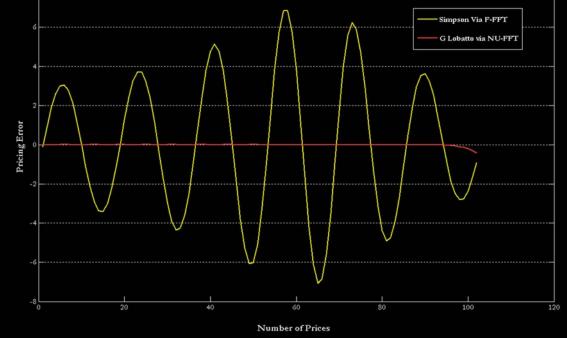
Numerical Methods in Semianalytical Derivatives Pricing

Efficient Solutions for Standard, Fractional and Non Uniform Discrete Transforms





Syllabus of the presentation

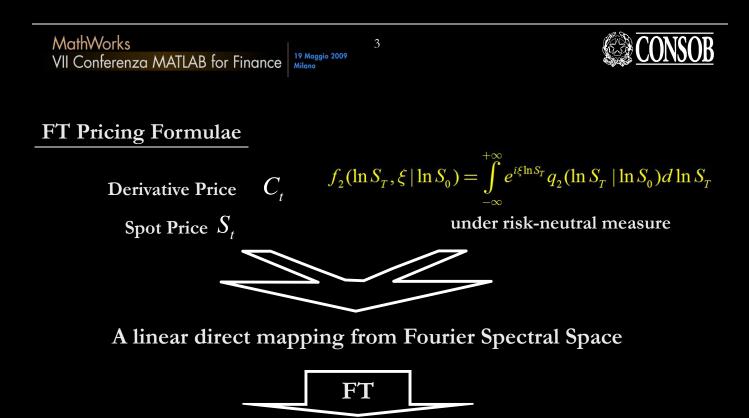
• Review of Derivative Pricing via DFT

- FT Pricing Formulae
- DFT Convergence to FT
- Convergence Theorems for Uniform Grids
- Convergence Theorems for Non Uniform Gaussian Grids
- Fast Derivative Pricing
 - Fractional FFT
 - Non Uniform FFT
 - •Gaussian Gridding: a matter of interpolation
 - Fractional vs Non Uniform FFT: Empirical Analysis
 - Conclusions



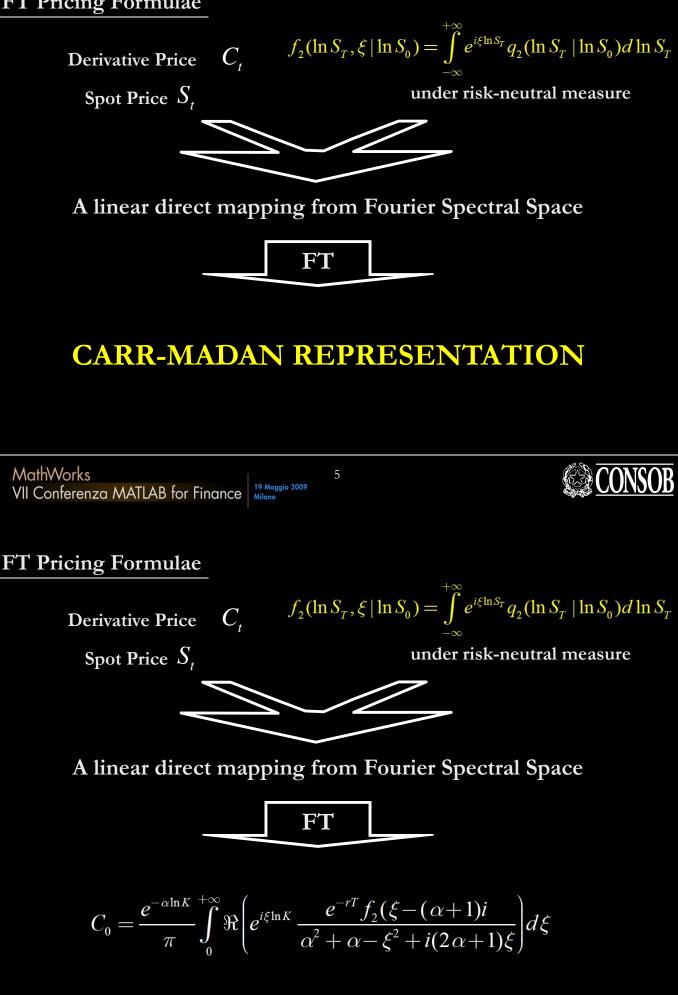
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- Convergence Theorems for Non Uniform Gaussian Grids





FT Pricing Formulae





FT Pricing Formulae



means choosing a dampened oscillating characteristic function

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FT Pricing Formulae



means choosing a dampened oscillating characteristic function

Recent Developments:

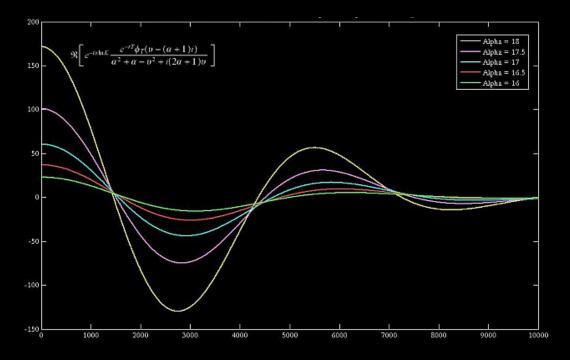
Lee, 2004 - Journal of Computational Finance

Minenna, Verzella - Quant Congress 2006

Lord, Kahl, 2007 - Journal of Computational Finance

CARR-MADAN REPRESENTATION



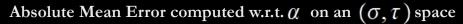


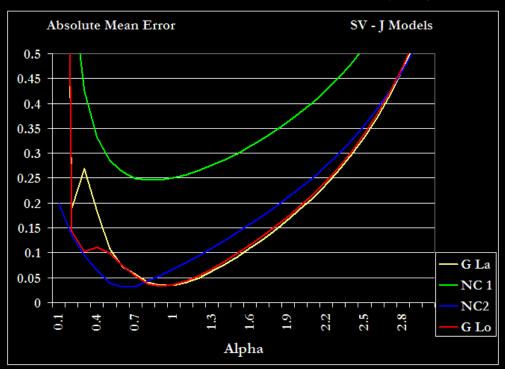
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MathWorks VII Conferenza MATLAB for Finance	9 Maggio 2009 Jano
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FT Pricing Formulae





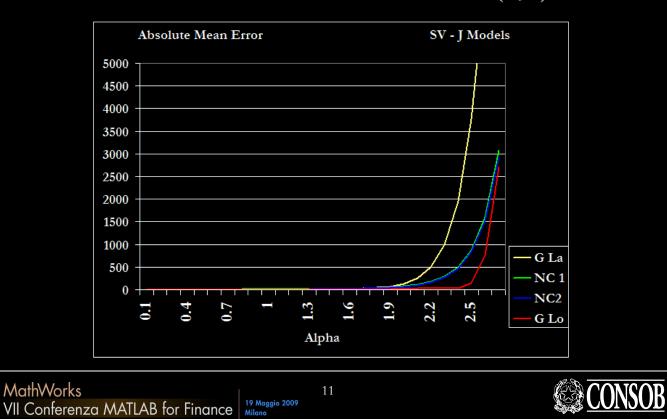




FT Pricing Formulae

Stability

Absolute Mean Error computed w.r.t. α on an Extended (σ, τ) space



Syllabus of the presentation

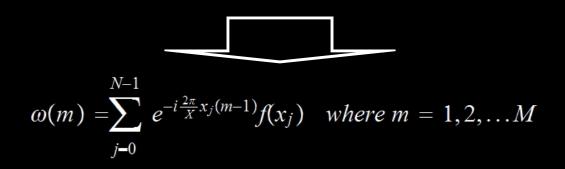
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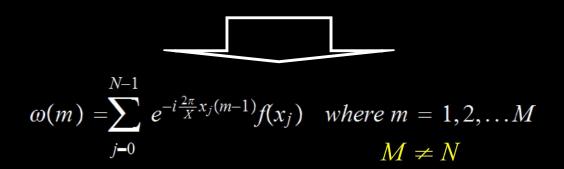
Given the General DFT

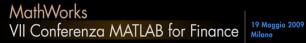




DFT Convergence to FT

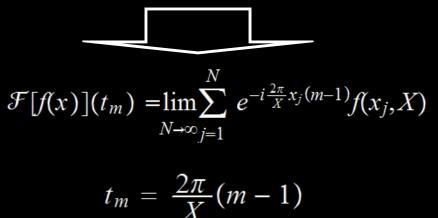
Given the General DFT







The Convergence Theorem for General DFT's (C Th)

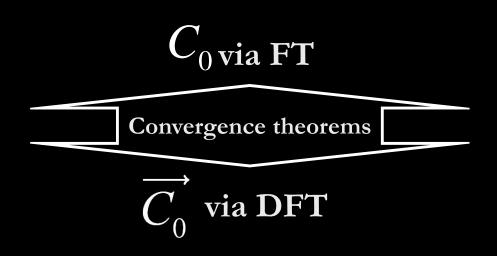


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DFT Convergence to FT





• Review of Derivative Pricing via DFT

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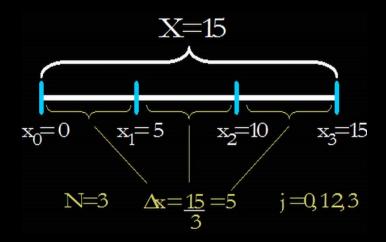




Convergence Theorems for Uniform Grids

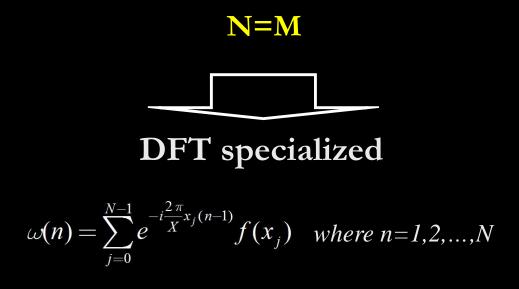
Condition 1

Uniform Discretization Grid





Condition 2



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Convergence Theorems for Uniform Grids

Condition 1

Condition 2

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DFT Simplified Formula

$$\omega(n) = \sum_{j=0}^{N-1} e^{-i2\pi k j \gamma} f(x_j)$$
 where $n = 1...N$



Nyquist – Shannon Limit (N-S)

$$\mathcal{F}[f(x)](t_n) = \lim_{N \to \infty} \frac{X}{N} \omega(n)$$

$$\{t_n\}_{n=1..\frac{N}{2}}$$
 for N even

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$$\{t_n\}_{n=1..\frac{N+1}{2}}$$

for N odd

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1

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Convergence Theorems for Uniform Grids

$$C_0 = \frac{e^{-\alpha \ln K}}{\pi} \int_0^{+\infty} \Re \left(e^{i\xi \ln K} \frac{e^{-rT} f_2(\xi - (\alpha + 1)i)}{\alpha^2 + \alpha - \xi^2 + i(2\alpha + 1)\xi} \right) d\xi$$

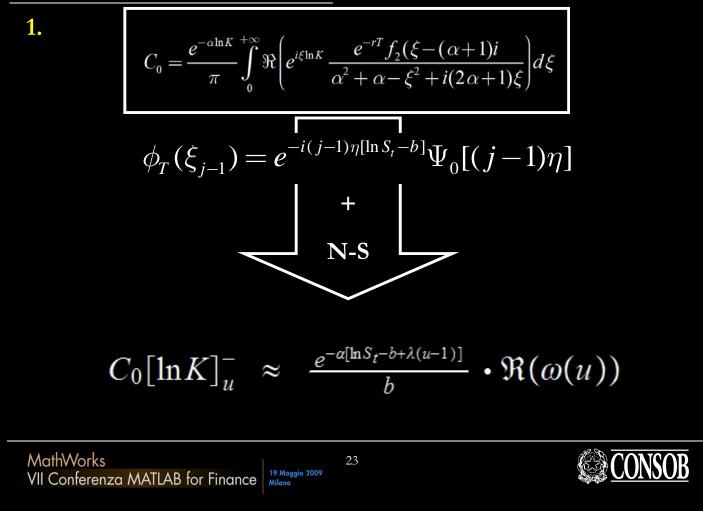
Uniform Discretization Grids for f

1.
$$\phi_T(\xi_{j-1}) = e^{-i(j-1)\eta[\ln S_t - b]} \Psi_0[(j-1)\eta]$$

2.
$$\phi_T(\xi_{j-1}) = e^{-i(j-1)\eta[\ln S_t - b]} \Psi_0[(j-1)\eta] \cdot [3 + (-1)^{j+1} - \delta_j - \delta_{N-j}]$$



Convergence Theorems for Uniform Grids



Convergence Theorems for Uniform Grids

2. $C_{0} = \frac{e^{-\alpha \ln K}}{\pi} \int_{0}^{+\infty} \Re \left[e^{i\xi \ln K} \frac{e^{-rT} f_{2}(\xi - (\alpha + 1)i)}{\alpha^{2} + \alpha - \xi^{2} + i(2\alpha + 1)\xi} \right] d\xi$ $\phi_{T}(\xi_{j-1}) = e^{-i(j-1)\eta [\ln S_{t} - b]} \Psi_{0}[(j-1)\eta] \cdot [3 + (-1)^{j+1} - \delta_{j} - \delta_{N-j}]$ + N-S $C_{0}[\ln K]_{u}^{-} \approx \frac{e^{-\alpha [\ln S_{t} - b + \lambda(u-1)]}}{3b} \cdot \Re(\omega(u))$



• Review of Derivative Pricing via DFT

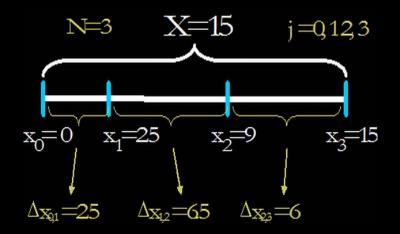
- FT Pricing Formulae
- DFT Convergence to FT
- Convergence Theorems for Uniform Grids
- Convergence Theorems for Non Uniform Gaussian Grids



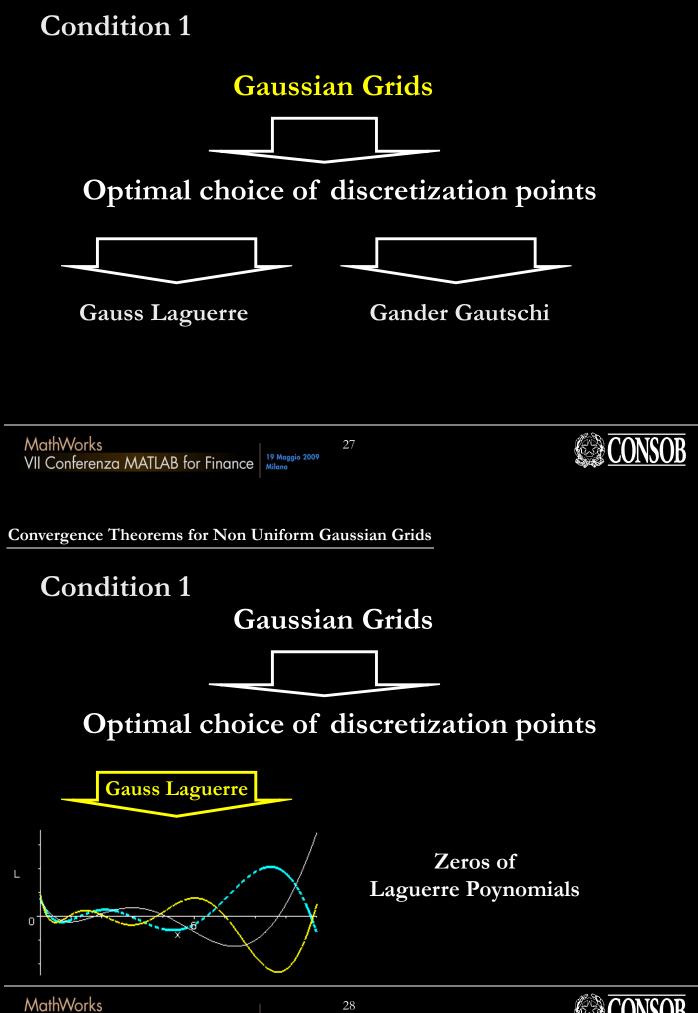
Convergence Theorems for Non Uniform Gaussian Grids

Condition 1

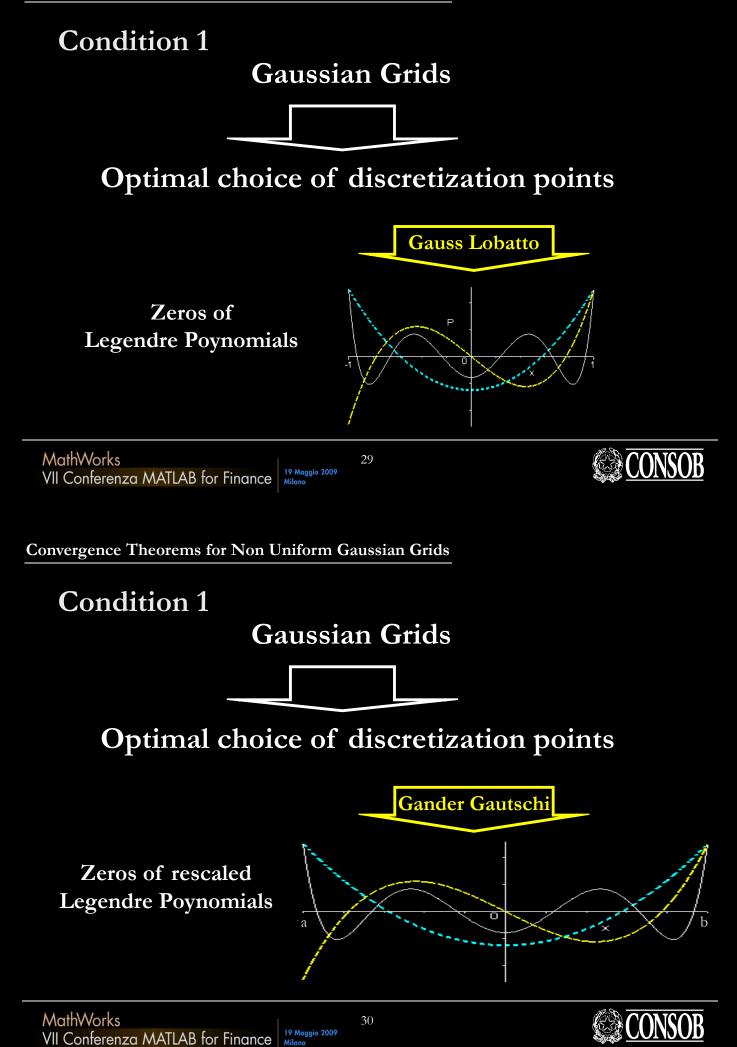
Non Uniform Discretization Grid



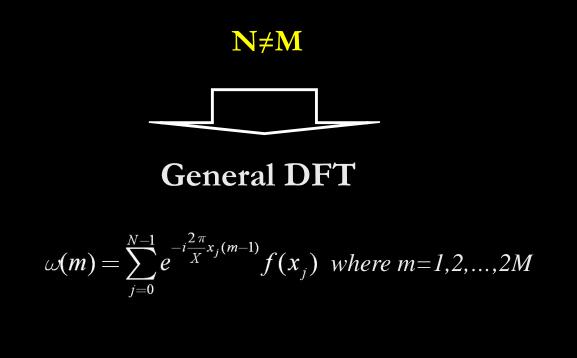








Condition 2



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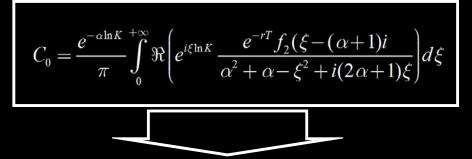
Convergence Theorems for Non Uniform Gaussian Grids

The Convergence Theorem for General DFT's (C Th)

$$\mathcal{F}[f(x)](t_m) = \lim_{N \to \infty} \sum_{j=1}^{N} e^{-i\frac{2\pi}{X}x_j(m-1)} f(x_j, X)$$
$$t_m = \frac{2\pi}{X} (m-1)$$



Convergence Theorems for Non Uniform Gaussian Grids



Gaussian Grids for f

$$1. \quad \phi_{T} \left(\xi_{j-1}\right) = e^{\left[1 + i\left(\frac{M\pi}{a^{*}} - \ln S_{t}\right)\right]\xi_{j-1}} \Psi_{0}\left[\xi_{j-1}\right] \cdot \frac{1}{L_{N+1}\left(\xi_{j-1}\right)L'_{N}\left(\xi_{j-1}\right)}$$
$$2. \quad \phi_{T}\left(\frac{1}{2}a\left(1 + \xi_{j-1}\right)\right) = e^{\left[-i\left(\frac{1}{2}a\left(1 + \xi_{j-1}\right)\right)\left(\ln S_{t} - \frac{M\pi}{a^{*}}\right)\right]} \Psi_{0}\left[\frac{1}{2}a\left(1 + \xi_{j-1}\right)\right] \cdot \frac{1}{\left[P_{N-1}\left(\xi_{j-1}\right)\right]^{2}}$$

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Convergence Theorems for Non Uniform Gaussian Grids

1.

$$C_{0} = \frac{e^{-\alpha \ln K}}{\pi} \int_{0}^{+\infty} \Re \left[e^{i\xi \ln K} \frac{e^{-iT} f_{2}(\xi - (\alpha + 1)i)}{\alpha^{2} + \alpha - \xi^{2} + i(2\alpha + 1)\xi} \right] d\xi$$

$$\phi_{T}(\xi_{j-1}) = e^{\left[1 + i \left[\frac{M\pi}{a^{*}} - \ln S_{i}\right]\right]\xi_{j-1}} \Psi_{0}[\xi_{j-1}] \cdot \frac{1}{L_{N+1}(\xi_{j-1})L'_{N}(\xi_{j-1})} + C_{0}([\ln K]_{u}^{*}) \approx -\Re \left[\frac{e^{-\alpha \left(\ln S_{t} - \frac{M\pi}{a^{*}} + \frac{2\pi}{a^{*}}(u-1)\right)}}{\pi} \frac{1}{N+1} \cdot \omega^{*}(u) \right]$$



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2. $C_{0} = \frac{e^{-\alpha \ln K}}{\pi} \int_{0}^{+\infty} \Re \left[e^{i\xi \ln K} \frac{e^{-rT} f_{2}(\xi - (\alpha + 1)i)}{\alpha^{2} + \alpha - \xi^{2} + i(2\alpha + 1)\xi} \right] d\xi$ $\phi_{T} \left(\frac{1}{2} a \left(1 + \xi_{j-1} \right) \right) = e^{\left[-i \left(\frac{1}{2} a (1 + \xi_{j-1}) \right) \right] \left(\ln S_{r} - \frac{M\pi}{a^{*}} \right) \right]} \Psi_{0} \left[\frac{1}{2} a \left(1 + \xi_{j-1} \right) \right] \cdot \frac{1}{\left[P_{N-1} \left(\xi_{j-1} \right) \right]^{2}}$ $+ \int_{C-Th} \int_{C-Th} \int_{U} \int_{U}$

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MathWorks VII Conferenza MATLAB for Finance Milano^{19 Maggio 2009}

Syllabus of the presentation

• Review of Derivative Pricing via DFT

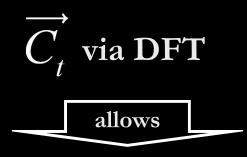
- FT Pricing Formulae
- DFT Convergence to FT
- Convergence Theorems for Uniform Grids
- Convergence Theorems for Non Uniform Gaussian Grids

• Fast Derivative Pricing

- Fractional FFT
- Non Uniform FFT
 - •Gaussian Gridding: a matter of interpolation
- Fractional vs Non Uniform FFT: Empirical Analysis
- Conclusions



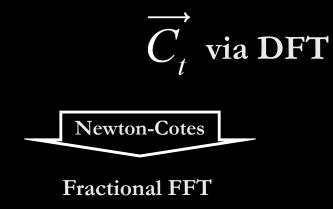
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Fast Fourier Trasform Algorithms



Fast Option Pricing











Syllabus of the presentation

• Review of Derivative Pricing via DFT

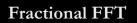
- The Lewis Standard Machine
- DFT Convergence to FT
- Convergence Theorems for Uniform Grids
- Convergence Theorems for Non Uniform Gaussian Grids

Fast Derivative Pricing

- Fractional FFT
- Non Uniform FFT
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- Conclusions







The Fractional DFT





Fractional FFT





$$\omega(n) = \sum_{j=0}^{N-1} e^{-i2\pi k j \gamma} f(x_j)$$
 where $n = 1...N$



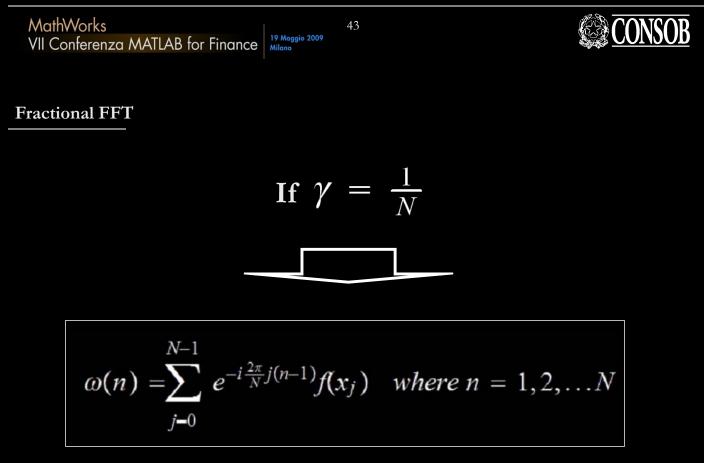


The Fractional DFT



$$\omega(n) = \sum_{j=0}^{N-1} e^{-i2\pi k j \gamma} f(x_j) \quad where \quad n = 1...N$$

with γ that can be any complex number



The standard DFT definition





Choosing two indipendent uniform grids MathWorks CONSOB 45 VII Conferenza MATLAB for Finance Milano **Fractional FFT** Choosing two indipendent uniform grids $x_j = jg\left(\frac{a}{N}\right)$ for j = 1...N**Spectral Grid**

$$\left[\ln K\right]_{u}^{*} = \ln S_{t} - b + \lambda_{u} \quad for \ u = 1, \dots, N$$

Log-Strike Grid

Choosing two indipendent uniform grids





Fractional FFT

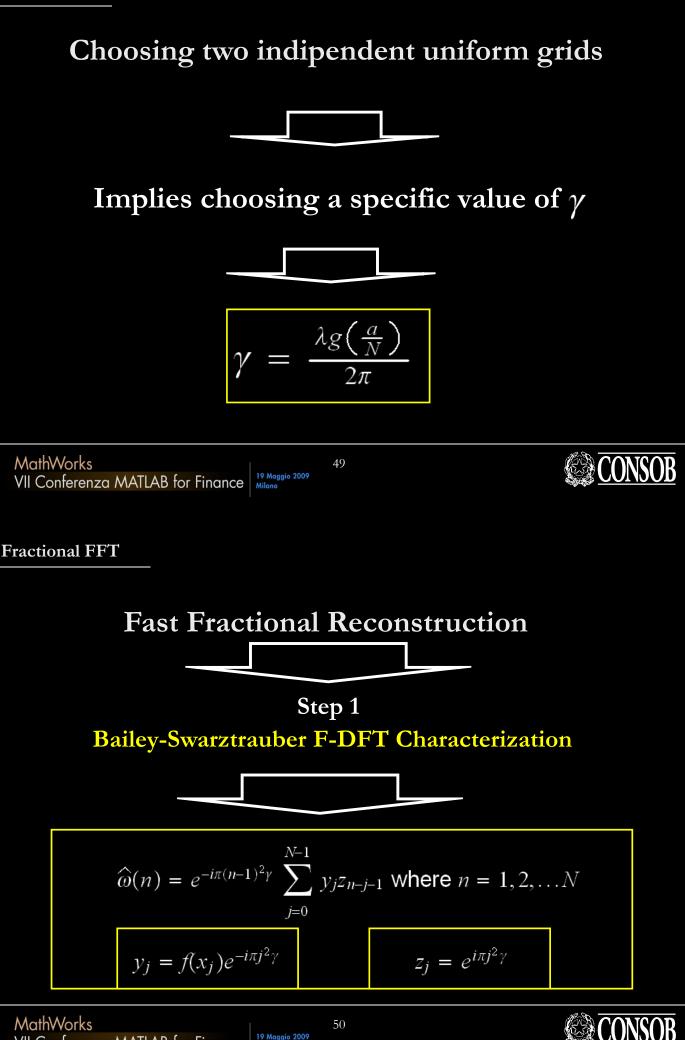
Choosing two indipendent uniform grids

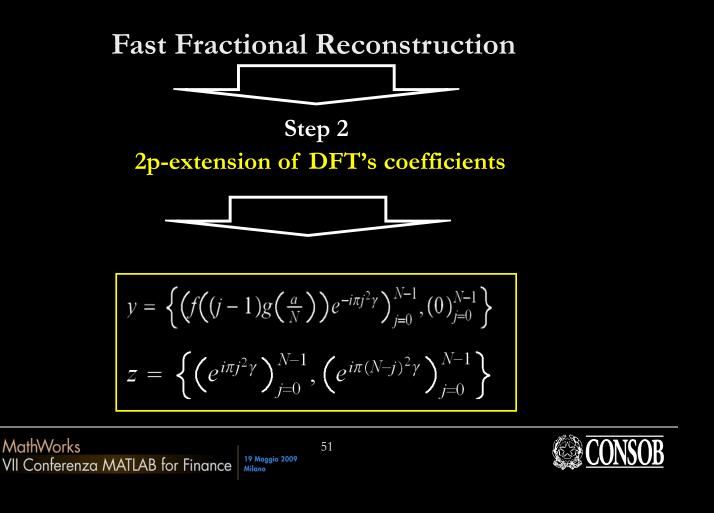


Implies choosing a specific value of γ

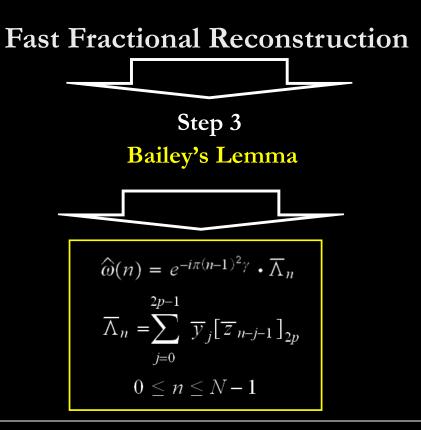






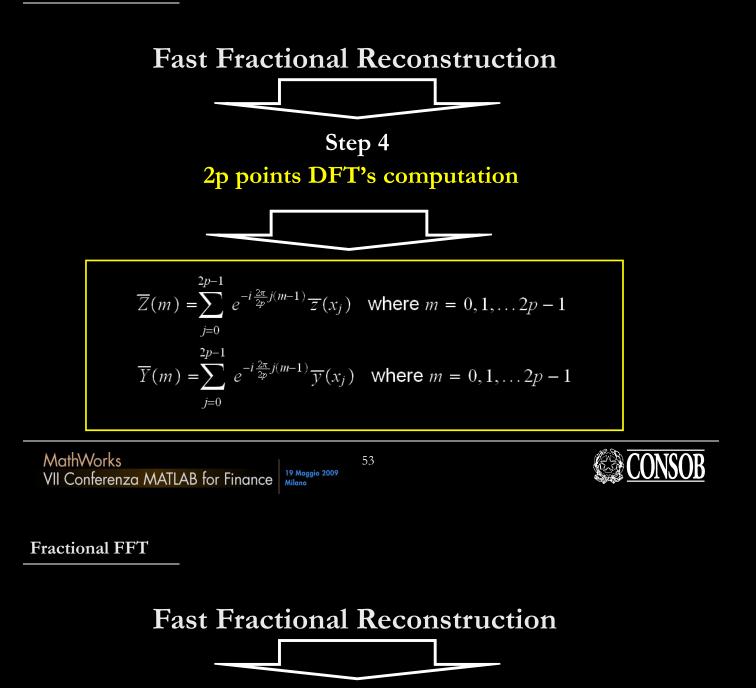


Fractional FFT



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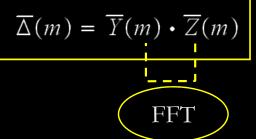




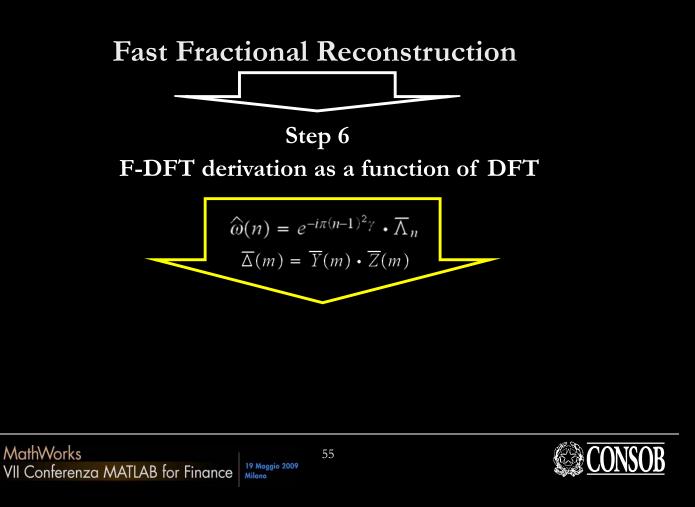


Circular Convolution Theorem

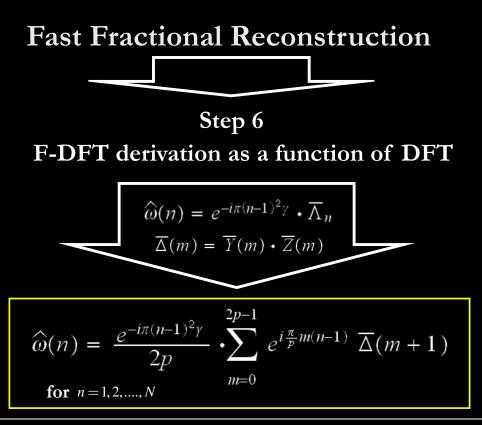








Fractional FFT

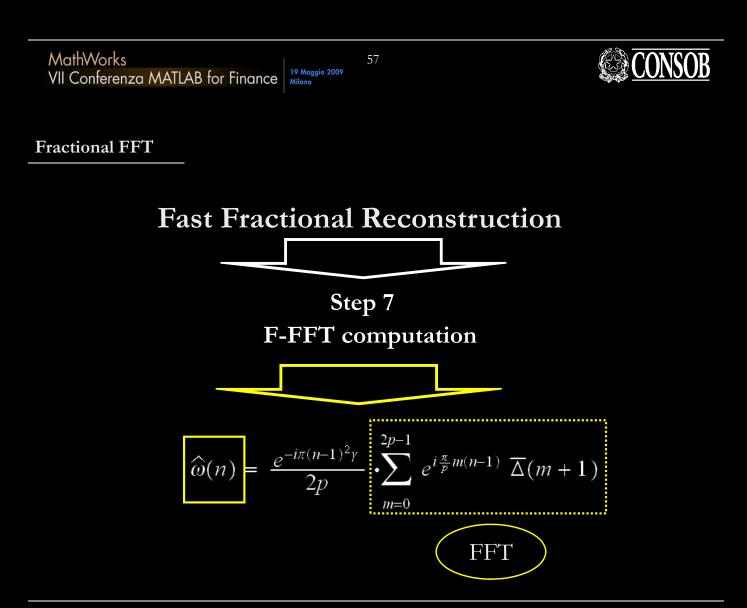


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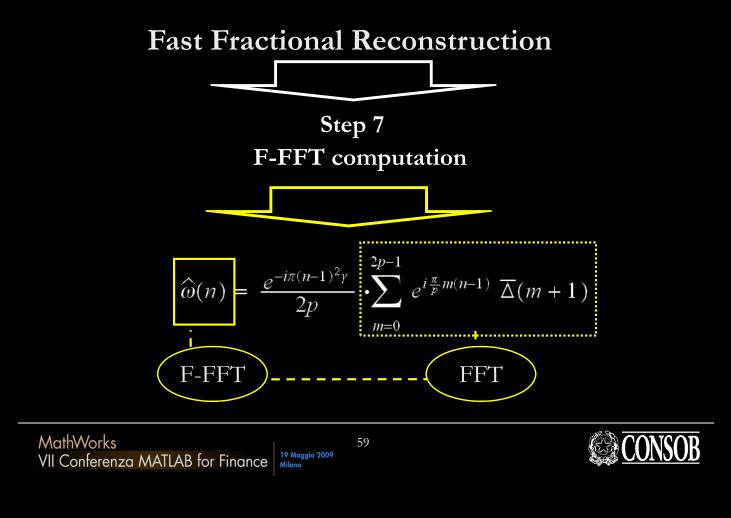


Fast Fractional Reconstruction

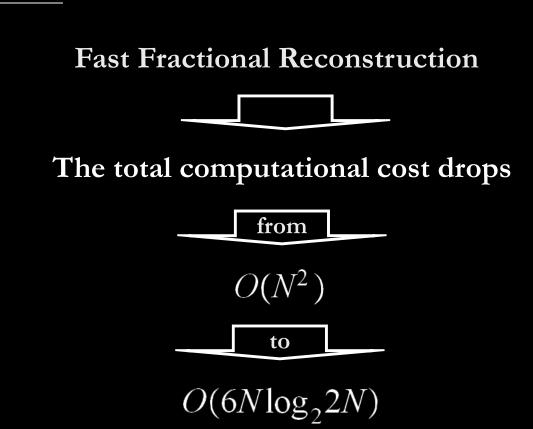
Step 7 F-FFT computation







Fractional FFT





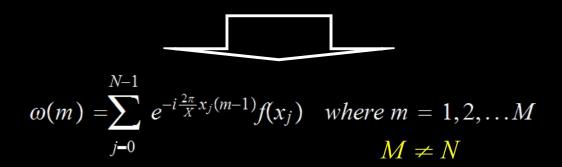
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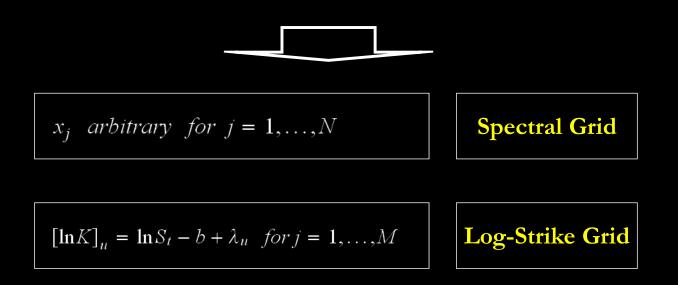
Non Uniform FFT

The Non Uniform DFT





Choosing two perfectly indipendent grids





Non Uniform FFT

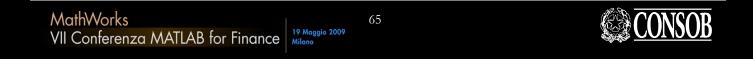
Choosing two perfectly indipendent grids



It's a natural property of the Non Uniform Approach



Gaussian Gridding Reconstruction



Non Uniform FFT

Gaussian Gridding Reconstruction

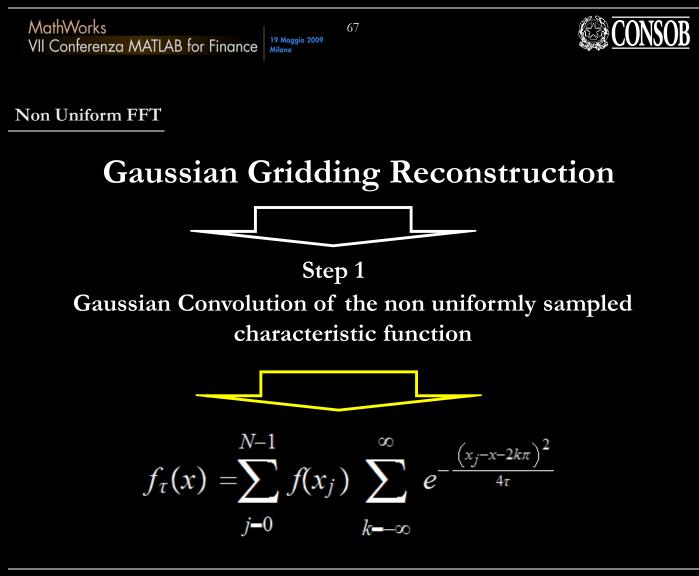
Step 1



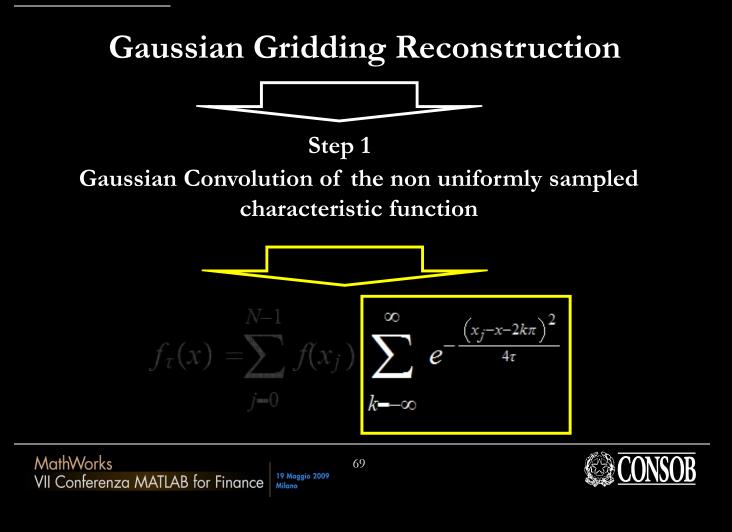


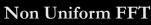
Step 1

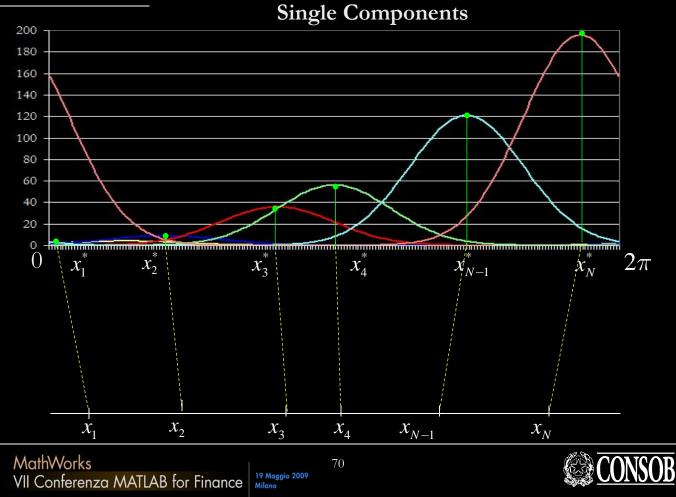
Gaussian Convolution of the non uniformly sampled characteristic function

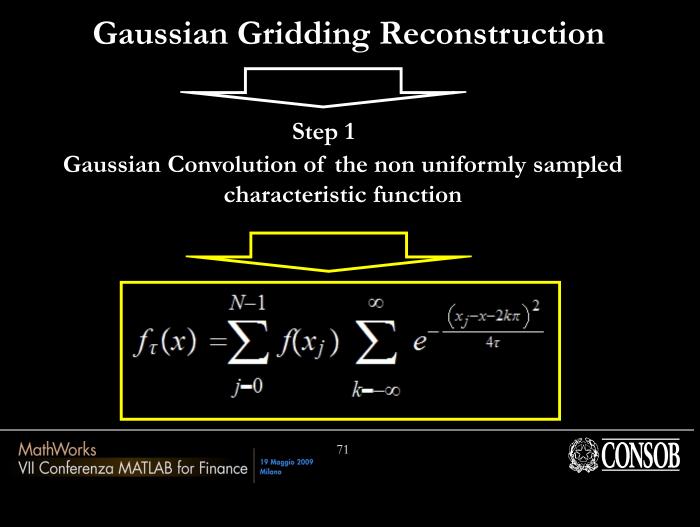




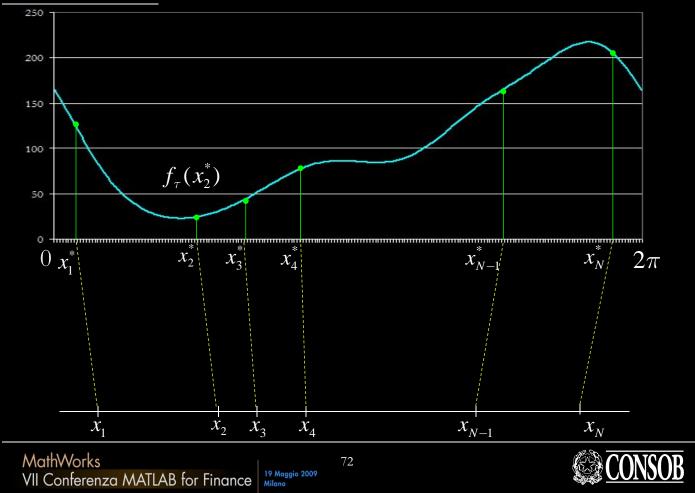


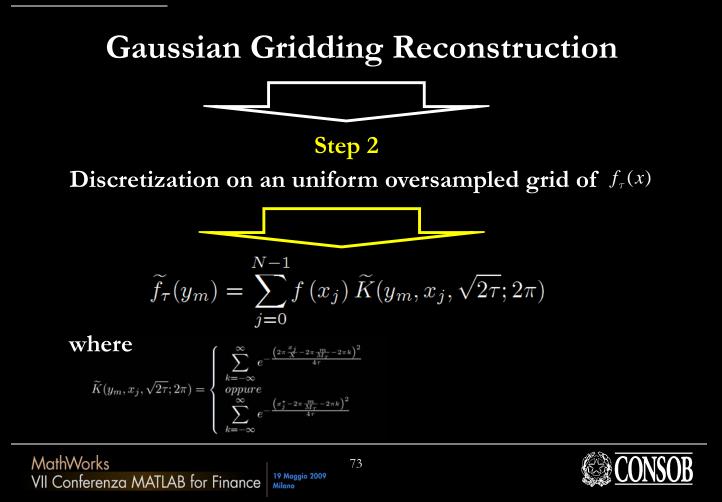


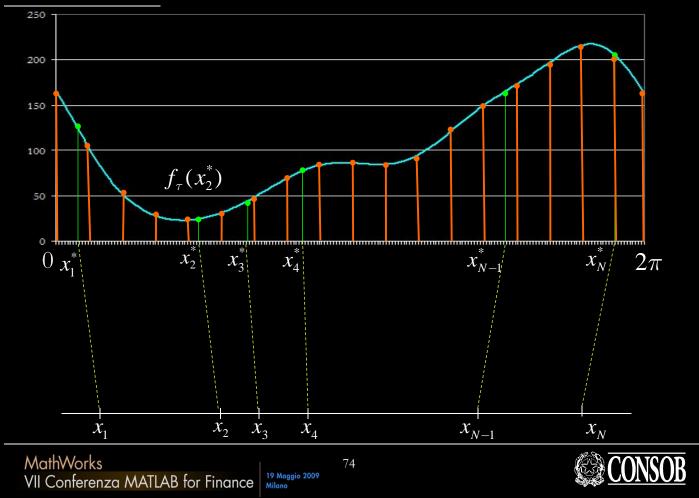




Non Uniform FFT







Gaussian Gridding Reconstruction



Step 3

Computation of the Fourier Coefficient of $f_{\tau}(x)$ discretised

$$F_{\tau}(n) = \lim_{M_{\tau} \to \infty} \frac{1}{M_{\tau}} \sum_{m=0}^{M_{\tau}-1} \widetilde{f}_{\tau} \left(m \frac{2\pi}{M_{\tau}} \right) e^{-im \frac{2\pi}{M_{\tau}}(n-1)}$$



Non Uniform FFT

Gaussian Gridding Reconstruction

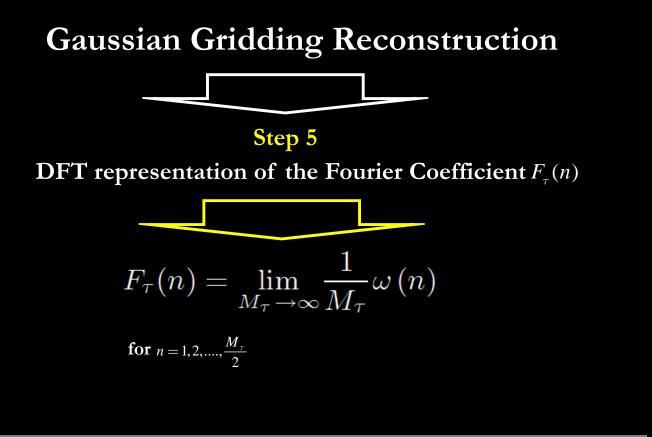


Step 4

NU-DFT representation of the Fourier Coefficient $F_{\tau}(n)$

$$\widetilde{\omega}\left(n\right) = \sqrt{\frac{\pi}{\tau}} e^{n^{2}\tau} F_{\tau}(n)$$



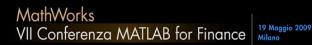




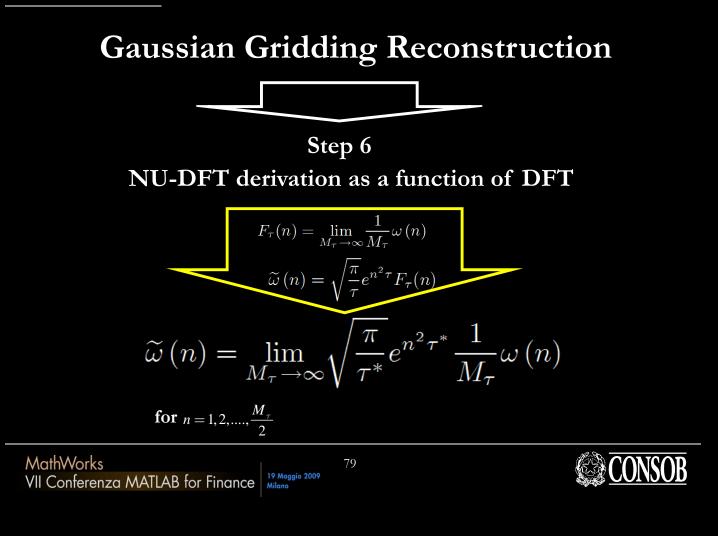
Gaussian Gridding Reconstruction



NU-DFT derivation as a function of DFT





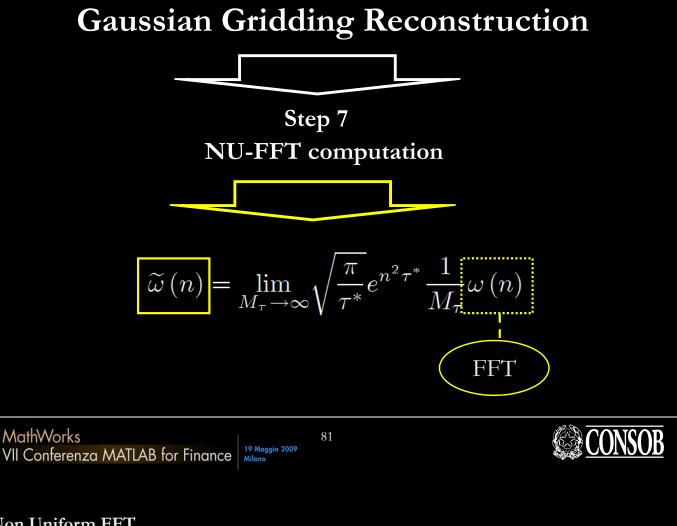


Gaussian Gridding Reconstruction

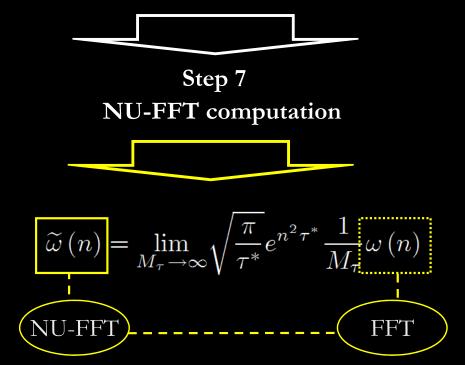


NU-FFT computation





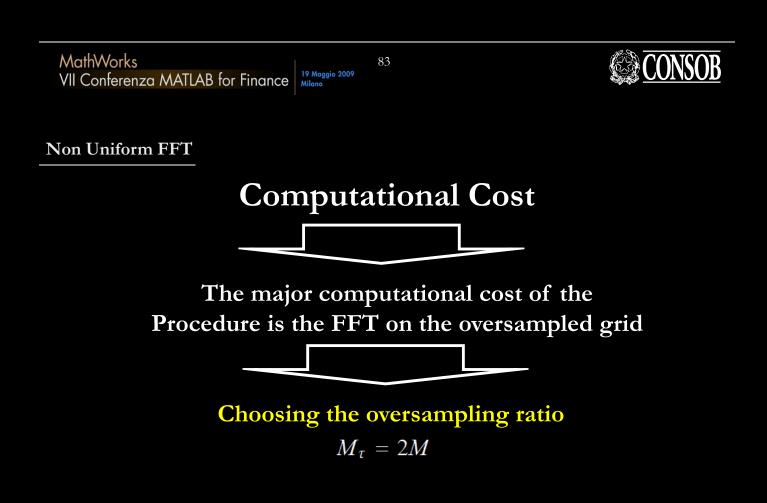
Gaussian Gridding Reconstruction





Computational Cost

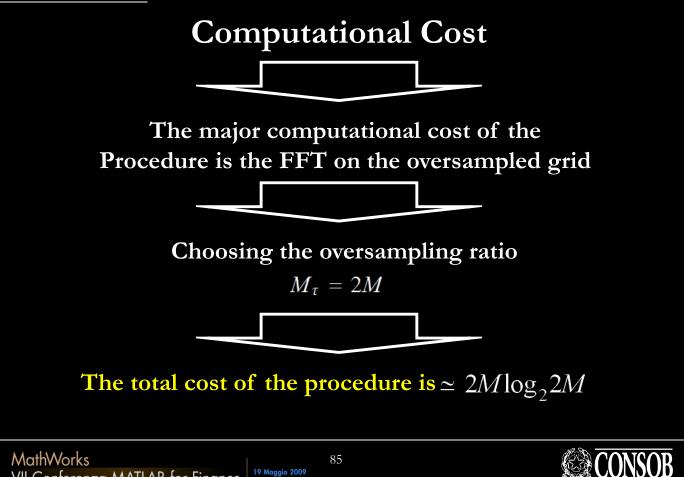
The major computational cost of the Procedure is the FFT on the oversampled grid













Syllabus of the presentation

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ACCURACY

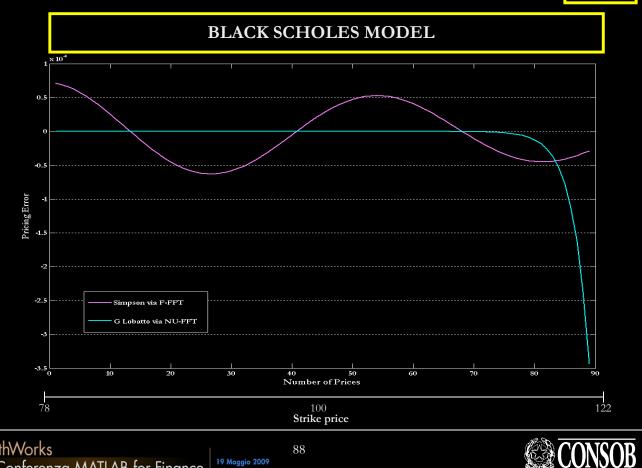


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Empirical Analysis

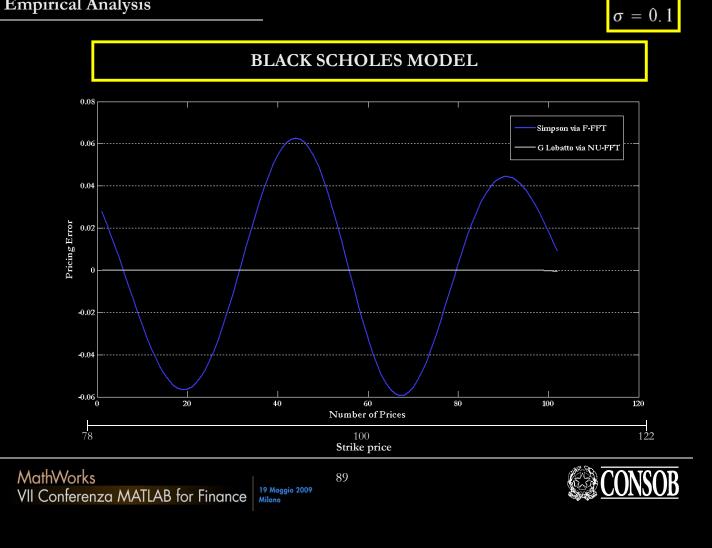
 $\sigma = 0.3$



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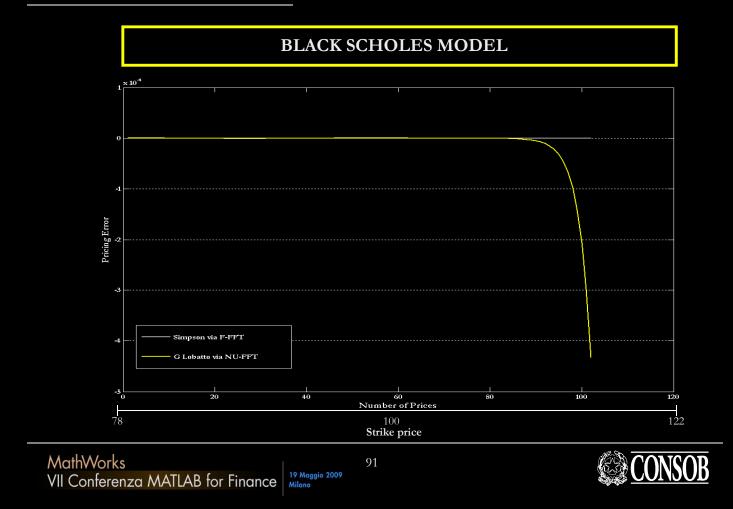
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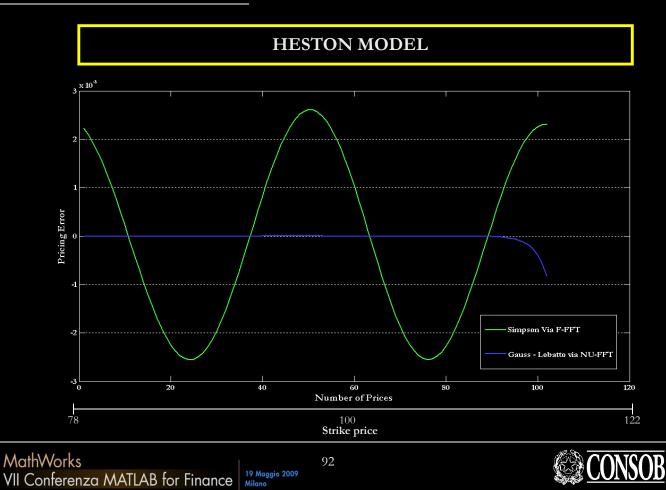
Milan

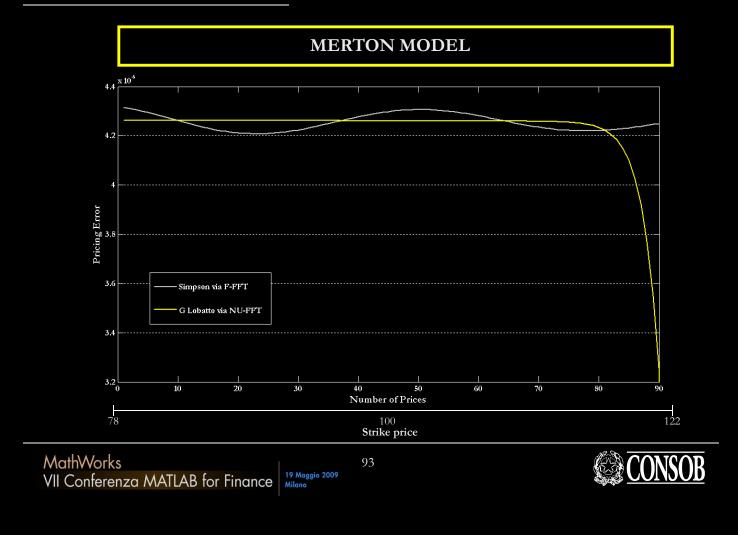


STABILITY



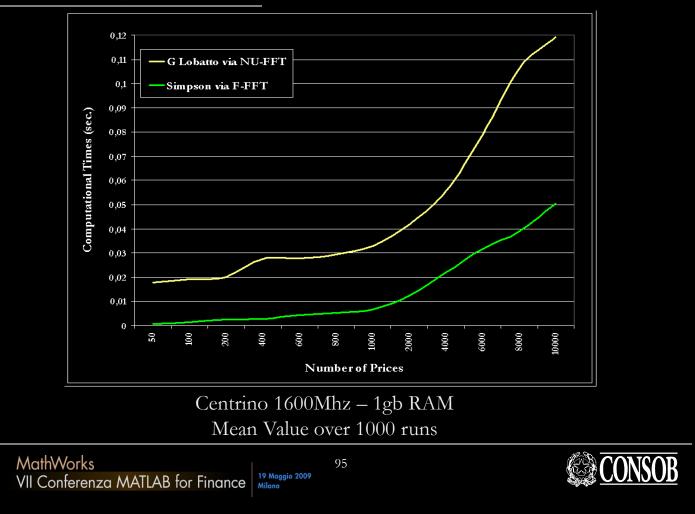




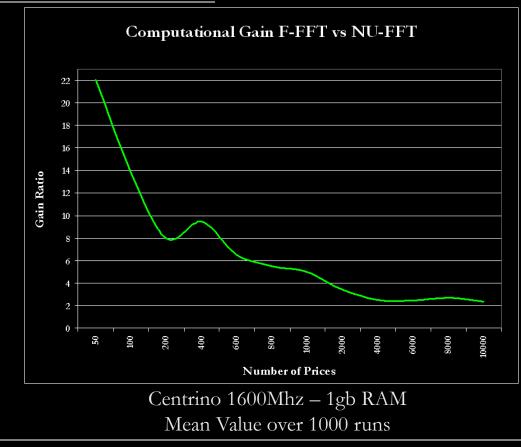


SPEED





The Computational Framework





At very low time scales, the differences are negligible



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Use of Gaussian Grids





Conclusions

Indifference to Nyquist-Shannon Limit

F-FFT	YES
NU – FFT	YES



Indipendent Price Grids

F-FFT	YES
NU – FFT	YES



Conclusions

FFT's like - Accuracy

F-FFT	YES
NU – FFT	YES





Stability of Pricing

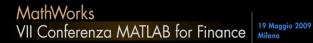




Conclusions

Speed of Pricing

F-FFT	YES
NU – FFT	YES





Conclusions

	F-FFT	NU – FFT
Gaussian Grids		
NS Limit		
Indipendent Grids		
Accuracy		
Stability		
Speed		

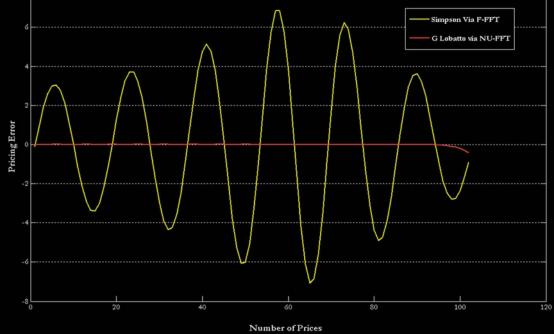
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Numerical Methods in Semianalytical Derivatives Pricing

Efficient Solutions for Standard, Fractional and Non Uniform Discrete Transforms



e Nilano

