Introduction	Model	Risk Neutrality	Risk Aversion	Pooling	Conclusion

Equilibrium Securitization with Diverse Beliefs

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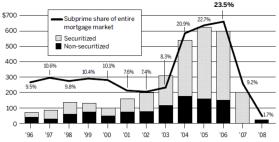
Subprime mortgage crisis

Securitization: pooling and tranching.

Senior tranche of pooled subprime mortgages thought safe Post crisis: correlation underestimated so not actually safe

Subprime Mortgage Originations

In 2006, \$600 billion of subprime loans were originated, most of which were securitized. That year, subprime lending accounted for 23.5% of all mortgage originations.



IN BILLIONS OF DOLLARS

NOTE: Percent securitized is defined as subprime securities issued divided by originations in a given year. In 2007, securities issued exceeded originations.

SOURCE: Inside Mortgage Finance

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Motivatio	on				

Question:

- Why and how to securitize assets when investors have diverse beliefs?
- What are the consequences of securitization?

Approach:

• Optimal security design with heterogeneous beliefs

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Overview of Model

- GE model with
 - a risk free asset called cash and
 - a risky asset (later, collection of risky assets)
- Heterogeneous beliefs about asset's payoff
 - e.g. traders agree on mean but not correlation
- Intermediaries
 - purchase assets
 - issue monotone securities backed by the risky asset

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Results					

- Simple graphical method to characterize securities sold
- When risk-neutral agents disagree about distribution:
 - Tranching emerges as optimal securitization
 - Traders sort amongst tranches according to
 - misperceptions of correlation
 - value of liquidity
 - Asset price rises above expected value
 - Asset price increases in amount of disagreement



- Incentive for intermediary to pool assets and then tranche the pool when traders disagree about their correlation
 - pooling creates "complexity" and increases revenue by inducing disagreement (cf Ghent et al., 2017)
- Partial equilibrium with risk aversion: very similar to risk-neutral
- General equilibrium with risk aversion:
 - when same beliefs but different tastes, no tranching and sorting
 - (without background risk)
 - Speculation vs. Risk-sharing (vs. Adverse selection)

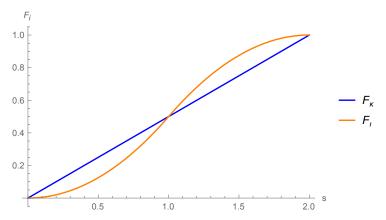
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Setup					

- Two period exchange economy
- One representative intermediary (issuer)
- N types of traders of equal measure
- Assets
 - Risky asset pays s in state $s \in S \equiv [0, \overline{s}]$
 - Safe asset (cash) pays 1 in each state
- Type *i* trader:
 - belief about risky asset payoff: CDF *F_i F_i* is non-atomic, support in *S*
 - continuously differentiable, concave, and strictly increasing utility index *u_i* with first derivative bounded
 - endowment:

 e_i^c units of cash, e_i^a assets, θ_i share of the intermediary

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Example:					

- *N* = 2
- Asset is bundle of two mortgages, each distributed U[0,1]
- Trader κ (blue) thinks perfectly correlated
- Trader ι (orange) thinks independent



Introduction	Model	Risk Neutrality	Risk Aversion	Pooling	Conclusion
Model					

- The intermediary issues securities backed by the risky asset
- Set of securities is

$$\mathcal{B} = \{\phi: \mathcal{S} \to \mathbb{R}_+ | \phi \text{ is increasing} \}$$

- ϕ returns $\phi(s)$ in state s
- increasing: moral hazard
- Let $\mathcal{M}(\mathcal{B})$ be set of finite, Borel measures on \mathcal{B} (positive)
- Purchases a_0 units of asset, sells $\mu_0 \in \mathcal{M}(\mathcal{B})$ securities
- Feasibility of the securities sold:

$$\int_{\mathcal{B}} \phi(s) d\mu_0 \leq sa_0$$

Introduction	Model	Risk Neutrality	Risk Aversion	Pooling	Conclusion
Model					

- Competitive markets for the asset and each security
 - Cash numeraire: $p_c = 1$
 - Price of the risky asset: p
 - Price of security ϕ : $q(\phi)$
 - $q:\mathcal{B}
 ightarrow \mathbb{R}_+$ is price function
- No short selling

Introduction	Model	Risk Neutrality	Risk Aversion	Pooling	Conclusion
lssuer's	problem				

Issuer chooses measure $\mu_0 \in \mathcal{M}(\mathcal{B})$ to maximize profit

$$\pi = \int_{\mathcal{B}} q d\mu_0 - p a_0$$

subject to

$$\int_{\mathcal{B}} \phi(s) d\mu_0 \leq {\it sa}_0 \, orall s \in S$$

and non-negativity

Introduction Model Risk Neutrality Risk Aversion Pooling Conclusion
Trader *i*'s problem

Choose cash c_i , asset a_i and security purchases $\mu_i \in \mathcal{M}(\mathcal{B})$ to maximize utility

$$\max_{a_i,\mu_i,c_i} \mathbb{E}_i \left[u_i \left(sa_i + \int_{\mathcal{B}} \phi(s) d\mu_i + c_i \right) \right],$$

subject to

$$pa_i + \int_{\mathcal{B}} qd\mu_i + c_i \leq e_i^c + pe_i^a + heta_i\pi$$

and non-negativity

• No short selling: $\mu_i \ge 0$

An **equilibrium** for the economy $(F_i, e_i^a, e_i^c, \theta_i)_{i=1}^N$ is an allocation $(a_i, c_i, \mu_i)_{i=1}^N$, π , μ_0 and price vector (p, q) so that

- The intermediary and traders solve their problems
- The allocation is feasible:

$$\sum_{i=0}^{N} a_i \leq \sum_{i=1}^{N} e_i^a
onumber \ \sum_{i=1}^{N} c_i \leq \sum_{i=1}^{N} e_i^c
onumber \ \sum_{i=1}^{N} \mu_i = \mu_0$$

Proposition

An equilibrium exists.

Introduction	Model	Risk Neutrality	Risk Aversion	Pooling	Conclusion
Security	pricing				

Start with risk neutral traders: $u_i(x) = x$ for all *i* and all *x*

• Obs. 1: constant marginal value of cash

 $V_i(w; p, q) = v_i w$ $w = pe_i^a + e_i^c + \theta_i \pi.$ $v_i : \text{trader } i\text{'s marginal return on wealth}$

- v_i is implicitly a function of p and q
 call v = (v₁,..., v_N) the "return vector"
- **Obs. 2:** equilibrium price of security ϕ ,

$$q(\phi) \geq \max_i \mathbb{E}_i \left[\frac{1}{v_i} \phi(s)
ight],$$

with equality whenever $\mu_0(\{\phi\}) > 0$

Introduction	Model	Risk Neutrality	Risk Aversion	Pooling	Conclusion
Intermed	liary's se	curitization d	ecision		

• We can write

$$\phi(s) = \int_{\mathcal{S}} \chi_{[x,\bar{s}]}(s) d\phi(x)$$

(Lebesgue-Stieltjes measure; χ_E is indicator of E)

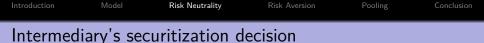
• By Fubini's Theorem, we have that

$$\mathbb{E}_i\left[\frac{1}{v_i}\phi(s)\right] = \int_S \frac{1}{v_i}\left[1 - F_i(x)\right] d\phi(x)$$

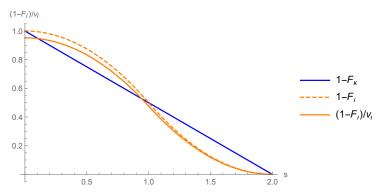
• Maximal revenue of the intermediary, as a function of v, is

$$r(v) = \int_0^{\bar{s}} \max_k v_k^{-1} \left[1 - F_k(x) \right] dx$$

per unit of asset securitized

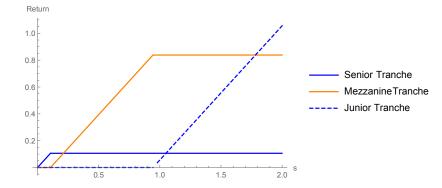


- Simple method for solving problem:
 - Plot Inverse CDFs, adjusted for value of cash
 - Ø Maximum revenue is area below upper-envelope
 - Sind tranches corresponding to upper-envelope



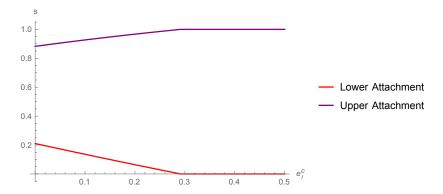
Introduction	Model	Risk Neutrality	Risk Aversion	Pooling	Conclusion
Intermed	liary's see	curitization d	ecision		

- Simple method for solving problem:
 - Plot Inverse CDFs, adjusted for rate of return
 - 2 Maximum revenue is area under upper-envelope
 - Sind tranches corresponding to upper-envelope



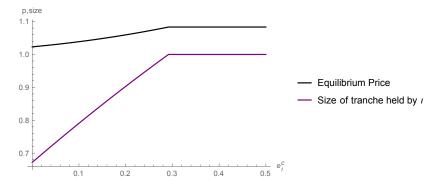
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Equilibri	um				

Equilibrium with endowments $e_{\iota}^{a} = e_{\kappa}^{a} = \frac{1}{2}$, $e_{\kappa}^{c} = 1$ and $e_{\iota}^{c} > 0$:



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Equilibriu	ım				

Equilibrium with endowments
$$e_{\iota}^{a} = e_{\kappa}^{a} = \frac{1}{2}$$
, $e_{\kappa}^{c} = 1$ and $e_{\iota}^{c} > 0$:



Introduction Model Risk Neutrality Risk Aversion Pooling Conclusion
Interlude: Assumption

Assumption : Finite Crossing

For distinct traders i, j and any number k > 0,

$$1-F_i(x)=k\left[1-F_j(x)\right]$$

for at most finitely many $x \in [0, \overline{s}]$

- Finite Crossing implied by any of the following (among others):
 - Strict MLRP
 - Finite (or single) Crossing of Hazard Rates
 - Each F_i analytic on $(0, \bar{s})$

Introduction	Model	Risk Neutrality	Risk Aversion	Pooling	Conclusion			
Equilibrium properties								

Proposition

With risk neutrality:

• Equilibrium utility and price are unique, $p = r(\hat{v})$

In addition, with Finite Crossing:

- equilibrium consumption is state-by-state unique and
- equilibrium supply of securities can equal a finite set of tranches
- Tranche promises cash flow of asset above a but below b
 - Security $\phi_{[a,b]}$ with $\phi_{[a,b]}(0) = 0$, slope 1 on interval [a,b], and slope 0 otherwise

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Equilibrium properties: tranching

With Finite Crossing, tranching and sorting equilibrium exists:

Definition

An equilibrium is a tranching and sorting equilibrium if

- only tranches are sold
- 2 each tranche is targeted at a particular trader.

proper if at least two are sold and none can be combined

Formally, there are intervals $\{[a_i, b_i] : i = 1, ..., m\}$ with $a_1 = 0$, $b_m = \overline{s}$, $a_i < b_i$, and $a_{i+1} = b_i$ such that $\hat{\mu}_0\left(\left\{\phi_{[a_i, b_i]} : i = 1, ..., m\right\}^c\right) = 0$ and $\hat{\mu}_i(\left\{\phi_{[a_j, b_j]}\right\}) > 0$ implies that $\hat{\mu}_k(\left\{\phi_{[a_j, b_j]}\right\}) = 0$ for all $k \neq i$. *Proper* if $m \ge 2$ and $\hat{\mu}_i(\left\{\phi_{[a_j, b_j]}\right\}) > 0$ implies $\hat{\mu}_i(\left\{\phi_{[a_{j+1}, b_{j+1}]}\right\}) = \hat{\mu}_i(\left\{\phi_{[a_{j-1}, b_{j-1}]}\right\}) = 0$. Introduction Model Risk Neutrality Risk Aversion Pooling Conclusion
Equilibrium properties: tranching

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Equilibrium properties: prices

Proposition

With risk neutrality, if $\mathbb{E}_i[s] = m$ for i = 1, ...N, then in any equilibrium, $\hat{p} \ge m$. Under Finite Crossing, this is strict.

• Similar to Harrison-Kreps and Fostel-Geanakoplos

Introduction Model Risk Neutrality Risk Aversion Pooling Conclusion Equilibrium properties: changes in beliefs

Proposition

Let e_1^c , e_2^c be sufficiently large and $\mathbb{E}_{F_1}[s] = \mathbb{E}_{\tilde{F}_1}[s]$. With risk neutrality, replacing Trader 1's beliefs F_1 with \tilde{F}_1 **increases the equilibrium price** if and only if

$$\int_0^{ar{s}} | ilde{F}_1(x) - F_2(x)| dx \geq \int_0^{ar{s}} |F_1(x) - F_2(x)| dx.$$

- increasing disagreement increases price
- correct notion of disagreement is L₁-norm between CDFs



Proposition

Consider a tranching and sorting equilibrium where Trader i holds the senior tranche. With risk neutrality and Finite crossing: If the cash endowment of Trader i is **increases** by Δ , then Trader i's equilibrium allocation of cash **increases** by Δ

- Generically, trader who holds senior tranche also holds cash
- Misidentification of risk preference from equilibrium demand
- Intuition:
 - Difference in beliefs about low returns is small
 - Demanded rate of return alone fixes WTP for senior tranche
 - Cash gives lowest rate, so this trader also holds cash

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Risk Ave	ersion				

• Trader *i* maximizes

$$\mathbb{E}_i\left[u_i\left(\mathsf{s}\mathsf{a}_i+\int_{\mathcal{B}}\phi(\mathsf{s})\mu_i(\mathsf{d}\phi)+\mathsf{c}_i
ight)
ight],$$

where utility index $u_i : \mathbb{R}_+ \to \mathbb{R}$ is

- strictly increasing
- continuously differentiable with bounded derivative
- weakly (or strictly) concave
- What do optimal securities look like?

Skip to Pooling

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Security	Pricing				

- Two important endogenous variables:
 - $w(s) = (w_1(s), ..., w_2(s))$, the state-by-state wealth function
 - $v = (v_1, \ldots, v_N)$, the *return vector* (on ex ante wealth)
 - Lagrange multiplier on Budget Constraint
- For any security ϕ , we must have that

$$\int_0^{\bar{s}} u_i(w_i(s) + \epsilon \phi(s)) dF_i - v_i q(\phi) \epsilon \leq \int_0^{\bar{s}} u_i(w_i(s)) dF_i$$

for infinitessimal $\epsilon > 0$ (also $\epsilon \le 0$ if $\mu_i(\{\phi\}) > 0$)

• Dividing by ϵ and letting $\epsilon \rightarrow$ 0, we have

$$\frac{1}{v_i}\int_{\mathcal{S}}u_i'(w_i(s))\phi(s)dF_i\leq q(\phi)$$

with equality for $\hat{\mu}_{0}\text{-a.e}~\phi$

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Security	Pricing				

• Rewriting:

$$q(\phi) = \frac{1}{v_i} \int_{S} u'_i(w_i(s))\phi(s)dF_i$$

= $\max_i \left\{ \frac{1}{\tilde{v}_i} \left(Cov_i \left[\phi, \frac{u'_i \circ w_i}{\mathbb{E}_i \left[u'_i \circ w_i \right]} \right] + \mathbb{E}_i \left[\phi \right] \right) \right\}$

where $\tilde{v}_i = \frac{v_i}{\mathbb{E}_i \left[u_i' \circ w_i \right]}$ is opportunity cost in terms of cash

- Incentive to take advantage of disagreement
- But blunted by desire to share risks (*Cov_i* term negative)

• Find optimal securities in similar way to before: let

$$G_i(x|w) = \int_x^{\overline{s}} u'_i(w_i(s)) dF_i(s)$$

•
$$u'_i(x) = 1$$
 implies $G_i(x|w) = 1 - F_i(x)$

• For right-continuous ϕ , use Fubini to show

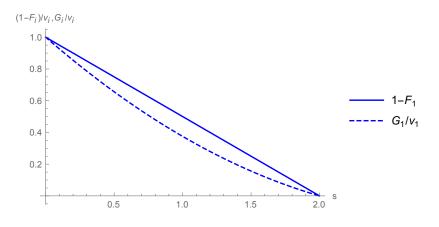
$$\int_{x\in S} u_i'(w_i(x))\phi(x)dF_i(x) = \int_{x\in S} G_i(x|w_i)d\phi(x)$$

• So for μ_0 -a.e. $\phi \in \mathcal{B}$ we must have

$$q(\phi) = \max_{k} \frac{1}{v_k} \int_{S} G_k(x|w) d\phi(x)$$

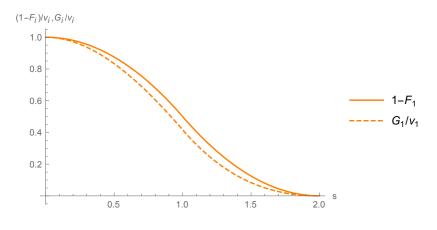
• Can solve issuer's problem as before, when we replace $v_i^{-1} [1 - F_i(x)]$ with $v_i^{-1}G_i(x)$

Intermediary's securitization decision



- $u_i(x) = x \frac{1}{8}x^2$ and $w_i(s) = 1 + s$ for i = 1, 2
- same beliefs as before

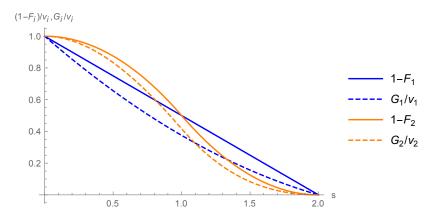
Intermediary's securitization decision



• $u_i(x) = x - \frac{1}{8}x^2$ and $w_i(s) = 1 + s$ for i = 1, 2

• same beliefs as before

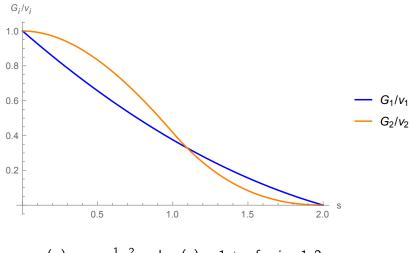
Intermediary's securitization decision



•
$$u_i(x) = x - \frac{1}{8}x^2$$
 and $w_i(s) = 1 + s$ for $i = 1, 2$

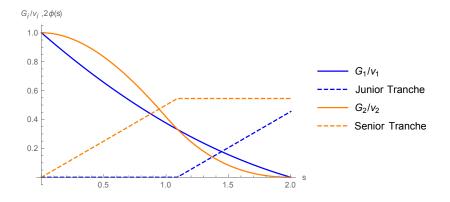
same beliefs as before

Intermediary's securitization decision



u_i(x) = x - ¹/₈x² and w_i(s) = 1 + s for i = 1, 2
same beliefs as before

Intermediary's securitization decision



- $u_i(x) = x \frac{1}{8}x^2$ and $w_i(s) = 1 + s$ for i = 1, 2
- same beliefs as before
- **NB**: Not equilibrium $-w_i(s)$ does not match up

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Intermediary's securitization decision

Proposition

If the equilibrium return vector is \hat{v} and state-by-state wealth is $\hat{w},$ then the issuer obtains revenue

$$\int_0^{\bar{s}} \max_k \hat{v}_k^{-1} G_k(x|\hat{w}) dx.$$

• Generalizes previous result since $G_k(x|\hat{w}) = 1 - F_k(x)$ with risk neutrality

Diverse beliefs vs diverse tastes

Proposition

For traders with strictly concave utility indices and homogeneous, full-support beliefs, no proper tranching and sorting equilibrium exists when endowments are large enough that all traders hold cash.

- Diverse tastes alone does not generate tranching
- Optimal securitization does not allocate risky tranches to those most willing to bear it

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Diverse beliefs vs diverse tastes

- Suppose each Trader *i* has a CARA utility with index α_i
- Equilibrium with large enough cash endowments and same beliefs:
 - Trader *i* purchases $\frac{\alpha_i^{-1}}{\sum_{k=1}^{N} \alpha_k^{-1}}$ units of the asset and no securities
 - The equilibruim asset price is

$$\hat{p} = \frac{\int_0^{\bar{s}} s \exp\left[-\left(\sum_{k=1}^N \alpha_k^{-1}\right)^{-1} s\right] dF(s)}{\int_0^{\bar{s}} \exp\left[-\left(\sum_{k=1}^N \alpha_k^{-1}\right)^{-1} s\right] dF(s)}$$

• Tranching has no value since

$$\frac{1}{v_i}G_i(x|w_i(s)) = \frac{\int_x^{\overline{s}} \exp\left[-\left(\sum_{k=1}^N \alpha_k^{-1}\right)^{-1}s\right] dF(s)}{\int_0^{\overline{s}} \exp\left[-\left(\sum_{k=1}^N \alpha_k^{-1}\right)^{-1}s\right] dF(s)}$$

Setup with two types of risky assets

- Two traders
- Two types of risky assets, with payoffs $s_1 \in S_1$ and $s_2 \in S_2$
 - e.g. mortgages, credit card debt, auto-loans
- Endowment of type *i* trader: e_i^c , e_i^1 , e_i^2
- Intermediary
 - purchases some amount of each asset
 - sells securities backed by return of entire pool

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Setup with two types of risky assets

- Trader *i* thinks S₁, S₂ independent with probability ρ_i; otherwise, perfectly correlated
- Each asset has same marginal density f
 - Same marginal beliefs
 - No role for securities backed by single asset
- f differentiable, log-concave and symmetric about its mean
 - Applies to the uniform, normal, logistic or truncated normal distributions

- The intermediary purchases a_0^j units of asset j
 - $h = h(a_0) \equiv \frac{a_0^1}{a_0^1 + a_0^2}$: proportion of type 1 asset in his pool
- Same set of contracts as before, but ϕ returns $\phi(s_h)$ where

$$s_h = hs_1 + (1-h)s_2$$

- Write $F^h(\cdot)$ for CDF of s_h
- Maximizes profit

$$\max_{a_{0},\mu_{0}} \left[\int_{\mathcal{B}} q_{h(a_{0})}(\phi) d\mu_{0} - p_{1}a_{0}^{1} - p_{2}a_{0}^{2} \right]$$

subject to

$$\int_{\mathcal{B}} \phi(s) d\mu_0 \leq (a_0^1 + a_0^2) s, \, orall s \in [0, ar{s}]$$

Pooling characterization

Proposition

If each e_c^i is large enough, then there exist an equilibrium where all assets are pooled and the price of both assets exceeds their mean. More formally: $\hat{a}_o^j = e_1^j + e_2^j$ for j = 1, 2,

$$\hat{h} = rac{\sum_{i=1}^{2} e_i^1}{\sum_{i=1}^{2} e_i^1 + \sum_{i=1}^{2} e_i^2} \hat{p}_1 = R(\hat{h}) + (1 - \hat{h})R'(\hat{h}) \hat{p}_2 = R(\hat{h}) - \hat{h}R'(\hat{h})$$

for $R(h) = \int_{\mathcal{S}} \max_k (1 - F_k^h(x)) dx$

- Pooling and tranching allow traders to bet on correlation
 (the correlation trade)
- Drives up asset price sell asset and use to speculate
- "complexity" causes disagreement but does not deceive traders

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Conclusion and Related Literature

• Collateralized loans with diverse beliefs:

Simsek (2013a), Geanakoplos and Zame (1997/2014), Geanakoplos (2001/03), Fostel and Geanakoplos (2015), Gong and Phelan (2016), Toda (2015), \dots

- Existing literature focuses on
 - a particular structure for possible securities and
 - optimists vs pessimists: first moment heterogeneity
- Optimal security design Allen and Gale (1988)
 - with diverse beliefs: Germaise (2001), Simsek (2013b), Ortner-Schmalz (2016)
 - under adverse selection: Dang, Gorton and Holmstrom (2015); DeMarzo-Duffie (1999); Fahri and Tirole (2015)
- Correlation misperception: Ellis and Piccione (2017)