

Renewable Energy Popularization Based on Evolutionary Game Theory



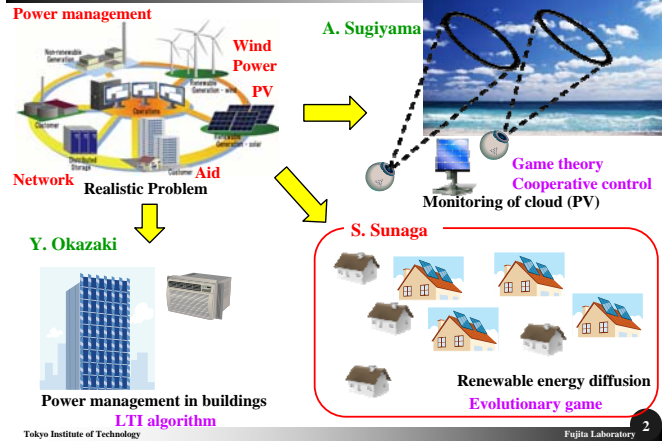
Satoshi Sunaga

FL 12-1-1

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Introduction and Relations



Background

Energy Problem

Environmental Problem

- Carbon dioxide **Global warming**
- Nuclear power **Pollution problem**

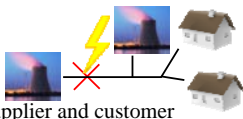
Thermal plant

Nuclear accident

Stable Supply of Energy

Robust to disturbance

- Disasters
- Balance between supplier and customer



Blackout

Especially America and developing countries

Renewable Energy

Wind, solar, solar heat, ... and so on

Clean energy

Low load to environment



Wind

Solar



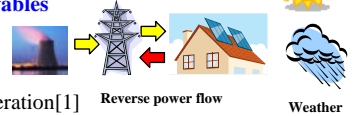
Background

Photo Voltaic(PV) : Renewables

A kind of renewable energy

Problem : Characteristic

- Instability of power generation[1]
- Reverse power flow



Previous Work : Renewables

- Distributed optimal control [2] **Supplier side**
- Optimal control [3] **Consumer side**
- Optimal predictive control [4] **Networks**

Approach : Optimization and Game Theory



Objective

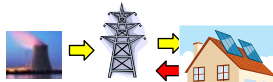
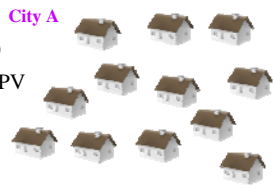
Objective of Research

Regulation of renewable energy(PV)

- Robustness against imbalance of PV
- Optimization of PV rate

Problems

- Many agents in a community
- Many connections of agents
- Instability of power generation



Reverse power flow

Evolutionary Game Theory[8][9]

- Management of many agents **From biology**
- Strategy average of agents **Homogenization of strategy**
- Application of payoff-based game theory



Image

Connection

City A

City B

Abstraction

Population G

○ : An Agent

$$\text{Game : } \Gamma = (v, A, U)$$

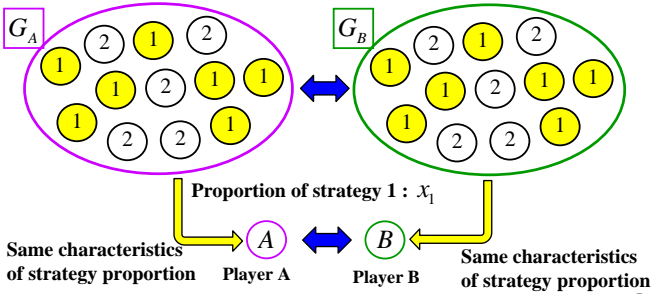
v : Players (Agents)
 A : Action(Strategy) set
 U : Utility (Payoff)



Population and Player

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- ① : An individual which takes strategy 1 **Use PV** Payoff of players A : Ψ_A
- ② : An individual which takes strategy 2 **Not use PV** Payoff of players B : Ψ_B



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Evolutionary Games

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Strategy : Action A

An action which agents have



$x_i, i=1,2$: Strategy frequency

x_1 : Strategy 1

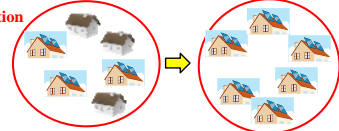
x_2 : Strategy 2

Note : $x_2 = 1 - x_1$

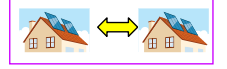
Player v

Agent which has a character of population

Population



Game between two players



Use PV 50 %
Not use PV 50 % Mixed strategy

Payoff U

Rewards to select a strategy Ψ

Average expected payoff

$$U(x_1) = (\text{Payoff using PV}) \times x_1 + (\text{Payoff not using PV}) \times (1 - x_1)$$

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Appendix : Game Theory

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Payoff tabular (Player A and B)

	B	Strategy 1	Strategy 2
A		a	c
		b	d

An example

a : Payoff which both player A and B take strategy 1

2 Player Games : Each player can take either of strategies 1 and 2

Utility Matrix : $\Psi = \begin{bmatrix} a & c \\ b & d \end{bmatrix}$
(Payoff)

Mixed Strategy : Player A takes strategy 1 w.p. p_1 (strategy 2 w.p. $1 - p_1$)
Player B takes strategy 1 w.p. q_1 (strategy 2 w.p. $1 - q_1$)

Expected Payoff :

Both Player A and B

$$a \times p_1 q_1 + c \times p_1 (1 - q_1) + b \times (1 - p_1) q_1 + d \times (1 - p_1) (1 - q_1) = p^T \Psi q$$

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Evolutionary Games

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Replicator Dynamics

Selection in population related to strategy frequency



Getting more advantage strategy

Replicator Dynamics (2 Strategies)

$$\dot{x}_1 = (U_1(x_1) - \bar{U}(x_1)) x_1$$

$\bar{U}(x_1)$: Average expected payoff of population

$$\dot{x}_2 = (U_2(x_1) - \bar{U}(x_1)) x_2$$

$U_1(x_1)$: Expected payoff of strategy 1
 $U_2(x_1)$: Expected payoff of strategy 2

$$\Gamma' = (\Gamma, D) \quad (\Gamma = (v, A, U)) \quad D : \text{Replicator dynamics}$$

This Research

Payoffs are regarded as cost **Negative payoff**



Agents select high payoff strategy \Rightarrow Agents select low cost strategy

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Survey: Electric Fee and PV Power

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Electric power consumed by family : About 300kWh/month

\Rightarrow About 0.42kWh/hour

<http://www.fepec.or.jp/present/jigyoyu/japan/index.html>

http://www.fepec.or.jp/present/jigyoyu/japan/sw_index_04/index.html

PV power : 1000kWh/1kWh module

3kWh~4kWh module is standard for family

\Rightarrow About 0.34~0.46kWh/hour

<http://www.jpea.gr.jp/11basic05.html>

Note : In this web page, electric power by family is 56500kWh/year

\Rightarrow About 0.645kWh/hour

Electrical utility of PV : 42 yen/kWh

Electrical utility of megainfra : 16 yen/kWh

Average of 9 electrical company's fee

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Modeling Based on Electrical Utility

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$$\dot{x}_1 = (U_1(x_1) - \bar{U}(x_1)) x_1$$

$\bar{U}(x_1)$: Average expected payoff

$$(\bar{U}(x_1) = U_1(x_1) x_1 + U_2(x_1) (1 - x_1))$$

$U_1(x_1)$: Expected payoff of strategy 1

Costs of selected strategy 1 (Using PV) : y

$a = (\text{Electrical utility rate of using PV}) \times \text{Electricity of PV power}$
 $+ (\text{Electrical utility rate of not using PV}) \times \text{Electricity of grid power}$

$$y = (1 - R) \times a + R \times c \quad R : \text{Risk of imbalance}$$

c : Cost caused by imbalance

Costs of selected strategy 2 (Not using PV) : z

$z = (\text{Electrical utility rate of not using PV}) \times \text{Electricity of grid power}$

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Feature Work

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■ Modeling

Adding realistic parameters

PV panel failure rate, direction limitation, PV panel cost



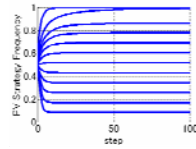
and so on ...

■ Dynamics Analysis

• Bifurcation phenomenon

Relation to allocation of cost

• Control theory PID control



■ Scenario

• Adding learning algorithm PIPIP

• Variety of sceneries Stability, Efficiency, ...

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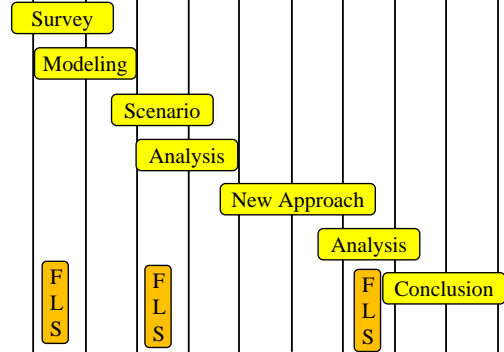
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Research Plan

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Apr. May Jun. Jul. Aug. Sep. Oct. Nov. Dec. Jan. Feb.



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References

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■ Renewable Energy

[1] E. Y. Bitar, P. P. Khargonekar, K. Poolla, "Systems and Control Opportunities in the Integration of Renewable Energy into the Smart Grid," IFAC World Congress, 2011

[2] Z. Changhong, T. Ufuk, L. Steven, "Frequency-Based Load Control in Power Systems," Proc. of the IEEE Conf. on American Control Conference, 2012.

[3] R. Rajagopal, E. Bitar, F. Wu, P. Varaiya, "Risk Limiting Dispatch of Wind Power," Proc. of the IEEE Conf. on American Control Conference, 2012.

[4] S. A. E Maria, G. Dennice, T. Ufuk, "Risk-Mitigated Optimal Power Flow with High Wind Penetration," Proc. of the IEEE Conf. on American Control Conference, 2012.

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References

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■ Evolutionary Game

[5] T. Kanazawa, H. Goto, and T. Ushio, "Replicator Dynamics with Dynamic Payoff Reallocation Based on the Government's Payoff," 2007 International Symposium on Nonlinear Theory and its Applications, 2007.

[6] D. Pais and N. E. Leonard, "Limit Cycles in Replicator-Mutator Network Dynamics," Proc. of the IEEE Conf. on Decision and Control, 2011

[7] M. Saito, T. Hatanaka and M. Fujita, "Decision Dynamics in Cooperative Search Based on Evolutionary Game Theory," Communications in Information and Systems, Special Issue on Control of Complex and Nonlinear Systems, Dedicated to John Baillieul on the Occasion of His 65th Birthday, Vol. 11, No. 1, pp. 57-70, 2011.

[8] 生天目, "ゲーム理論と進化ダイナミクス: 人間関係に潜む複雑系," 森北出版, 2004.

[9] Martin A. Nowak, "進化のダイナミクス: 生命の謎を解き明かす方程式," 共立出版, 2009.

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