

CONTINUOUS-TIME INCENTIVES IN HIERARCHIES

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MOTIVATION

A hierarchy. In an organisation, a hierarchy usually consists of a power entity at the top with subsequent levels of power underneath.

- ▶ Dominant structure in our contemporary society.
- ▶ Raises many questions, on its efficiency, its cost, its optimal size...
- ▶ First mathematical models: Williamson (1967), Calvo and Wellisz (1978) and Keren and Levhari (1979).

Incentives in a hierarchy. Related with Principal-Agent problems, to model information asymmetries within a hierarchy: **ex-ante (adverse selection)** or **ex-post (moral hazard)** the signing of contracts between the entities of the hierarchy (Stiglitz (1975) and Mirrlees (1976)).

- ▶ Succession of nested Stackelberg equilibria.
- ▶ **On moral hazard:** Laffont (1990), Yang (1995)...
- ▶ Discrete-time models, mostly consisting of a single period.

THE ONE-PERIOD MODEL

Sung (2015) – Pay for performance under hierarchical contracting.

- ▶ A Manager is hired by a Principal to subcontract with n Agents. Each worker (Manager and Agents) controls his own output process, and all outputs are assumed to be independent.
- ▶ A one-period model: ‘For ease of exposition and without loss of generality, we formulate a discrete-time model which is analogous to its continuous-time counterpart’ (Sung (2015)).
- ▶ Extending the reasoning of Holmström and Milgrom (1987), Sung **restricts the study to linear contracts**, and states that this restriction is ‘without loss of generality, as long as our results are interpreted in the context of continuous-time models as in Holmström and Milgrom (1987)’ (Sung (2015)).

► A **hierarchical** Principal-Agent model in **one-period** with **moral hazard**.

The Principal (she) is risk-neutral and represents the shareholders (or the investors) of a firm.

The Agents are the $n + 1$ risk-averse workers of the firm (with CARA utility). Each Agent $i \in \{0, \dots, N\}$ (he) produces the **random outcome** X^i by carrying out his own task:

$$X^i = \alpha^i + \sigma^i W^i,$$

where $W^i \sim \mathcal{N}(0, 1)$ are i.i.d.

The effort of the i -th Agent is the variable α^i , inducing him a cost $c^i(\alpha^i) \geq 0$.

Direct contracting: the Principal offers a contract at time $t = 0$ for each Agent to incentivise them to act in her best interest at time $t = 1$, i.e. to improve the benefit of the firm.

Hierarchical contracting:

- (i) the Principal offers a contract at time $t = 0$ for a designated Manager (Agent $i = 0$) to incentivise him to improve the benefit of the firm;
- (ii) the Manager in turn offers contracts for the remaining Agents at time $t = 0$ and increases his own outcome by making an effort α^0 at time $t = 1$;
- (iii) each Agent $i \in \{1, \dots, n\}$ makes an effort α^i at time $t = 1$ to increase his own outcome in exchange of the compensation.

► Interlinked Principal-Agent problems – Sequence of Stackelberg equilibria.

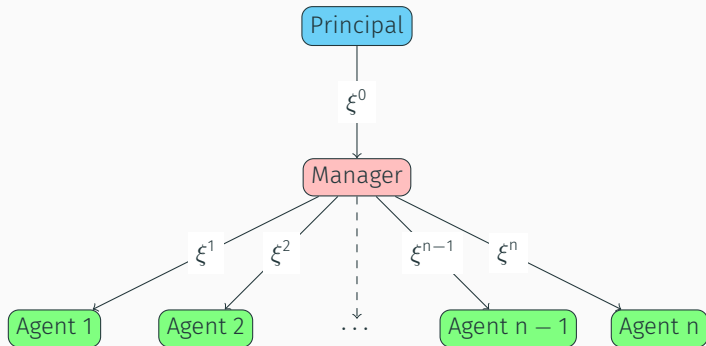


Figure: Sung's Model

Moral hazard in **direct contracting**: the Principal does not observe the effort α^i of the i -th Agent, she only observes his output X^i , for $i \in \{0, \dots, n\}$.

Moral hazard in this **hierarchical contracting** problem:

(i) the Manager does not observe the effort α^i of the i -th Agent, he only observes the output X^i , for $i \in \{1, \dots, n\}$.

► The contract ξ^i for the i -th Agent is indexed on X^i .

(ii) the Principal only observes the net benefit of the total hierarchy,

$$\zeta := \sum_{i=0}^n X^i - \sum_{i=1}^n \xi^i.$$

► The contract ξ^0 for the Manager is indexed on ζ .

In Sung (2015), the output processes are Gaussian, thus the monotone likelihood ratio is not bounded from below.

► No optimal contract in this case (see the existence of forcing contracts in Mirrlees (1999)).

But, in continuous-time, linear contracts are optimal in the case of drift control only (see Sannikov (2008)).

► It is common in one-period models to restrict the study to linear contracts:

$$\xi^i = \xi_0^i - \sup_{a \in \mathbb{R}} \{aZ^i - c^i(a)\} + Z^i X^i + \frac{1}{2} R^i (Z^i)^2 \text{Var}(X^i),$$

where Z^i is a parameter chosen by the Manager.

► Optimal effort: $\hat{\alpha}^i(Z^i)$.

- The Manager controls the mean and the variance of his state variable ζ .

$$\zeta = \alpha^0 + \sigma^0 W^0 - \sum_{i=1}^n \left(\xi_0^i - \hat{\alpha}^i(Z^i) + c^i(\hat{\alpha}^i(Z^i)) + \frac{1}{2} R^i (Z^i \sigma^i)^2 \right) + \sum_{i=1}^n (1 - Z^i) \sigma^i W^i.$$

- The variance of ζ is not observed by the Principal, and thus the contract cannot be indexed on it.
- Sung (2015) restrict again the study to linear contracts, without the variance term.
- But, in continuous-time with volatility control, linear contracts are not optimal, see Cvitanić, Possamaï, and Touzi (2018)...

THE CONTINUOUS-TIME MODEL

Main contributions: Holmström and Milgrom (1987); Sannikov (2008).

Cvitanović, Possamaï, and Touzi (2018). General theory that allows to address a wide spectrum of Principal-Agent problems:

- (i) identify a sub-class of contracts offered by the principal, which are revealing in the sense that the best-reaction function of the agent and his optimal control can be computed straightforwardly;
 - (ii) proving that the restriction is without loss of generality.
- ▶ Standard optimal control problem for the Principal.
 - ▶ Extension to several Agents by Élie and Possamaï (2019); Baldacci, Possamaï, and Rosenbaum (2019), and even to a mean-field of Agents by Élie, Mastrolia, and Possamaï (2018); Élie, Hubert, Mastrolia, and Possamaï (2019).
 - ▶ Only a few continuous-time models for hierarchical problems: Miller and Yang (2015), Li and Yu (2018).

The i -th Agent

- ▶ controls the **drift** of a process X^i with dynamic $dX_t^i = \alpha_t^i dt + \sigma^i dW_t^i$;
- ▶ receives a terminal payment ξ^i which is a function of $(X^i)_{t \in [0,1]}$.

The Manager

- ▶ controls the **drift** of a process X^0 with dynamic $dX_t^0 = \alpha_t^0 dt + \sigma^0 dW_t^0$;
- ▶ designs the contracts ξ^i for $i \in \{1, \dots, n\}$;
- ▶ receives a terminal payment ξ^0 .

The Principal only observes **in continuous-time** the process ζ

$$\zeta_t = \sum_{i=0}^n X_t^i - \sum_{i=1}^n \xi_t^i,$$

for $t \in [0, 1]$, and indexes the contract ξ^0 for the Manager on it.

The i -th Agent:

$$V_0^i(\xi^i) := \sup_{\alpha^i} \mathbb{E}^{\mathbb{P}^i} \left[-\exp \left(-R^i \left(\xi^i - \int_0^1 c^i(\alpha_t^i) dt \right) \right) \right].$$

We will assume for simplicity that $c^i(a) = a^2/2k^i$ (quadratic costs).

The Manager:

$$V_0^0(\xi^0) := \sup_{\alpha^0, (\xi^i)_{i=1, \dots, n}} \mathbb{E}^{\mathbb{P}^0} \left[-\exp \left(-R^0 \left(\xi^0 - \int_0^1 c^0(\alpha_t^0) dt \right) \right) \right]$$

The Principal:

$$V_0 = \sup_{\xi^0} \mathbb{E}^{\mathbb{P}^*} [\zeta_1 - \xi_1^0].$$

Assumption: the compensation for the i -th Agent can only be indexed on his own outcome process X^i .

► The **optimal** form of contracts for the i -th Agent is (see Sannikov (2008)):

$$\xi^i = \xi_0^i - \int_0^1 \mathcal{H}^i(Z_s^i) ds + \int_0^1 Z_s^i dX_s^i + \frac{1}{2} R^i \int_0^1 (Z_s^i)^2 d\langle X^i \rangle_s, \quad (1)$$

where

- (i) Z^i is a payment rate chosen by the Manager;
 - (ii) $\mathcal{H}^i(z) = \sup_{a \in \mathbb{R}} \{az - c^i(a)\}$ is the i -th Agent's Hamiltonian.
- The optimal effort of the i -th Agent is $\hat{\alpha}_t^i = k^i Z_t^i$, and we can compute the dynamics of X^i and ξ^i with this optimal effort.

The Manager controls α^0 and Z^i , for $i \in \{1, \dots, n\}$.

Assumption: the Principal only observes ζ in continuous-time, where:

$$d\zeta_t = \alpha_t^0 dt + \sigma^0 dW_t^0 + \sum_{i=1}^n \left(k^i Z_t^i - \frac{1}{2} (Z_t^i)^2 (k^i + R^i (\sigma^i)^2) \right) dt \\ + \sigma^i \sum_{i=1}^n (1 - Z_t^i) dW_t^i,$$

and thus its quadratic variation (see Bichteler (1981)).

- The Manager controls the volatility of his state variable ζ .
- By Cvitanić, Possamaï, and Touzi (2018), the **optimal** form of contracts is:

$$\xi^0 = \xi_0^0 - \int_0^1 \mathcal{H}^0(Z_s, \Gamma_s) ds + \int_0^1 Z_s d\zeta_s + \frac{1}{2} \int_0^1 (\Gamma_s + R^0 Z_s^2) d\langle \zeta \rangle_s. \quad (2)$$

► Considering contract of the form (2), we can easily solve the Manager's problem by maximising his Hamiltonian:

- (i) the optimal effort on the drift is $\alpha_t^0 := k^0 Z_t$;
- (ii) the optimal control on the i -th Agent's compensation is

$$Z_t^i := \frac{k^i Z_t - (\sigma^i)^2 \Gamma_t}{\left(k^i + R^i (\sigma^i)^2\right) Z_t - (\sigma^i)^2 \Gamma_t}.$$

► We can then compute the dynamics of ζ and ξ^0 under optimal efforts.

The Principal's problem is reduced to

$$V_0 = \sup_{(Z, \Gamma) \in \mathbb{R}^2} \mathbb{E}^{\mathbb{P}^0} [\zeta_T - \xi_T^0].$$

- ▶ The optimal payment rates for the Manager are given by the constant processes Z and $\Gamma := -R^0 Z^3$, where Z is solution of a well-posed maximisation problem.
- ▶ The optimal Γ is different from Sung (2015) where he forced $\Gamma = -R^0 Z^2$.
- ▶ We can write the optimal contracts designed by the Principal to the Manager, and by the Manager to each Agent.

NUMERICAL RESULTS

INCREASE THE MANAGER'S EFFORT...

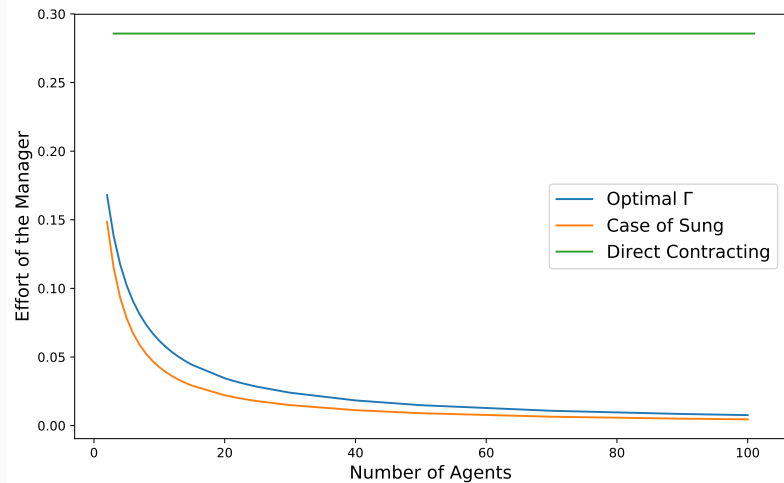


Figure: Effort of the Manager depending on the number of Agents.

... TO DECREASE THE AGENTS' EFFORT

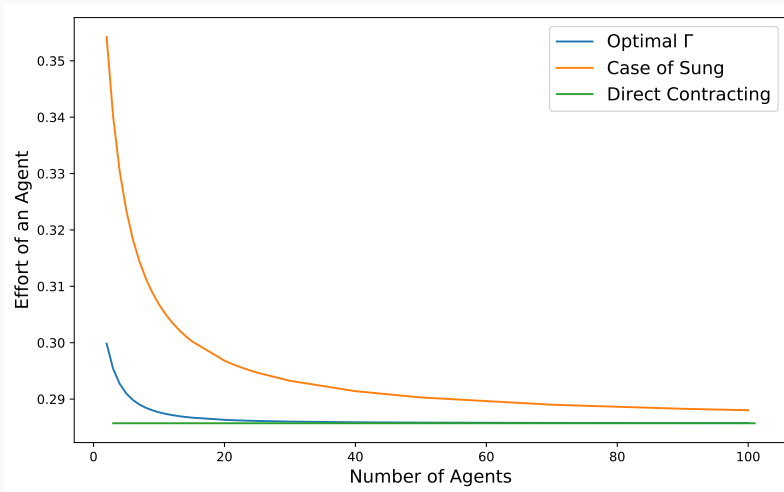


Figure: Effort of an Agent depending on the number of Agents.

GAIN IN UTILITY FOR THE PRINCIPAL

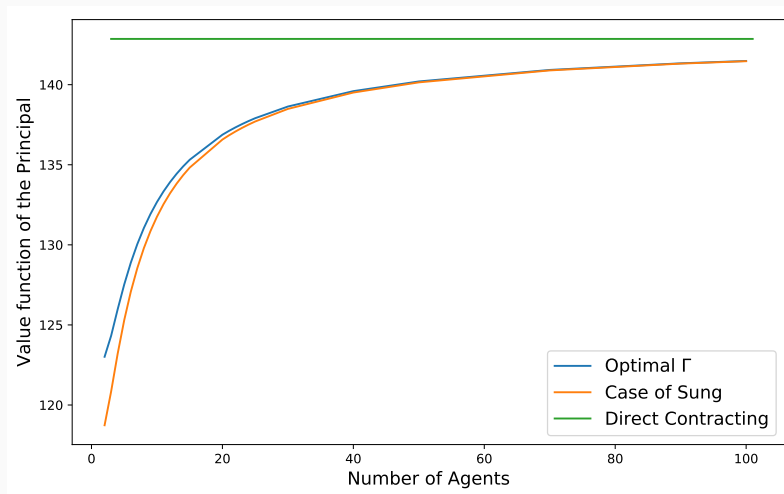


Figure: Value function of the Principal depending on the number of Agents.

CONCLUSION AND EXTENSIONS

- ▶ We improve the results of Sung (2015) by moving to **continuous-time**, since it allows to add a **quadratic variation** term in the contract for the Manager.
- ▶ This model can be extended to
 - (i) a more general hierarchy;
 - (ii) other forms of reporting ζ ;
 - (iii) adding an "ability" parameter of the Manager.
- ▶ Extend to a more general model (**work in progress**) with:
 - (i) general output dynamics;
 - (ii) general utility functions;
 - (iii) general cost functions;
 - (iv) general form of reporting ζ .

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