### Forward Dynamic Utility

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### Plan

#### Utility forward

- Framework and definition
- Forward Stochastic Utilities
  Définition
- Non linear Stochastic PDE
  Utility Volatility



# Investment Banking and Utility Theory I

Some remarks on utility functions and their dynamic properties from M.Musiela, T.Zariphopoulo, C.Rogers +alii (2005-2009)

- No clear idea how to specify the utility function
- Classical or recursive utility are defined in isolation to the investment opportunities given to an agent
- Explicit solutions to optimal investment problems can only be derived under very restrictive model and utility assumptions - dependence on the Markovian assumption and HJB equations
- In non-Markovian framework, theory is concentrated on the problem of existence and uniqueness of an optimal solution, often via the dual representation of utility.

# Investment Banking and Utility Theory II

#### Main Drawbacks

- Not easy to develop pratical intuition on asset allocation
- Creates potential intertemporal inconsistency

### The classical formulation I

#### **Different steps**

- Choose a utility function, U(x) (concave et strictly increasing) for a fixed investment horizon T
- Specify the investment universe, i.e. the dynamics of assets would be traded, and investment constraints.
- Solve for a self-financing strategy selection which maximizes the expected utility of the terminal wealth
- Analyze properties of the optimal solution

# Shortcomings I

#### Intertemporality

- The investor may want to use intertemporal diversification, i.e., implement short, medium and long term strategies
- 2 Can the same utility function be used for all time horizons?
- No- in fact the investor gets more value (in terms of the value function) from a longer term investment.
- At the optimum the investor should become indifferent to the investment horizon. .

# Dynamic programming and Intertemporality I

- In the classical formulation the utility refers to the utility for the last rebalancing period
- The mathematical version is the Dynamic programming principle (in Markovian setup for simplicity) : Let V(t,x,U,T) be the maximal expected utility for a initial wealth x at time t, and a terminal utility function U(x, T), then

$$V(t, x, U, T) = V(t, x, V(t+h, ., U, T), t+h)$$

The value function V(t + h, ., U, T) is the implied utility for the maturity t + h

# Dynamic programming and Intertemporality II

- To be indifferent to investment horizon, it needs to maintain a intertemporal consistency
- Only at the optimum the investor achieves on the average his performance objectives. Sub optimally he experiences decreasing future expected performance.
- Need to be stable with respect of classical operation in the market as change of numéraire.

### **Forward Dynamic Utility**

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### Investment Universe I

Asset dynamics

$$d\xi_t^i = \xi_t^i [b_t^j dt + \sum_{i=1}^d \sigma_t^{i,j} dW_t^j], \qquad d\xi_t^0 = \xi_t^0 r_t dt$$

- Risk premium vector,  $\eta(t)$  with  $b(t) r(t)\mathbf{1} = \sigma_t \eta(t)$
- Self-financing strategy starting from x at time r

$$dX_t^{\pi} = r_t X_t^{\pi} dt + \pi_t^* \sigma_t (dW_t + \eta_t dt) \quad , X_r^{\pi} = x$$

• The set of admissible strategies is a vector space (cone) denoted by *A*.

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### Classical optimization problem I

#### Classical problem

Given a utility function U(T, x), maximize :

$$V(r,x) = sup_{\pi \in \mathcal{A}} \mathsf{E}(U(X^{\pi}_T))$$

- The choice of numéraire is not really discussed
- Backward problem since the solution is obtained by recursive procedure from the horizon.

In the forward point of view, a given utility function is randomly diffused, but with the constrained to be at any time a utility function.

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### Forward Utility I

#### Definition (Forward Utility)

A forward dynamic utility process starting from the given utility U(r, x), is an adapted process u(t, x) s.t.

- i) Concavity assumption u(r, .) = U(r), and for  $t \ge r$ ,  $x \mapsto u(t, x)$  is increasing concave function,
- ii) Consistency with the investment universe For any admissible strategy  $\pi inA$

$$\mathbb{E}_{\mathbb{P}}(u(t, X_t^{\pi})/\mathcal{F}_s) \leq u(s, X_s^{\pi}), \ \forall s \leq t$$

or equivalently  $(u(t, X_t^{\pi}); t \ge r)$  is a supermartingale.

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#### Definition

iii) Existence of optimal There exists an optimal admissible self-financing strategy  $\pi^*$ , for which the utility of the optimal wealth is a martingale :

$$\mathbb{E}_{\mathbb{P}}(u(t,X_t^{\pi^*})/\mathcal{F}_s) = u(s,X_s^{\pi^*}), \ \forall s \leq t$$

iv) In short for any admissible strategy,  $u(t, X_t^{\pi})$  is a supermartingale, and a martingale for the optimal strategy  $\pi^*$  and then :

u(r, x) is the value function of the optimization program with terminal random utility function u(T, x),

$$u(r,x) = \sup_{\pi \in \mathcal{A}(r,x)} \mathbf{E}(u(T,X_T^{r,x,\pi})/\mathcal{F}_r), \ \forall T \geq r$$

where  $\mathcal{A}(r, x)$  is the set of admissible strategies

#### Définition

# Change of probability in standard utility function I

Let v be  $C^2$ - utility function and Z a positive semimartingale, with drift  $\lambda_t$  and volatility  $\gamma_t$ .

#### Change of probability

Let *u* be the adapted process defined by  $u(t, x) \stackrel{\text{def}}{=} Z_t v(x)$ . u(t, x) is an adapted concave and increasing random field

 Consistency with Investment Universe The supermartingale property for  $u(t, X_t^{\pi})$  holds true when Z is the discounted density of martingale measure  $H_t = \exp(-\int_0^t (r_s ds + \eta_s^* dW_s + \frac{1}{2} ||\eta_s||^2 ds)$  or the discounted density of any equivalent martingale measure.

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The condition is not necessary, since by standard calculation, if

$$\frac{v}{xv_x(t,x)}\mu_t + r_t - \frac{v_x(t,x)}{2xv_{xx}(t,x)}||\operatorname{Proj}_{\mathcal{A}}(\eta_t + \gamma_t)||^2 = 0$$

The property holds true

• If 
$$v(x) = x^{1-\alpha}/1 - \alpha$$
 (Power utility) and  $\mu_t/(\alpha - 1) + r_t - \frac{1}{2\alpha} || \|\eta_t + \gamma_t \|_{\mathcal{A}} ||^2$ , then *u* is a forward utility.

• If 
$$v(x) = \exp -cx$$
 is a forward utility if  $r = 0$ , and  $\mu_t = \frac{1}{2} ||\|\eta_t + \gamma_t\|_{\mathcal{A}}||^2$ 

• In the other cases, the martingale is the only solution....

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Définition

# Change of Numéraire I

Let Y a positive process with return  $\alpha_t$  and volatility  $\delta_t$ .

#### Change of numeraire

Let u be  $u(t, x) \stackrel{\text{def}}{=} v(x/Y_t)$ . u(t, x) is an adapted concave and increasing random field

- The supermartingale property holds true if Y is the inverse of discounted density of martingale measure, known as Market Numéraire, or Growth optimal portfolio.
- We have  $r_t = \alpha_t \langle \delta_t, \eta_t \rangle$ ,  $\eta \delta \in (\mathcal{K}\sigma_t)^{\perp}, \delta \in (\mathcal{K}\sigma_t)$
- By Itô's formula, the volatility of the forward utility is  $\Gamma(t, x) = -x \, u_x(t, x) \delta$

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#### Markovian case I

We first consider the Markovian case where

- all parameters are functions of the time and of the state variables.
- The diffusion generator is the elliptic operator  $\mathcal{L}^{\xi}$  w.r.  $\xi$ .
- Admissible portfolios are stable w. r. to the initial condition

$$X_{t+h}^{r,x,\pi} = X_{t+h}^{t,X_t^{r,x,\pi},\pi}, \quad \pi \in \mathcal{A}(t,X_t^{r,x,\pi})$$

#### What is HJB equation for Markovian forward utility?

#### Example (HJB PDE)

Let  $u(t,.,\xi)$  be a Markov forward utility with initial condition u(r, x), concave w.r. to x. Then

$$u_t(t, x, \xi) + \mathcal{L}^{\xi} u(t, x, \xi) + \mathbf{H}(t, x, \xi, u', u'', \Delta^{\sigma}_{x,\xi} u)(t, x)) = \mathbf{0}$$

• The Hamiltonian is defined for w < 0 by

$$\mathbf{H}(t, x, \xi, \boldsymbol{p}, \boldsymbol{p}', \boldsymbol{w}) = \sup_{\pi \in \mathcal{A}_t} \left( < \sigma^* \pi, \boldsymbol{p} \eta + \boldsymbol{p}' > +1/2 \, \pi^* \sigma \sigma^* \pi \right)$$

•  $\mathbf{H}(t, x, \xi, p, p', w) = -\frac{1}{2w} ||\operatorname{Proj}_{\mathcal{K}_t}(\eta p + p')||^2$  is the Hamiltonian taken at the optimal

### Optimal Portfolio and Volatility I

**Optimal portfolio** 

$$\tilde{\pi}\tilde{\sigma}(t,x,\xi) = -\frac{1}{u_{xx}(t,x,\xi)}\operatorname{Proj}_{\mathcal{K}_t}(\eta u' + \Delta_{x,\xi}^{\sigma}u).$$

Volatility Parameters The utility volatility is  $\Gamma(t, x, \xi_t)$  is

$$\Gamma(t, x, \xi) = (\nabla_{\xi} u(t, x, \xi))^* \sigma(t, \xi), \quad \Gamma_x = \frac{\partial}{\partial x} \Gamma^u.$$

Theorem (Non Linear Dynamics, u(r, x) = U(r, x))

$$du(t, x, \xi_t) = \frac{||\operatorname{Proj}_{\mathcal{K}_t}(u_x(t, x)\eta_t + \Gamma_x(t, x, \xi_t))||^2}{2u_{xx}(t, x, \xi_t)}dt + \Gamma(t, x, \xi_t)dW_t$$

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### Stochastic PDE I

In the case of forward utility, we apply Itô-Ventzell-Kunita to the random field u(t, x) in place of Ito formula.

#### Theorem

# The general case :Drift Constraint Assume that $du(t, x) = \beta(t, x)dt + \Gamma(t, x)dW_t$ , u(r, x) = u(x), then

$$\beta(t,x) = u_x(t,x) \cdot \frac{u_x(t,x)}{2u_{xx}(t,x)} ||\operatorname{Proj}_{\mathcal{K}_t}(\eta_t + \frac{\Gamma_x(t,x)}{u_x(t,x)})||^2$$

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#### **Open Questions?** I

- What about the volatility of the utility?
- Under which assumptions, how can be sure that solutions are concave and increasing, with Inada condition and asymptotic elasticity constraint.

Non linear Stochastic PDE Utility Volatility

#### Decreasing forward Utility I

Zariphopoulo, C.Rogers and alii

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# Decreasing forward Utility II

#### Theorem

Assume the volatility  $\forall t$ ,  $\forall x \Gamma(t, x) = 0$ . Then u is decreasing in time,

$$du(t,x) = \frac{u_x^2}{2u_{xx}(t,x)} ||\eta_t||^2 dt$$

 u is a forward utility iff there exist C and ν, a finite measure with support in [0, +∞) (ν(0) = 0), such that the Fenchel transform of u, v(t, x) verifies

$$u(t,y) = \int \frac{1}{1-r} (1-y^{1-r} e^{\frac{r(1-r)}{2} \int_0^t |\eta_s|^2 ds} \nu(dr) + C$$

• This result is based on the result of Widder (1963) characterizing positive space-time harmonic function.

### The new market I

New "hat" equations

$$d\hat{X}_{t}^{\pi} = [\gamma_{t}^{*}\eta_{t}]\hat{X}_{t}^{\pi}dt + [\frac{\pi_{t}^{*}\sigma_{t}}{y_{t}} - \hat{X}_{t}^{\pi}\gamma_{t}]^{*}(dW_{t} + (\eta_{t} - \gamma_{t})dt)$$
$$\frac{d\hat{\xi}_{t}^{i}}{\hat{\xi}_{t}^{i}} = b_{t}^{i}dt + (\sigma_{t}^{i} - \gamma_{t})^{*}(dW_{t} - \gamma_{t}dt) \ 0 \le i \le d$$

Let  $\overline{\xi}$  be  $(\widehat{\xi}, y)$  et par  $\overline{\sigma}$  la matrice $((\sigma^i - \gamma)_{i=1..d}, \gamma)$ , et on supposera que les utilités forward dans ce marché sont fonctions régulières du temps *t*, de la richesse  $\widehat{x}$  et de  $\overline{\xi}$ 

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Change of numeraire

### Change of numéraire I

Let y > 0 be a new numéraire such that  $\frac{dy_t}{y_t} = \gamma_t dW_t$ In the new market,

$$\hat{X}_t^{\pi} := rac{X_t^{\pi}}{y_t}, \ \hat{\xi}_t^i := rac{\xi_t^i}{y_t}$$

and

$$\begin{aligned} \frac{d\hat{\xi}_t^i}{\hat{\xi}_t^i} &= b_t^i dt + (\sigma_t^i - \delta_t)^* (dW_t - \delta_t dt) \\ d\hat{X}_t^\pi &= [\delta_t^* \eta_t] \hat{X}_t^\pi dt + [\frac{\pi_t^* \sigma_t}{y_t} - \hat{X}_t^\pi \gamma_t]^* (dW_t + (\eta_t - \delta_t) dt) \end{aligned}$$

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Change of numeraire

### Change of numéraire II

#### Theorem (Stability by change of numeraire)

Let u(t,x) be a forward utility and  $Y_t$  a numeraire. Then  $\hat{u}(t, \hat{x}) = u(t, x/Y_t)$  is a forward utility with the investment universe associated with the change of numeraire  $(X_t/Y_t)$ , with initial condition  $\hat{u}(0, \hat{x}) = u(0, y\hat{x})$ 

### Volatility Interpretation I

By change of numéraire, we can still assume that the market has no risk premium.

The volatility of *u* may the optimization still no trivial.

#### Theorem (Volatility and risk premium)

With the market numeraire as numeraire, the volatility of the forward utility sans prime de risque, is the transform of the first utility. The ration  $\frac{\Gamma_x}{u_x}$  play the rôleof a risk premium associated with the wealth x at time t.

Change of numeraire argument permits also to characterize forward utility with given optimal portfolio (Work in progress)

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# thank you for your attention

A useful command in beamer, to allow beamer to create new frame if the page is full.

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