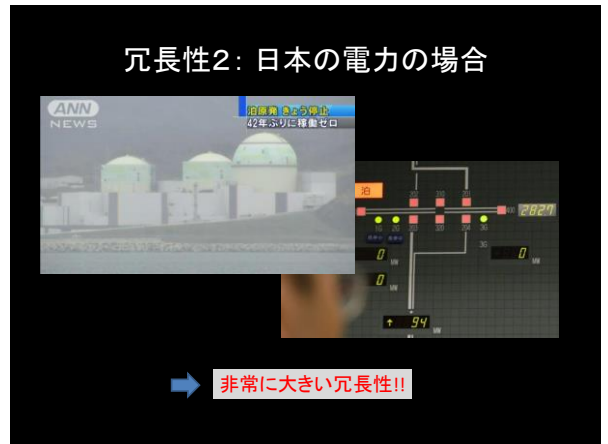
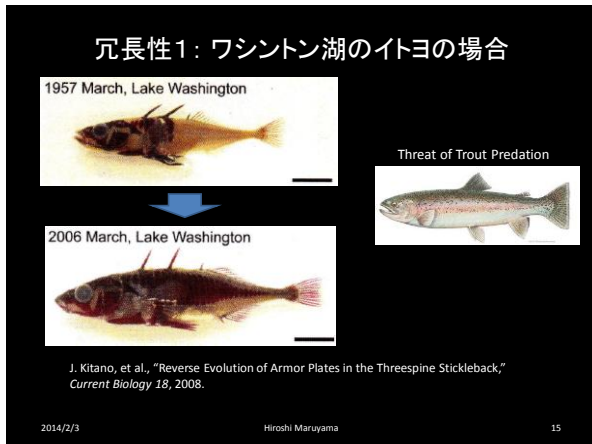
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## レジリエンスの共通戦略

- A) 冗長性
- B) 多様性
- C) 適応性
- D) 能動的レジリエンス

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## 多様性2: コンピュータ・ネットワーク

"Redundancy and Diversity in Security" by Bev Littlewood and Lorenzo Strigini

一様なネットワーク(高効率)

多様なネットワーク(resilient)

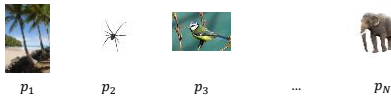
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### 多様性をどのように測るか- 1: ばらつき



$$\sigma = \sum_{i=1}^m \frac{(x_i - \mu)^2}{m}$$

### 多様性をどのように測るか- 2: 種の多様性



Generalized Entropy:  $G_N^\alpha(p_1, p_2, \dots, p_N) = \left( \sum_{i=1}^N \frac{p_i^\alpha}{N} \right)^{\frac{1}{1-\alpha}}$

Number of Types ( $\alpha=0$ ):  $G_N^0(p_1, p_2, \dots, p_N) = N$

Diversity Index ( $\alpha=2$ ):  $G_N^2(p_1, p_2, \dots, p_N) = \left( \sum_{i=1}^N \frac{p_i^2}{N} \right)^{-1}$

### 準備

#### • Replicator Equations

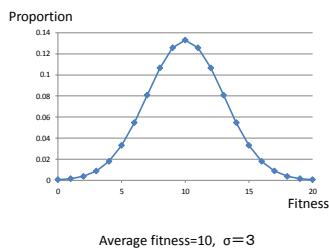
$$p_i^{t+1} = p_i^t \frac{\pi_i}{\pi^t}$$

より環境に適した種の  
 個体数が世代とともに  
 大きくなる

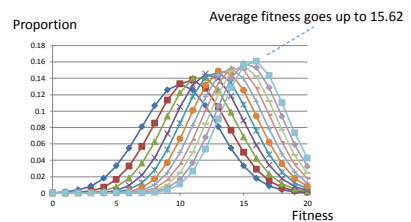
Where

- $p_i^t$  : 種  $i$  の時刻  $t$  における個体数
- $\pi_i$  : 種  $i$  の環境に対する適応度
- $\pi^t$  : 時刻  $t$  における適応度の平均

### 時刻 $t=0$ でのPopulation

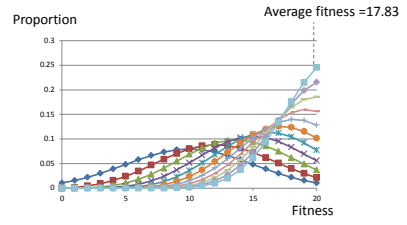
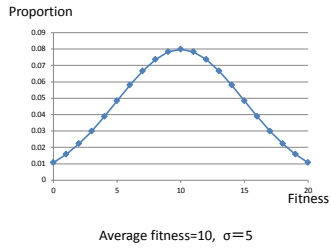


### 10世代後



時刻  $t=0$  でより大きなばらつきがあれば...

10世代後...



➡ ばらつきの大きさは速い進化を可能にする

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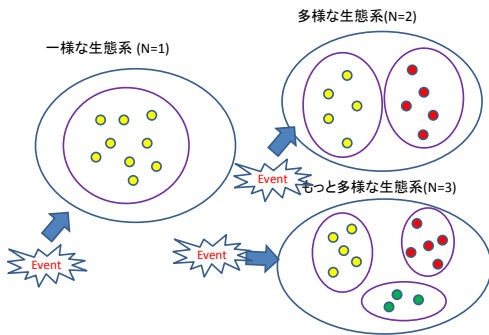
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### 平均化

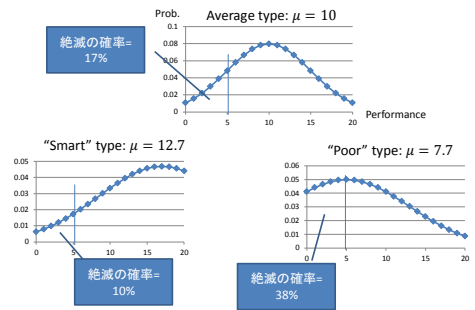


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### 一様な生態系の場合 (N=1)



絶滅確率は、環境に適した種であってもかなり高い

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### 中心極限定理

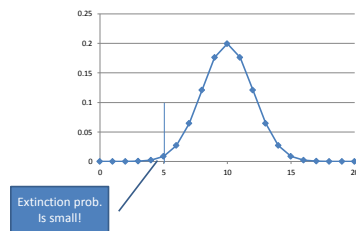
$X_1, X_2, \dots, X_N$  : 独立な確率変数、平均値  $\mu$ 、標準偏差  $\sigma$

$$\bar{X} = \sum_{i=1}^N \frac{X_i}{N}$$

$\bar{X}$  has mean  $\mu$  and standard deviation  $\frac{\sigma}{\sqrt{N}}$

大きなNに対して、ばらつきは小さくなる

多様な生態系においては... (N is large)



多様な生態系では、絶滅確率が小さくなる

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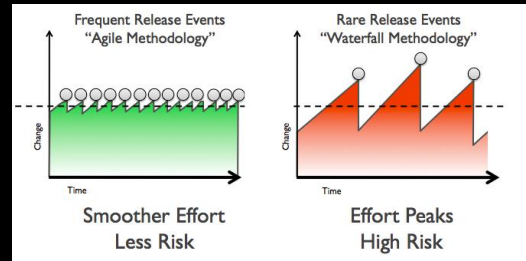
### 多様性3: 森林の小さな再生

“小さな擾乱を積極的に受け入れ、小さな再生やイノベーションを許すことによって、巨大な災害を軽減することができるかもしれない。”



“すべての擾乱を一律に排除するのは、おそらく最も危険な戦略”

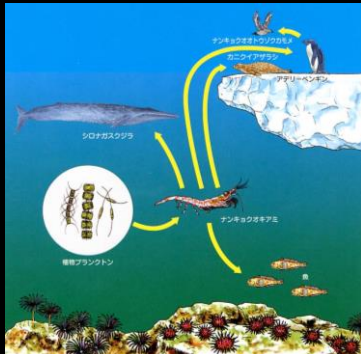
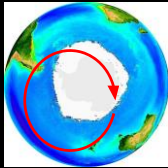
### 小さな擾乱を繰り返すことによるレジリエンス



<http://en.wikipedia.org/wiki/File:Agile-vs-iterative-flow.jpg>

アジャイル、DevOps、GameDay/Chaos Monkey, ...

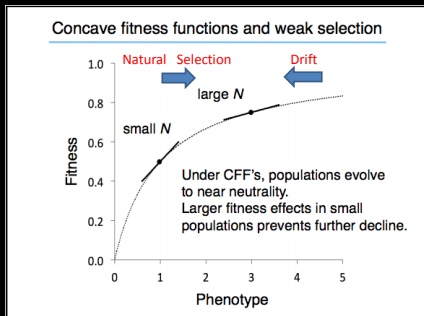
### 多様性4: 南極の生態系



### 多様性をシステムに組み込むには？ — 収穫逓減の法則 (Diminishing Return)

- 夏の日
  - ガリガリ君があると嬉しい
  - 2個目、たぶん嬉しい、でも1個目ほどではない
  - でも、10個目のガリガリ君の価値はほぼゼロ
- 同様の議論があちこちで見られる
  - ベルヌーイの限界効用逓減の法則
  - "Satiation" in marketing; i.e., consumers will have less utility from purchasing the same merchandise

### 集団遺伝学からの知見 凹型適合関数仮説: 「ほぼ中立説」の説明理論



AKASHI H., OSADA N., & OHTA T., 2012 Weak selection and protein evolution. Genetics 192: 15-31

収穫低減則  
↓  
多様性  
↓  
レジリエンス

### 適応性1: オートのミック・コンピューティング

COVER FEATURE

## The Vision of Autonomic Computing

Systems manage themselves according to an administrative model. Components integrate as effortlessly as a new cell in a human body. These ideas are not science fiction; the challenge is to create self-managing computing systems.

Jeffrey C. Kephart  
David M. Chess  
IBM Thomas J. Watson Research Center

In mid-October 2003, IBM released a manifesto observing that the main obstacle to further progress in the IT industry is a looming software complexity crisis. The company cited applications and environments that weigh in at tens of millions of lines of code and require skilled IT professionals to install, configure, tune, and maintain.

Figure operators will be no way to the rapid reuse demands.

**AUTONOMIC OP**  
The only open...  
...development...

Kephart and Chess, "The Vision of Autonomic Computing," IEEE Computer, 2003.

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### 適応性2: 2003年 米国東北部大停電

- 5,500万人に影響
- オハイオの送電線の障害が、連鎖的障害を引き起こした
- 不十分な情報の共有・分析

16:05:57 16:05:57 16:10:37

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### 適応性3: ビジネスのレジリエンス

Harvard Business Review

## Surviving Disruption

October 2002

- Oct. 2002, *How Resilience Works* by Diane L.outu
- Sept. 2003, *The Quest for Resilience* by Gary Hamel and Liisa Välikangas
- Dec. 2012, *Spotlight on How to Manage Disruption*
  - "Surviving Disruption" by Maxwell Wessel and Clayton M. Christensen
  - "Two Routes to Resilience" by Clark Gilbert, Matthew Eyring, and Richard N. Foster
  - "Kiva the Disrupter" by Mick Mountz

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### レジリエンスの数理モデル

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### (動的)制約充足問題としてのモデル化

環境(制約式) → 新しい環境(制約式)

充足

システムの状態 (N個の論理変数で記述)

0110001101110...

0110101101110...

0110101001110...

0110101111110...

新たな環境で生き残るための手続き

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### Example 1: Resilient Spacecraft RS-1



N個の部品:  $X_1, X_2, \dots, X_N$   
 部品の状態: {Green, Red}  
 Fitness: すべての部品が Green

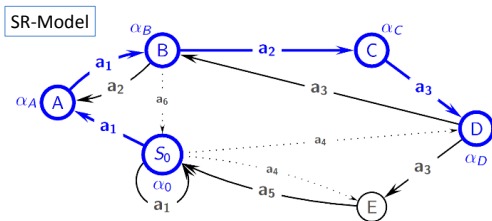


外部イベントの前提:  
 1. 1回の事故は、高々  $k$  個の部品に影響  
 2. 次の  $k$  日間は事故は起きない

適合戦略:  
 • エンジニアは、1日に1つの部品を直す

➡ RS-1 is  $k$ -Resilient

## SR-Model: レジリエンスの計算理論的モデル



Nicolas Schwind, Tenda Okimoto, Katsumi Inoue, Hei Chan, Tony Ribeiro, Kazuhiro Minami, and Hiroshi Maruyama, "Systems Resilience: a Challenge Problem for Dynamic Constraint-Based Agent Systems," In *Proc. of the 12th International Conference on Autonomous Agents and Multiagent Systems (AAMAS)*, May, 2013

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## レジリエンスを表す性質を定義

- **Configuration Trajectory**: some specifications of a particular *system trajectory*  $S_0, S_1, S_2, \dots$
- Properties on configuration trajectories:
  - **$l$ -resistance**: the cost of each state has to be kept under  $l$
  - **$\langle p, q \rangle$ -recoverability**: to recover to a baseline of acceptable quality ( $< p$ ) as quickly and inexpensively as possible
  - **$f$ -functionality**: to provide an average degree of quality  $f$  during the lifetime of the system
  - **$s$ -stabilizability**: to avoid high ( $> s$ ) transitional costs
- A system is  **$\langle l, p, q, f, s \rangle$ -resilient** if there is a **strategy** whose all **scenarios** admit a **configuration trajectory**, which is  $l$ -resistant,  $\langle p, q \rangle$ -recoverable,  $s$ -stabilized and  $f$ -functional.

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## レジリエンスの諸相

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## レジリエンスのタクソノミ

1. 何に対して? – 脅威の種類
2. 何を? – 守るべきシステム
3. どの局面で?
4. 回復のタイプ

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## 1. 何に対して? – 脅威の種類

- 原因: 自然災害  $\Leftrightarrow$  意図的な攻撃
- 頻度: 頻発 (例: 交通事故)  $\Leftrightarrow$  極めて稀 (例: 巨大隕石の衝突)
- 予測可能性: 予測可能 (例: 台風の上陸)  $\Leftrightarrow$  予測不能 (例: 巨大地震)
- 継続時間: 瞬間的 (例: 落雷)  $\Leftrightarrow$  継続的 (例: 地球温暖化)
- 要因: 外的要因 (自然災害)  $\Leftrightarrow$  内的要因 (例: 金融危機)

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## 2. 何を? – 守るべきシステム

- 対象領域
  - 生物、工学システム、社会インフラ、金融システム、会社組織、コミュニティ、社会全般、...
- 受動的 vs 能動的
  - 自律的 (e.g., 生物)  $\Leftrightarrow$  管理的 (e.g., 会社)
- 粒度
  - 個人・個体  $\Leftrightarrow$  コミュニティ (単一種)  $\Leftrightarrow$  エコシステム (複数種)
- 目的関数
  - 単純 (例: 企業 – 1株あたり利益)  $\Leftrightarrow$  Complex (例: 政府 – 多くの相反するステークホルダ)

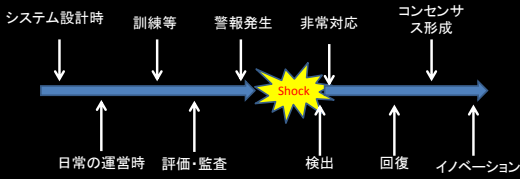
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### 3. どの局面で?



### 4. 回復のタイプ

- 構造的レジリエンス  
– システムの構造も含めて復元する
- 帰納的レジリエンス  
– システムの構造は変化してもよいが、同じ機能を復元する
- 適応的レジリエンス  
– システムの目的も含めて、新たなあり方を模索する

### レジリエンス研究の枠組み

1. Type of Shock	Cause	Natural	<=====>				Intentional
	Frequency	Frequent	<=====>				Rare
	Anticipation	Predictable	<=====>				Unknown unknown
	TimeScale	Acute	<=====>				Chronicle
	Source	External	<=====>				Internal
2. Target System	Domain	Biological	Engineering	Financial	Legal	Civil Infrastructure	
	Organization	Community	Society				
	Passive?	Passive	<=====>				Active
	Granularity	Individual	Single type	<=====>			
3. Phase of resiliency	Design time	Operations	Training	Evaluation	Early warning		
	Detection	E. Response	Recovery	Consensus	Innovation		
4. Type of resiliency	Structural	<=====>				Adaptive	
	Functional	<=====>				Adaptive	

### Resilience Research Worksheet

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Nicolas Schwind, Tenda Okimoto, Katsumi Inoue, Hei Chan, Tony Ribeiro, Kazuhiro Minami, and Hiroshi Maruyama. Systems Resilience: a Challenge Problem for Dynamic Constraint-Based Agent Systems. In Proceedings of the 12th International Conference on Autonomous Agents and Multiagent Systems, May, 2013.

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Tenda Okimoto, Naoto Ikegai, Tony Ribeiro, Katsumi Inoue, Hitoshi Okada and Hiroshi Maruyama. Cyber Security Problem based on Multi-Objective Distributed Constraint Optimization Technique. The 1st Workshop on Systems Resilience (WSR), June, 2013.

## Resilience Research Worksheet

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3. Phase of resiliency	Granularity	Individual	<=====>		Multiple Types		
	Objective	Simple	<=====>				Complex
	Design time	Operations	Training	Evaluation		Early warning	
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	Structural		Functional		Adaptive		



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## Resilience Research Worksheet

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## Resilience Research Worksheet

1. Type of Shock	Cause	Natural	<=====>				Intentional
	Frequency	Frequent	<=====>				Rare
	Anticipation	Predictable	<=====>				Unknown unknown
	TimeScale	Acute	<=====>				Chronicle
2. Target System	Source	External	<=====>				Internal
	Domain	Biological	Engineering	Financial	Legal		Civil Infrastructure
	Organization	Community	Society				
	Passive?	Passive	<=====>				Active
3. Phase of resiliency	Granularity	Individual	<=====>		Multiple Types		
	Objective	Simple	<=====>				Complex
	Design time	Operations	Training	Evaluation		Early warning	
4. Type of resiliency	Detection	E. Response	Recovery	Consensus	Innovation		
	Structural		Functional		Adaptive		



Yoshiaki Yamagata and Hajime Seya. Community-based Resilient Electricity Sharing: Optimal Spatial Clustering. The 1st Workshop on Systems Resilience (WSR), June, 2013.

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Hiroshi Maruyama, Kiyoshi Watanabe, Sachiko Yoshihama, Naohiko Uramoto, Yoichi Takehara, and Kazuhiro Minami. ICHIGAN Security - A Security Architecture that Enables Situation-Based Policy Switching. In Proceedings of the 3rd International Workshop on Resilience and IT-Risk in Social Infrastructures (RISI 2013), September, 2013.

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Thank You

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